# pyHPDM Documentation

Release 0.9.9

**Dominic Hunt** 

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python Human Probabilistic Decision-Modelling (pyHPDM) is a framework for modelling and fitting the responses of people to probabilistic decision making tasks.

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# CHAPTER 1

## Prerequisites

This code has been tested using Python 2.7. Apart from the standard Python libraries it also depends on the SciPy libraries and a few others listed in requirements.txt. For those installing Python for the first time I would recommend the Anaconda Python distribution.

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Installation

For now this is just Python code that you download and use, not a package.

## CHAPTER 3

Usage

The framework has until now either been run with a run script or live in a command-line (or jupyter notebook).

A task simulation can be simply created by running simulation.simulation(). Equally, for fitting participant data, the function is dataFitting. data\_fitting. For now, no example data has been provided.

More complex example running scripts can be found in ./runScripts/. Here, a number of scripts have been created as templates: runScript\_sim.py for simulating the probSelect task and runScript\_fit.py for fitting the data generated from runScript\_sim.py. A visual display of the interactions in one of these scripts will soon be created.

A new method of passing in the fitting or simulation configuration is to use a YAML configuration file. This is done, for both simulations and data fitting, using the function start.run\_script For example, to run the YAML configuration equivalent to the runScript\_sim.py from a command line would be :start.run\_script('./runScripts/runScripts\_sim.yaml').

8 Chapter 3. Usage

# CHAPTER 4

Testing

Testing is done using pytest.

10 Chapter 4. Testing

# CHAPTER 5

License

This project is licenced under the MIT license.

## CHAPTER 6

## Documentation

The documentation can be found on readthedocs or in  $./doc/\_build/html$ , with the top level file being index.html

To update the documentation you will need to install Sphinx and a set of extensions. The list of extensions can be found in ./doc/conf.py. To update the documentation follow the instruction in ./doc/readme.md Contents:

## 6.1 simulation module

## 6.1.1 simulation Module

Author Dominic Hunt

## 6.1.1.1 Functions

csv_model_simulation(modelData, simID,	Saves the fitting data to a CSV file
)	
log_simulation_parameters(task_parameters,	Writes to the log the description and the label of the
)	task and model
record_simulation(file_name_generator,)	Records the data from an task-model run.
run([task_name, task_changing_properties,])	A framework for letting models interact with tasks
	and record the data

## csv\_model\_simulation

simulation.csv\_model\_simulation (modelData, simID, file\_name\_generator)
Saves the fitting data to a CSV file

- modelData (dict) The data from the model
- simID(string) The identifier for the simulation

• **file\_name\_generator** (function) - Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

#### log simulation parameters

simulation.log\_simulation\_parameters (task\_parameters, model\_parameters, simID) Writes to the log the description and the label of the task and model

#### **Parameters**

- task\_parameters (dict) The task parameters
- model\_parameters (dict) The model parameters
- **simID** (*string*) The identifier for each simulation.

#### See also:

recordSimParams () Records these parameters for later use

#### record\_simulation

```
simulation.record_simulation(file_name_generator, task_data, model_data, simID, pickle=False)
```

Records the data from an task-model run. Creates a pickled version

#### **Parameters**

- **file\_name\_generator** (function) Creates a new file with the name < handle> and the extension < extension>. It takes two string parameters: (handle, extension) and returns one fileName string
- task\_data (dict) The data from the task
- $model_{data}(dict)$  The data from the model
- simID (basestring) The label identifying the simulation
- pickle (bool, optional) If true the data for each model, task and participant is recorded. Default is False

#### See also:

pickleLog() records the picked data

#### run

```
simulation. {\bf run} \ (task\_name=u'Basic', \\ task\_constant\_properties=None, \\ model\_changing\_properties=None, \\ model\_changing\_properties=None, \\ model\_changing\_properties\_repetition=1, \\ label=None, \\ numpy\_error\_level=u'log') \\ task\_changing\_properties=None, \\ model\_name=u'QLearn', \\ model\_constant\_properties=None, \\ model\_constant\_properties=None, \\ none, config\_file=None, output\_path=None, pickle=False, min\_log\_level=u'INFO', \\ numpy\_error\_level=u'log')
```

A framework for letting models interact with tasks and record the data

#### **Parameters**

• task\_name (string) - The name of the file where a tasks.taskTemplate.Task class can be found. Default Basic

- task\_changing\_properties (dictionary of floats or lists of floats) Parameters are the options that you are or are likely to change across task instances. When a parameter contains a list, an instance of the task will be created for every combination of this parameter with all the others. Default None
- task\_constant\_properties (dictionary of float, string or binary valued elements) These contain all the task options that describe the task being studied but do not vary across task instances. Default None
- model\_name (string) The name of the file where a model.modelTemplate.Model class can be found. Default QLearn
- model\_changing\_properties (dictionary containing floats or lists of floats, optional) Parameters are the options that you are or are likely to change across model instances. When a parameter contains a list, an instance of the model will be created for every combination of this parameter with all the others. Default None
- model\_constant\_properties (dictionary of float, string or binary valued elements, optional) These contain all the model options that define the version of the model being studied. Default None
- model\_changing\_properties\_repetition (int, optional) The number of times each parameter combination is repeated.
- **config\_file** (*string*, *optional*) The file name and path of a .yaml configuration file. Overrides all other parameters if found. Default None
- output\_path (string, optional) The path that will be used for the run output. Default None
- pickle (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- label (string, optional) The label for the simulation. Default None, which means nothing will be saved
- min\_log\_level (basestring, optional) Defines the level of the log from (DEBUG, INFO, WARNING, ERROR, CRITICAL). Default INFO
- numpy\_error\_level ({ 'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr

#### See also:

tasks.taskTemplate(), model.modelTemplate()

Author Dominic Hunt

simulation.csv\_model\_simulation (modelData, simID, file\_name\_generator)
Saves the fitting data to a CSV file

#### **Parameters**

- modelData (dict) The data from the model
- simID (string) The identifier for the simulation
- **file\_name\_generator** (function) Creates a new file with the name < handle> and the extension < extension>. It takes two string parameters: (handle, extension) and returns one fileName string

simulation.log\_simulation\_parameters (task\_parameters, model\_parameters, simID) Writes to the log the description and the label of the task and model

#### **Parameters**

- task\_parameters (dict) The task parameters
- model\_parameters (dict) The model parameters

6.1. simulation module

• **simID** (*string*) – The identifier for each simulation.

See also:

recordSimParams () Records these parameters for later use

Records the data from an task-model run. Creates a pickled version

#### **Parameters**

- **file\_name\_generator** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string
- task\_data (dict) The data from the task
- model\_data (dict) The data from the model
- simID (basestring) The label identifying the simulation
- pickle (bool, optional) If true the data for each model, task and participant is recorded. Default is False

See also:

pickleLog() records the picked data

```
simulation. \textbf{run} (task\_name=u'Basic', task\_changing\_properties=None, task\_constant\_properties=None, model\_changing\_properties=None, model\_changing\_properties=None, model\_changing\_properties\_repetition=1, label=None, config_file=None, output\_path=None, pickle=False, min_log_level=u'INFO', numpy\_error\_level=u'log')
```

A framework for letting models interact with tasks and record the data

- task\_name (string) The name of the file where a tasks.taskTemplate.Task class can be found. Default Basic
- task\_changing\_properties (dictionary of floats or lists of floats) Parameters are the options that you are or are likely to change across task instances. When a parameter contains a list, an instance of the task will be created for every combination of this parameter with all the others. Default None
- task\_constant\_properties (dictionary of float, string or binary valued elements) These contain all the the task options that describe the task being studied but do not vary across task instances. Default None
- model\_name (string) The name of the file where a model.modelTemplate.Model class can be found. Default QLearn
- model\_changing\_properties (dictionary containing floats or lists of floats, optional) Parameters are the options that you are or are likely to change across model instances. When a parameter contains a list, an instance of the model will be created for every combination of this parameter with all the others. Default None
- model\_constant\_properties (dictionary of float, string or binary valued elements, optional) These contain all the model options that define the version of the model being studied. Default None
- model\_changing\_properties\_repetition (int, optional) The number of times each parameter combination is repeated.

- **config\_file** (*string*, *optional*) The file name and path of a .yaml configuration file. Overrides all other parameters if found. Default None
- output\_path (string, optional) The path that will be used for the run output. Default None
- pickle (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- label (string, optional) The label for the simulation. Default None, which means nothing will be saved
- min\_log\_level (basestring, optional) Defines the level of the log from (DEBUG, INFO, WARNING, ERROR, CRITICAL). Default INFO
- numpy\_error\_level ({'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr

#### See also:

tasks.taskTemplate(), model.modelTemplate()

## 6.2 dataFitting module

## 6.2.1 dataFitting Module

**Author** Dominic Hunt

#### 6.2.1.1 Functions

<pre>fit_record(participant_fits, file_name_generator)</pre>	Returns the participant fits summary as a csv file
log_fitting_parameters(fit_info)	Records and outputs to the log the parameters associ-
	ated with the fitting algorithms
log_model_fitted_parameters()	Logs the model and task parameters that used as initial
	fitting conditions
log_model_fitting_parameters(model,	Logs the model and task parameters that used as initial
)	fitting conditions
record_fitting(fitting_data, label,[,])	Records formatted versions of the fitting data
record_participant_fit(participant,[,	Record the data relevant to the participant fitting
])	
run([data_folder, data_format,])	A framework for fitting models to data for tasks, along
	with recording the data associated with the fits.
xlsx_fitting_data(fitting_data, label,)	Saves the fitting data to an XLSX file

## fit record

dataFitting.fit\_record (participant\_fits, file\_name\_generator)

Returns the participant fits summary as a csv file

- participant\_fits (dict) A summary of the recovered parameters
- **file\_name\_generator** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

#### log fitting parameters

```
dataFitting.log_fitting_parameters(fit_info)
```

Records and outputs to the log the parameters associated with the fitting algorithms

**Parameters** fit\_info (dict) - The details of the fitting

#### log model fitted parameters

```
dataFitting.log_model_fitted_parameters (model_fit_variables, model_parameters, fit_quality, participant_name)
```

Logs the model and task parameters that used as initial fitting conditions

#### **Parameters**

- model\_fit\_variables (dict) The model parameters that have been fitted over and varied.
- model\_parameters (dict) The model parameters for the fitted model
- **fit\_quality** (float) The value of goodness of fit
- participant\_name (int or string) The identifier for each participant

### log\_model\_fitting\_parameters

```
dataFitting.log_model_fitting_parameters (model, model_fit_variables, model_other_args) model_other_args)
```

Logs the model and task parameters that used as initial fitting conditions

#### **Parameters**

- model (string) The name of the model
- model\_fit\_variables (dict) The model parameters that will be fitted over and varied.
- model\_other\_args (dict) The other parameters used in the model whose attributes have been modified by the user

### record\_fitting

```
dataFitting.record_fitting(fitting_data, label, participant, participant_model_variables, participant_fits, file_name_generator, save_fitting_progress=False)

Records formatted versions of the fitting data
```

- **fitting\_data** (dict, optional) Dictionary of details of the different fits, including an ordered dictionary containing the parameter values tested, in the order they were tested, and a list of the fit qualities of these parameters.
- label (basestring) The label used to identify the fit in the file names
- participant (dict) The participant data
- participant\_model\_variables (dict of string) A dictionary of model settings whose values should vary from participant to participant based on the values found in the imported participant data files. The key is the label given in the participant data file, as a string, and the value is the associated label in the model, also as a string.

- participant\_fits (defaultdict of lists) A dictionary to be filled with the summary of the participant fits
- **file\_name\_generator** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string
- save\_fitting\_progress (bool, optional) Specifies if the results from each iteration of the fitting process should be returned. Default False

**Returns participant\_fits** – A dictionary to be filled with the summary of the previous and current participant fits

Return type defaultdict of lists

#### record participant fit

dataFitting.record\_participant\_fit (participant, part\_name, model\_data, model\_name, fitting\_data, partModelVars, participantFits, file-NameGen=None, pickleData=False, saveFitting-Progress=False, expData=None)

Record the data relevant to the participant fitting

#### **Parameters**

- participant (dict) The participant data
- part\_name (int or string) The identifier for each participant
- model data (dict) The data from the model
- model\_name (basestring) The label given to the model
- **fitting\_data** (dict) Dictionary of details of the different fits, including an ordered dictionary containing the parameter values tested, in the order they were tested, and a list of the fit qualities of these parameters
- partModelVars (dict of string) A dictionary of model settings whose values should vary from participant to participant based on the values found in the imported participant data files. The key is the label given in the participant data file, as a string, and the value is the associated label in the model, also as a string.
- participantFits (defaultdict of lists) A dictionary to be filled with the summary of the participant fits
- **fileNameGen** (function or None) Creates a new file with the name < handle> and the extension < extension >. It takes two string parameters: (handle, extension) and returns one fileName string. Default None
- pickleData (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- saveFittingProgress (bool, optional) Specifies if the results from each iteration of the fitting process should be returned. Default False
- expData (dict, optional) The data from the task. Default None

**Returns participantFits** – A dictionary to be filled with the summary of the previous and current participant fits

Return type defaultdict of lists

#### See also:

outputting.pickleLog() records the picked data

#### run

data format=u'csv', dataFitting.run(data\_folder=u'./', data file filter=None, data\_file\_terminal\_ID=True, data\_read\_options=None, data\_split\_by=None, data\_group\_by=None, data\_extra\_processing=None, model\_name=u'QLearn', model\_changing\_properties=None, model\_constant\_properties=None, participantID=u'Name', participant\_choices=u'Actions', participant\_rewards=u'Rewards', fit\_subset=None, *model\_fit\_value=u'ActionProb'*, task\_stimuli=None, participant\_action\_options=None, fit\_method=u'Evolutionary', fit\_method\_args=None, fit\_measure=u'-loge', fit\_measure\_args=None, fit extra measures=None, participant\_varying\_model\_parameters=None, label=None, save\_fitting\_progress=False, config\_file=None, output\_path=None, pickle=False, boundary excess cost function=None, min log level=u'INFO', numpy error level=u'log', fit float error response value=1e-100, *late covariance=False*)

A framework for fitting models to data for tasks, along with recording the data associated with the fits.

- data\_folder (string or list of strings, optional) The folder where the data can be found. Default is the current folder.
- data\_format (string, optional) The file type of the data, from mat, csv, xlsx and pkl. Default is csv
- data\_file\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- data\_file\_terminal\_ID (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- data\_read\_options (dict, optional) The keyword arguments for the data importing method chosen
- data\_split\_by (string or list of strings, optional)—If multiple participant datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- data\_group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- data\_extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- model\_name (string, optional) The name of the file where a model.modelTemplate.Model class can be found. Default QLearn
- model\_changing\_properties (dictionary with values of tuple of two floats, optional) Parameters are the options that you allow to vary across model fits. Each model parameter is specified as a dict key. The value is a tuple containing the upper and lower search bounds, e.g. alpha has the bounds (0, 1). Default None
- model\_constant\_properties (dictionary of float, string or binary valued elements, optional) These contain all the model options that define the version of the model being studied. Default None
- participantID (basestring, optional) The key (label) used to identify each participant. Default Name

- participant\_choices (string, optional) The participant data key of their action choices. Default 'Actions'
- participant\_rewards (string, optional) The participant data key of the participant reward data. Default 'Rewards'
- model\_fit\_value (string, optional) The key to be compared in the model data. Default 'ActionProb'
- fit\_subset (float ('Nan'), None, "rewarded", "unrewarded", "all" or list of int, optional) Describes which, if any, subset of trials will be used to evaluate the performance of the model. This can either be described as a list of trial numbers or, by passing "all" for fitting all trials float ('Nan') or "unrewarded" for all those trials whose feedback was float ('Nan') "rewarded" for those who had feedback that was not float ('Nan') Default None, which means all trials will be used.
- task\_stimuli (list of strings or None, optional) The keys containing the observational parameters seen by the participant before taking a decision on an action. Default None
- participant\_action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- **fit\_method** (*string*, *optional*) The fitting method to be used. The names accepted are those of the modules in the folder fitAlgs containing a FitAlg class. Default 'evolutionary'
- **fit\_method\_args** (*dict*, *optional*) A dictionary of arguments specific to the fitting method. Default None
- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default –loge
- fit\_measure\_args (dict, optional) The parameters used to initialise fit-Measure and extraFitMeasures. Default None
- **fit\_extra\_measures** (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fitMeasureArgs. Default None
- participant\_varying\_model\_parameters (dict of string, optional) A dictionary of model settings whose values should vary from participant to participant based on the values found in the imported participant data files. The key is the label given in the participant data file, as a string, and the value is the associated label in the model, also as a string. Default {}
- label (string, optional) The label for the data fitting. Default None will mean no data is saved to files.
- save\_fitting\_progress (bool, optional) Specifies if the results from each iteration of the fitting process should be returned. Default False
- **config\_file** (*string*, *optional*) The file name and path of a .yaml configuration file. Overrides all other parameters if found. Default None
- output\_path (string, optional) The path that will be used for the run output. Default None
- pickle (bool, optional) If true the data for each model, and participant is recorded. Default is False

- boundary\_excess\_cost\_function (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- min\_log\_level (basestring, optional) Defines the level of the log from (DEBUG, INFO, WARNING, ERROR, CRITICAL). Default INFO
- numpy\_error\_level ({ 'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr
- **fit\_float\_error\_response\_value** (*float*, *optional*) If a floating point error occurs when running a fit the fitter function will return a value for each element of fpRespVal. Default is "1/1e100"
- calculate\_covariance (bool, optional) Is the covariance calculated.

  Default False

#### See also:

```
modelGenerator() The model factory
outputting() The outputting functions
fitAlgs.fitAlg.FitAlg() General class for a method of fitting data
fitAlgs.fitSims.fitSim() General class for a method of simulating the fitting of data
data.Data() Data import class
```

#### xlsx\_fitting\_data

dataFitting.xlsx\_fitting\_data (fitting\_data, label, participant, file\_name\_generator)
Saves the fitting data to an XLSX file

#### **Parameters**

- **fitting\_data** (dict, optional) Dictionary of details of the different fits, including an ordered dictionary containing the parameter values tested, in the order they were tested, and a list of the fit qualities of these parameters.
- label (basestring) The label used to identify the fit in the file names
- participant (dict) The participant data
- **file\_name\_generator** (function) Creates a new file with the name < handle> and the extension < extension>. It takes two string parameters: (handle, extension) and returns one fileName string

## 6.2.1.2 Classes

FitAlg([fit_sim, fit_measure,])	The abstract class for fitting data
FitSim([participant_choice_property,])	A class for fitting data by passing the participant data
	through the model.
LengthError	
ModelGen(model_name[, parame	ters, Generates model class instances based on a model and
other_options])	a set of varying parameters
OrderError	

#### LengthError

exception dataFitting.LengthError

#### OrderError

exception dataFitting.OrderError

#### 6.2.1.3 Class Inheritance Diagram

**Author** Dominic Hunt

exception dataFitting.LengthError

Bases: exceptions. Exception

 $\textbf{exception} \ \texttt{dataFitting.OrderError}$ 

Bases: exceptions. Exception

dataFitting.fit\_record (participant\_fits, file\_name\_generator)

Returns the participant fits summary as a csv file

#### **Parameters**

- participant\_fits (dict) A summary of the recovered parameters
- **file\_name\_generator** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

dataFitting.log\_fitting\_parameters(fit\_info)

Records and outputs to the log the parameters associated with the fitting algorithms

**Parameters fit\_info** (dict) – The details of the fitting

dataFitting.log\_model\_fitted\_parameters (model\_fit\_variables, model\_parameters,

fit\_quality, participant\_name)

Logs the model and task parameters that used as initial fitting conditions

## Parameters

- model\_fit\_variables (dict) The model parameters that have been fitted over and varied.
- model\_parameters (dict) The model parameters for the fitted model
- fit\_quality (float) The value of goodness of fit
- participant\_name (int or string) The identifier for each participant

dataFitting.log\_model\_fitting\_parameters (model,

model\_fit\_variables,

model\_other\_args)
Logs the model and task parameters that used as initial fitting conditions

## Parameters

- model (string) The name of the model
- model\_fit\_variables (dict) The model parameters that will be fitted over and varied
- model\_other\_args (dict) The other parameters used in the model whose attributes have been modified by the user

dataFitting.record\_fitting(fitting\_data, label, participant, participant\_model\_variables, participant\_fits, file\_name\_generator, save\_fitting\_progress=False)

Records formatted versions of the fitting data

- **fitting\_data** (*dict*, *optional*) Dictionary of details of the different fits, including an ordered dictionary containing the parameter values tested, in the order they were tested, and a list of the fit qualities of these parameters.
- label (basestring) The label used to identify the fit in the file names
- participant (dict) The participant data
- participant\_model\_variables (dict of string) A dictionary of model settings whose values should vary from participant to participant based on the values found in the imported participant data files. The key is the label given in the participant data file, as a string, and the value is the associated label in the model, also as a string.
- participant\_fits (defaultdict of lists) A dictionary to be filled with the summary of the participant fits
- **file\_name\_generator** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string
- save\_fitting\_progress (bool, optional) Specifies if the results from each iteration of the fitting process should be returned. Default False

**Returns participant\_fits** – A dictionary to be filled with the summary of the previous and current participant fits

Return type defaultdict of lists

dataFitting.record\_participant\_fit (participant, part\_name, model\_data, model\_name, fitting\_data, partModelVars, participantFits, file-NameGen=None, pickleData=False, saveFitting-Progress=False, expData=None)

Record the data relevant to the participant fitting

- participant (dict) The participant data
- part\_name (int or string) The identifier for each participant
- model data (dict) The data from the model
- model\_name (basestring) The label given to the model
- **fitting\_data** (dict) Dictionary of details of the different fits, including an ordered dictionary containing the parameter values tested, in the order they were tested, and a list of the fit qualities of these parameters
- partModelVars (dict of string) A dictionary of model settings whose values should vary from participant to participant based on the values found in the imported participant data files. The key is the label given in the participant data file, as a string, and the value is the associated label in the model, also as a string.
- participantFits (defaultdict of lists) A dictionary to be filled with the summary of the participant fits
- **fileNameGen** (function or None) Creates a new file with the name < handle> and the extension < extension>. It takes two string parameters: (handle, extension) and returns one fileName string. Default None
- pickleData (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- saveFittingProgress (bool, optional) Specifies if the results from each iteration of the fitting process should be returned. Default False
- expData (dict, optional) The data from the task. Default None

**Returns participantFits** – A dictionary to be filled with the summary of the previous and current participant fits

Return type defaultdict of lists

#### See also:

outputting.pickleLog() records the picked data

dataFitting.run(data folder=u'./', data format=u'csv', data file filter=None, data\_file\_terminal\_ID=True, data\_read\_options=None, data\_split\_by=None, data\_group\_by=None, data\_extra\_processing=None, model\_name=u'QLearn', model\_changing\_properties=None, model\_constant\_properties=None, participantID=u'Name', participant\_choices=u'Actions', participant\_rewards=u'Rewards', fit\_subset=None, model\_fit\_value=u'ActionProb', task\_stimuli=None, participant\_action\_options=None, fit\_method=u'Evolutionary', fit\_method\_args=None, fit\_measure=u'-loge', fit\_measure\_args=None, fit\_extra\_measures=None, participant\_varying\_model\_parameters=None, label=None, save\_fitting\_progress=False, config\_file=None, output\_path=None, pickle=False, boundary\_excess\_cost\_function=None, min\_log\_level=u'INFO', numpy\_error\_level=u'log', fit\_float\_error\_response\_value=1e-100, late covariance=False)

A framework for fitting models to data for tasks, along with recording the data associated with the fits.

- data\_folder (string or list of strings, optional) The folder where the data can be found. Default is the current folder.
- data\_format (string, optional) The file type of the data, from mat, csv, xlsx and pkl. Default is csv
- data\_file\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- data\_file\_terminal\_ID (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- data\_read\_options (dict, optional) The keyword arguments for the data importing method chosen
- data\_split\_by(string or list of strings, optional)—If multiple participant datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- data\_group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- data\_extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- model\_name (string, optional) The name of the file where a model.modelTemplate.Model class can be found. Default QLearn
- model\_changing\_properties (dictionary with values of tuple of two floats, optional) Parameters are the options that you allow to vary across model fits. Each model parameter is specified as a dict key. The value is a tuple containing the upper and lower search bounds, e.g. alpha has the bounds (0, 1). Default None

- model\_constant\_properties (dictionary of float, string or binary valued elements, optional) These contain all the model options that define the version of the model being studied. Default None
- participantID (basestring, optional) The key (label) used to identify each participant. Default Name
- participant\_choices (string, optional) The participant data key of their action choices. Default 'Actions'
- participant\_rewards (string, optional) The participant data key of the participant reward data. Default 'Rewards'
- model\_fit\_value (string, optional) The key to be compared in the model data. Default 'ActionProb'
- fit\_subset (float ('Nan'), None, "rewarded", "unrewarded", "all" or list of int, optional) Describes which, if any, subset of trials will be used to evaluate the performance of the model. This can either be described as a list of trial numbers or, by passing "all" for fitting all trials float ('Nan') or "unrewarded" for all those trials whose feedback was float ('Nan') "rewarded" for those who had feedback that was not float ('Nan') Default None, which means all trials will be used.
- task\_stimuli (list of strings or None, optional) The keys containing the observational parameters seen by the participant before taking a decision on an action. Default None
- participant\_action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- **fit\_method** (*string*, *optional*) The fitting method to be used. The names accepted are those of the modules in the folder fitAlgs containing a FitAlg class. Default 'evolutionary'
- fit\_method\_args (dict, optional) A dictionary of arguments specific to the fitting method. Default None
- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default –loge
- fit\_measure\_args (dict, optional) The parameters used to initialise fit-Measure and extraFitMeasures. Default None
- **fit\_extra\_measures** (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fitMeasureArgs. Default None
- participant\_varying\_model\_parameters (dict of string, optional) A dictionary of model settings whose values should vary from participant to participant based on the values found in the imported participant data files. The key is the label given in the participant data file, as a string, and the value is the associated label in the model, also as a string. Default {}
- label (string, optional) The label for the data fitting. Default None will mean no data is saved to files.
- save\_fitting\_progress (bool, optional) Specifies if the results from each iteration of the fitting process should be returned. Default False
- **config\_file** (*string*, *optional*) The file name and path of a .yaml configuration file. Overrides all other parameters if found. Default None

- output\_path (string, optional) The path that will be used for the run output. Default None
- pickle (bool, optional) If true the data for each model, and participant is recorded. Default is False
- boundary\_excess\_cost\_function (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- min\_log\_level (basestring, optional) Defines the level of the log from (DEBUG, INFO, WARNING, ERROR, CRITICAL). Default INFO
- numpy\_error\_level ({ 'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr
- **fit\_float\_error\_response\_value** (*float*, *optional*) If a floating point error occurs when running a fit the fitter function will return a value for each element of fpRespVal. Default is "1/1e100"
- calculate\_covariance (bool, optional) Is the covariance calculated.

  Default False

#### See also:

```
modelGenerator() The model factory
outputting() The outputting functions
fitAlgs.fitAlg.FitAlg() General class for a method of fitting data
fitAlgs.fitSims.fitSim() General class for a method of simulating the fitting of data
data.Data() Data import class
```

dataFitting.xlsx\_fitting\_data (fitting\_data, label, participant, file\_name\_generator)
Saves the fitting data to an XLSX file

#### **Parameters**

- **fitting\_data** (dict, optional) Dictionary of details of the different fits, including an ordered dictionary containing the parameter values tested, in the order they were tested, and a list of the fit qualities of these parameters.
- label (basestring) The label used to identify the fit in the file names
- participant (dict) The participant data
- **file\_name\_generator** (function) Creates a new file with the name < handle> and the extension < extension>. It takes two string parameters: (handle, extension) and returns one fileName string

## 6.3 data module

## 6.3.1 data Module

This module allows for the importing of participant data for use in fitting

Author Dominic Hunt

#### 6.3.1.1 Functions

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sort\_by\_last\_number(dataFiles)

#### sort\_by\_last\_number

data.sort\_by\_last\_number (dataFiles)

#### 6.3.1.2 Classes

Data(participants[, participantID, choices,])
DimentionError
FileError
FileFilterError
FileTypeError
FoldersError
IDError
LengthError
ProcessingError

#### Data

Bases: list

#### **Methods Summary**

extend(iterable)	Combines two Data instances into one
<pre>from_csv([folder, file_name_filter,])</pre>	Import data from a folder full of .csv files, where
	each file contains the information of one partici-
	pant
<pre>from_mat([folder, file_name_filter,])</pre>	Import data from a folder full of .mat files, where
	each file contains the information of one partici-
	pant
<pre>from_pk1([folder, file_name_filter,])</pre>	Import data from a folder full of .pkl files, where
	each file contains the information of one partici-
	pant.
<pre>from_xlsx([folder, file_name_filter,])</pre>	Import data from a folder full of .xlsx files, where
	each file contains the information of one partici-
	pant
load_data([file_type, folders,])	Import data from a folder.
<pre>load_data([file_type, folders,])</pre>	1

## **Methods Documentation**

extend(iterable)

Combines two Data instances into one

Parameters iterable (Data instance or list of participant dicts)

classmethod from\_csv (folder=u'./', file\_name\_filter=None, terminal\_ID=True, split\_by=None, participantID=None, choices=u'actions', feed-backs=u'feedbacks', stimuli=None, action\_options=None, group\_by=None, extra\_processing=None, csv\_read\_options=None)
Import data from a folder full of .csv files, where each file contains the information of one participant

#### **Parameters**

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- **split\_by** (*string or list of strings*, *optional*) If multiple participants datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (string or list of strings, optional) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- csv\_read\_options (dict, optional) The keyword arguments for pandas.read csv. Default { }

#### **Returns Data**

**Return type** Data class instance

#### See also:

```
pandas.read_csv()
```

```
classmethod from_mat (folder=u'./', file_name_filter=None, terminal_ID=True, par-
ticipantID=None, choices=u'actions', feedbacks=u'feedbacks',
stimuli=None, action_options=None, group_by=None, ex-
tra_processing=None)
```

Import data from a folder full of .mat files, where each file contains the information of one participant

#### Parameters

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- **file\_name\_filter** (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed

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- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- participant ID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (string or list of strings, optional) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- **group\_by** (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None

#### **Returns Data**

**Return type** Data class instance

#### See also:

```
scipy.io.loadmat()
```

classmethod from\_pkl (folder=u'./', file\_name\_filter=None, terminal\_ID=True, participantID=None, choices=u'actions', feedbacks=u'feedbacks', stimuli=None, action\_options=None, group\_by=None, extra\_processing=None)

Import data from a folder full of .pkl files, where each file contains the information of one participant. This will principally be used to import data stored by task simulations

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (*string or list of strings*, *optional*) The dict keys where the stimulus cues for each trial can be found. Default 'None'

- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None

#### **Returns Data**

Return type Data class instance

```
classmethod from_xlsx (folder=u'./', file_name_filter=None, terminal_ID=True, split_by=None, participantID=None, choices=u'actions', feedbacks=u'feedbacks', stimuli=None, action_options=None, group_by=None, extra_processing=None, xlsx read options=None)
```

Import data from a folder full of .xlsx files, where each file contains the information of one participant

#### **Parameters**

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- **split\_by** (*string* or *list* of *strings*, *optional*) If multiple participants datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (*string or list of strings*, *optional*) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- **group\_by** (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None

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- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- xlsx\_read\_options (dict, optional) The keyword arguments for pandas.read\_excel

#### **Returns Data**

Return type Data class instance

#### See also:

```
pandas.read excel()
```

classmethod load\_data (file\_type=u'csv', folders=u'./', file\_name\_filter=None, terminal\_ID=True, split\_by=None, participantID=None, choices=u'actions', feedbacks=u'feedbacks', stimuli=None, action\_options=None, group\_by=None, extra\_processing=None, data\_read\_options=None)

Import data from a folder. This is a wrapper function for the other import methods

#### **Parameters**

- **file\_type** (*string*, *optional*) The file type of the data, from mat, csv, xlsx and pkl. Default is csv
- **folders** (string or list of strings, optional) The folder or folders where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- **split\_by** (*string or list of strings*, *optional*) If multiple participant datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (string or list of strings, optional) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- **group\_by** (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None

• data\_read\_options (dict, optional) - The keyword arguments for the data importing method chosen

### **Returns Data**

Return type Data class instance

### **DimentionError**

```
exception data.DimentionError
```

### **FileError**

```
exception data.FileError
```

### **FileFilterError**

```
exception data.FileFilterError
```

# **FileTypeError**

```
exception data.FileTypeError
```

### **FoldersError**

```
exception data.FoldersError
```

# **IDError**

```
exception data.IDError
```

# LengthError

```
exception data.LengthError
```

# **ProcessingError**

```
exception data.ProcessingError
```

# 6.3.1.3 Class Inheritance Diagram

This module allows for the importing of participant data for use in fitting

```
Author Dominic Hunt
```

```
\verb|class| data.Data| (participants, participantID=u'ID', choices=u'actions', feedbacks=u'feedbacks', stimuli=None, action\_options=None, process\_data\_function=None)
```

Bases: list

extend(iterable)

Combines two Data instances into one

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Parameters iterable (Data instance or list of participant dicts)

classmethod from\_csv (folder=u'./', file\_name\_filter=None, terminal\_ID=True, split\_by=None, participantID=None, choices=u'actions', feed-backs=u'feedbacks', stimuli=None, action\_options=None, group\_by=None, extra\_processing=None, csv\_read\_options=None)
Import data from a folder full of .csv files, where each file contains the information of one participant

#### **Parameters**

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- **split\_by** (*string* or *list* of *strings*, *optional*) If multiple participants datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (string or list of strings, optional) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- csv\_read\_options (dict, optional) The keyword arguments for pandas.read\_csv. Default { }

# **Returns Data**

Return type Data class instance

#### See also:

```
pandas.read_csv()
```

```
classmethod from_mat (folder=u'./', file_name_filter=None, terminal_ID=True, par-
ticipantID=None, choices=u'actions', feedbacks=u'feedbacks',
stimuli=None, action_options=None, group_by=None, ex-
tra processing=None)
```

Import data from a folder full of .mat files, where each file contains the information of one participant

#### **Parameters**

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (*string or list of strings*, *optional*) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None

# **Returns Data**

Return type Data class instance

### See also:

```
scipy.io.loadmat()
```

classmethod from\_pkl (folder=u'./', file\_name\_filter=None, terminal\_ID=True, participantID=None, choices=u'actions', feedbacks=u'feedbacks', stimuli=None, action\_options=None, group\_by=None, extra\_processing=None)

Import data from a folder full of .pkl files, where each file contains the information of one participant. This will principally be used to import data stored by task simulations

### **Parameters**

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- terminal\_ID (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.

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- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (*string or list of strings*, *optional*) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'
- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None

#### **Returns Data**

Return type Data class instance

Import data from a folder full of .xlsx files, where each file contains the information of one participant

#### **Parameters**

- **folder** (*string*, *optional*) The folder where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- **split\_by** (*string* or *list* of *strings*, *optional*) If multiple participants datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (string or list of strings, optional) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If

None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'

- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- xlsx\_read\_options (dict, optional) The keyword arguments for pandas.read excel

#### **Returns Data**

Return type Data class instance

#### See also:

```
pandas.read_excel()
```

```
classmethod load_data (file_type=u'csv', folders=u'./', file_name_filter=None, ter-
minal_ID=True, split_by=None, participantID=None,
choices=u'actions', feedbacks=u'feedbacks', stimuli=None,
action_options=None, group_by=None, extra_processing=None,
data read options=None)
```

Import data from a folder. This is a wrapper function for the other import methods

#### **Parameters**

- **file\_type** (*string*, *optional*) The file type of the data, from mat, csv, xlsx and pkl. Default is csv
- **folders** (*string or list of strings*, *optional*) The folder or folders where the data can be found. Default is the current folder.
- file\_name\_filter (callable, string, list of strings or None, optional) A function to process the file names or a list of possible prefixes as strings or a single string. Default None, no file names removed
- **terminal\_ID** (bool, optional) Is there an ID number at the end of the filename? If not then a more general search will be performed. Default True
- **split\_by** (*string* or *list* of *strings*, *optional*) If multiple participant datasets are in one file sheet, this specifies the column or columns that can distinguish and identify the rows for each participant. Default None
- participantID (string, optional) The dict key where the participant ID can be found. Default None, which results in the file name being used.
- **choices** (*string*, *optional*) The dict key where the participant choices can be found. Default 'actions'
- **feedbacks** (*string*, *optional*) The dict key where the feedbacks the participant received can be found. Default 'feedbacks'
- **stimuli** (string or list of strings, optional) The dict keys where the stimulus cues for each trial can be found. Default 'None'
- action\_options (string or list of strings or None or one element list with a list, optional) If a string or list of strings these are treated as dict keys where the valid actions for each trial can be found. If None then all trials will use all available actions. If the list contains one list then it will be treated as a list of valid actions for each trialstep. Default 'None'

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- group\_by (list of strings, optional) A list of parts of filenames that are repeated across participants, identifying all the files that should be grouped together to form one participants data. The rest of the filename is assumed to identify the participant. Default is None
- extra\_processing (callable, optional) A function that modifies the dictionary of data read for each participant in such that it is appropriate for fitting. Default is None
- data\_read\_options (dict, optional) The keyword arguments for the data importing method chosen

#### **Returns Data**

Return type Data class instance

#### exception data.DimentionError

Bases: exceptions. Exception

# exception data.FileError

Bases: exceptions. Exception

# exception data.FileFilterError

Bases: exceptions. Exception

### exception data.FileTypeError

Bases: exceptions. Exception

### exception data.FoldersError

Bases: exceptions.Exception

#### exception data. IDError

Bases: exceptions. Exception

# exception data.LengthError

Bases: exceptions. Exception

### exception data.ProcessingError

 $Bases: \verb|exceptions.Exception||$ 

data.sort\_by\_last\_number(dataFiles)

### 6.4 taskGenerator module

### 6.4.1 taskGenerator Module

Author Dominic Hunt

#### 6.4.1.1 Classes

Task()	The abstract tasks class from which all others inherit
TaskGeneration(task_name[, parameters,])	Generates task class instances based on a task and a
	set of varying parameters

### **TaskGeneration**

Generates task class instances based on a task and a set of varying parameters

#### **Parameters**

- task\_name (string) The name of the file where a tasks.taskTemplate.Task class can be found
- parameters (dictionary of floats or lists of floats) Parameters are the options that you are or are likely to change across task instances. When a parameter contains a list, an instance of the task will be created for every combination of this parameter with all the others. Default None
- other\_options (dictionary of float, string or binary valued elements) These contain all the task options that describe the task being studied but do not vary across task instances. Default None

# **Methods Summary**

iter_task_ID()	Yields the tasks IDs.
new_task(task_number)	Produces the next tasks instance
next()	Produces the next task instance for the iterator

#### **Methods Documentation**

#### iter task ID()

Yields the tasks IDs. To be used with self.new\_task(expID) to receive the next tasks instance

**Returns** expID – The ID number that refers to the next tasks parameter combination.

Return type int

new\_task(task\_number)

Produces the next tasks instance

**Parameters** task\_number (int) - The number of the tasks instance to be initialised

**Returns instance** 

**Return type** tasks.taskTemplate.Task instance

next()

Produces the next task instance for the iterator

**Returns instance** 

Return type tasks.taskTemplate.Task instance

# 6.4.1.2 Class Inheritance Diagram

Author Dominic Hunt

Generates task class instances based on a task and a set of varying parameters

#### **Parameters**

- task\_name (string) The name of the file where a tasks.taskTemplate.Task class can be found
- parameters (dictionary of floats or lists of floats) Parameters are the options that you are or are likely to change across task instances. When a parameter contains a list, an instance of the task will be created for every combination of this parameter with all the others. Default None

• other\_options (dictionary of float, string or binary valued elements) – These contain all the task options that describe the task being studied but do not vary across task instances. Default None

```
iter_task_ID()
```

Yields the tasks IDs. To be used with self.new\_task(expID) to receive the next tasks instance

**Returns** expID – The ID number that refers to the next tasks parameter combination.

Return type int

new\_task (task\_number)

Produces the next tasks instance

**Parameters** task\_number (int) - The number of the tasks instance to be initialised

**Returns instance** 

**Return type** tasks.taskTemplate.Task instance

next()

Produces the next task instance for the iterator

**Returns instance** 

Return type tasks.taskTemplate.Task instance

# 6.5 tasks package

# 6.5.1 tasks Package

### 6.5.2 Submodules

### 6.5.2.1 tasks.balltask module

pyhpdm version of the balltask task TODO: describe tasks

```
 \textbf{class} \texttt{ tasks.balltask.Balltask} (nbr\_of\_bags=6, bag\_colors=[u'red', u'green', u'blue'], \\ balls\_per\_bag=3)
```

Bases: tasks.task Template.Task

feedback()

Responds to the action from the participant balltask has no rewards so we return None

next()

Produces the next stimulus for the iterator

### **Returns**

- stimulus (None)
- nextValidActions ((0, 1, 2) representing red, green, blue in default case) but can be many colors. it's assumed this always goes in same order left to right as bag\_colors parameter

Raises StopIteration

proceed()

Updates the task after feedback

receiveAction(action)

Receives the next action from the participant

Parameters action (int or string) - The action taken by the model

#### returnTaskState()

Returns all the relevant data for this task run

**Returns history** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

#### storeState()

Stores the state of all the important variables so that they can be output later

```
class tasks.balltask.RewardBalltaskDirect(**kwargs)
```

Bases: model.modelTemplate.Rewards

Processes the reward for models expecting just the reward

processFeedback (feedback, lastAction, stimuli)

Returns

Return type modelFeedback

```
class tasks.balltask.StimulusBalltaskSimple(**kwargs)
```

Bases: model.modelTemplate.Stimulus

Processes the stimulus cues for models expecting just the event

#### processStimulus (observation)

Processes the decks stimuli for models expecting just the event

#### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- **stimuliActivity** (*float or list of float*) The activity of each of the elements

### 6.5.2.2 tasks.basic module

Author Dominic Hunt

**Note** A simple example of a task class with all the necessary components

```
class tasks.basic.Basic(trials=100)
    Bases: tasks.taskTemplate.Task
```

An example of a task with all the necessary components, but nothing changing

Parameters trials (int) - The number of trials in the task

#### Name

The name of the class used when recording what has been used.

Type string

# feedback()

Responds to the action from the participant

#### next()

the task class is an iterator [link to iterator documentation] this function produces the next stimulus for the task iterator

#### Returns

- stimulus (None)
- **nextValidActions** (Tuple of ints or None) The list of valid actions that the model can respond with. Set to (0,1), as they never vary.

Raises StopIteration

#### proceed()

Updates the task after feedback

#### receiveAction (action)

Receives the next action from the participant

**Parameters action** (int or string) – The action taken by the model

#### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

#### storeState()

Stores the state of all the important variables so that they can be output later

### class tasks.basic.RewardBasicDirect(\*\*kwargs)

Bases: model.modelTemplate.Rewards

Processes the reward for models expecting just the reward

processFeedback (feedback, lastAction, stimuli)

Returns

Return type modelFeedback

```
class tasks.basic.StimulusBasicSimple(**kwargs)
```

Bases: model.modelTemplate.Stimulus

Processes the stimulus cues for models expecting just the event

```
processStimulus (observation)
```

Processes the decks stimuli for models expecting just the event

#### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- stimuliActivity (float or list of float) The activity of each of the elements

#### 6.5.2.3 tasks.beads module

Author Dominic Hunt

**Reference** Jumping to conclusions: a network model predicts schizophrenic patients' performance on a probabilistic reasoning task. *Moore, S. C., & Sellen, J. L. (2006)*. Cognitive, Affective & Behavioral Neuroscience, 6(4), 261–9. Retrieved from http://www.ncbi.nlm.nih.gov/pubmed/17458441

```
class tasks.beads.Beads (N=None, beadSequence=[1, 1, 1, 0, 1, 1, 1, 0, 1, 0, 0, 0, 0, 0, 0, 1, 0])
```

Bases: tasks.taskTemplate.Task

Based on the Moore & Sellen Beads task

Many methods are inherited from the tasks.taskTemplate.Task class. Refer to its documentation for missing methods.

### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

• N (int, optional) - Number of beads that could potentially be shown

• **beadSequence** (list or array of {0,1}, optional) – The sequence of beads to be shown. Bead sequences can also be embedded in the code and then referred to by name. The only current one is *MooreSellen*, the default sequence.

#### next()

Produces the next bead for the iterator

### Returns

- bead ({0,1})
- **nextValidActions** (Tuple of ints or None) The list of valid actions that the model can respond with. Set to (0,1), as they never vary.

Raises StopIteration

#### receiveAction (action)

Receives the next action from the participant

Parameters action (int or string) - The action taken by the model

#### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

### storeState()

Stores the state of all the important variables so that they can be output later

```
class tasks.beads.RewardBeadDirect(**kwargs)
```

Bases: model.modelTemplate.Rewards

Processes the beads reward for models expecting just the reward

processFeedback (feedback, lastAction, stimuli)

#### **Returns**

Return type modelFeedback

```
class tasks.beads.StimulusBeadDirect(**kwargs)
```

Bases: model.modelTemplate.Stimulus

Processes the beads stimuli for models expecting just the event

```
processStimulus (observation)
```

Processes the decks stimuli for models expecting just the event

# Returns

- **stimuliPresent** (int or list of int)
- stimuliActivity (float or list of float)

```
class tasks.beads.StimulusBeadDualDirect(**kwargs)
```

Bases: model.modelTemplate.Stimulus

Processes the beads stimuli for models expecting a tuple of [event, 1-event]

# processStimulus(observation)

Processes the decks stimuli for models expecting just the event

### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- stimuliActivity (float or list of float) The activity of each of the elements

#### class tasks.beads.StimulusBeadDualInfo(\*\*kwargs)

Bases: model.modelTemplate.Stimulus

Processes the beads stimuli for models expecting the reward information from two possible actions

**Parameters oneProb** (float in [0,1]) – The probability of a 1 from the first jar. This is also the probability of a 0 from the second jar. event\_info is calculated as oneProb\*event + (1-oneProb) \* (1-event)

```
oneProb = [0, 1]
```

processStimulus (observation)

Processes the decks stimuli for models expecting just the event

#### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- **stimuliActivity** (*float or list of float*) The activity of each of the elements

tasks.beads.generateSequence(numBeads, oneProb, switchProb)

Designed to generate a sequence of beads with a probability of switching jar at any time.

### **Parameters**

- **numBeads** (*int*) The number of beads in the sequence
- oneProb (float in [0,1]) The probability of a 1 from the first jar. This is also the probability of a 0 from the second jar.
- **switchProb** (float in [0,1]) The probability that the drawn beads change the jar they are being drawn from

Returns sequence - The generated sequence of beads

**Return type** list of  $\{0, 1\}$ 

### 6.5.2.4 tasks.decks module

Author Dominic Hunt

**Reference** Regulatory fit effects in a choice task *Worthy, D. a, Maddox, W. T., & Markman, A. B.* (2007). Psychonomic Bulletin & Review, 14(6), 1125–32. Retrieved from http://www.ncbi.nlm. nih.gov/pubmed/18229485

```
class tasks.decks.Decks (draws=None, decks=array([[ 2, 2, 1, 1, 2, 1, 1, 3, 2, 6, 2, 8, 1, 6, 2, 1, 1, 5, 8, 5, 10, 10, 8, 3, 10, 7, 10, 8, 3, 4, 9, 10, 3, 6, 3, 5, 10, 10, 10, 7, 3, 8, 5, 8, 6, 9, 4, 4, 4, 10, 6, 4, 10, 3, 10, 5, 10, 3, 10, 10, 5, 4, 6, 10, 7, 7, 10, 10, 10, 3, 1, 4, 1, 3, 1, 7, 1, 3, 1, 8], [7, 10, 5, 10, 6, 6, 10, 10, 10, 8, 4, 8, 10, 4, 9, 10, 8, 6, 10, 10, 10, 4, 7, 10, 5, 10, 4, 10, 10, 9, 2, 9, 8, 10, 7, 7, 1, 10, 2, 6, 4, 7, 2, 1, 1, 1, 7, 10, 1, 4, 2, 1, 1, 1, 4, 1, 1, 1, 1, 3, 1, 4, 1, 1, 1, 5, 1, 1, 1, 7, 2, 1, 2, 1, 4, 1, 4, 1]]), discard=False)
```

Bases: tasks.taskTemplate.Task

Based on the Worthy&Maddox 2007 paper "Regulatory fit effects in a choice task.

Many methods are inherited from the tasks.taskTemplate.Task class. Refer to its documentation for missing methods.

### Name

The name of the class used when recording what has been used.

Type string

### **Parameters**

- draws (int, optional) Number of cards drawn by the participant
- decks (array of floats, optional) The decks of cards

• **discard** (bool) – Defines if you discard the card not chosen or if you keep it.

#### feedback()

Responds to the action from the participant

#### next()

Produces the next stimulus for the iterator

#### Returns

- stimulus (None)
- **nextValidActions** (Tuple of ints or None) The list of valid actions that the model can respond with. Set to (0,1), as they never vary.

Raises StopIteration

### proceed()

Updates the task after feedback

#### receiveAction (action)

Receives the next action from the participant

**Parameters action** (int or string) – The action taken by the model

### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

#### storeState(

Stores the state of all the important variables so that they can be output later

```
class tasks.decks.RewardDecksAllInfo(**kwargs)
```

```
Bases: model.modelTemplate.Rewards
```

Processes the decks reward for models expecting the reward information from all possible actions

### **Parameters**

- maxRewardVal (int) The highest value a reward can have
- minRewardVal (int) The lowest value a reward can have
- number\_actions (int) The number of actions the participant can perform. Assumes the lowest valued action is 0

**Returns deckRew** – The function expects to be passed a tuple containing the reward and the last action. The reward that is a float and action is {0,1}. The function returns a array of length (maxRewardVal-minRewardVal)\*number\_actions.

**Return type** function

#### Name

The identifier of the function

Type string

#### **Examples**

(continues on next page)

```
(continued from previous page)
```

```
>>> rew.processFeedback(6, 1, 1)
    \hookrightarrow 1., 1.]
    maxRewardVal = 10
    minRewardVal = 1
    number actions = 2
    processFeedback (reward, action, stimuli)
            Returns
            Return type modelFeedback
class tasks.decks.RewardDecksDualInfo(**kwargs)
    Bases: model.modelTemplate.Rewards
    Processes the decks reward for models expecting the reward information from two possible actions.
    epsilon = 1
    maxRewardVal = 10
    processFeedback (reward, action, stimuli)
            Returns
            Return type modelFeedback
class tasks.decks.RewardDecksDualInfoLogistic(**kwargs)
    Bases: model.modelTemplate.Rewards
    Processes the decks rewards for models expecting the reward information from two possible actions.
    epsilon = 0.3
    maxRewardVal = 10
    minRewardVal = 1
    processFeedback (reward, action, stimuli)
            Returns
            Return type modelFeedback
class tasks.decks.RewardDecksLinear(**kwargs)
    Bases: \verb|modell.modellemplate.Rew| ards
    Processes the decks reward for models expecting just the reward
    processFeedback (feedback, lastAction, stimuli)
            Returns
            Return type modelFeedback
class tasks.decks.RewardDecksNormalised(**kwargs)
    Bases: model.modelTemplate.Rewards
    Processes the decks reward for models expecting just the reward, but in range [0,1]
         Parameters maxReward(int, optional) - The highest value a reward can have. Default
    See also:
    model.OpAL
    maxReward = 10
```

processFeedback (feedback, lastAction, stimuli)

Returns

Return type modelFeedback

class tasks.decks.RewardDecksPhi(\*\*kwargs)

Bases: model.modelTemplate.Rewards

Processes the decks reward for models expecting just the reward, but in range [0, 1]

Parameters phi (float) - The scaling value of the reward

phi = 1

processFeedback (feedback, lastAction, stimuli)

Returns

Return type modelFeedback

class tasks.decks.StimulusDecksLinear(\*\*kwargs)

Bases: model.modelTemplate.Stimulus

processStimulus (observation)

Processes the decks stimuli for models expecting just the event

#### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- stimuliActivity (float or list of float) The activity of each of the elements

### 6.5.2.5 tasks.taskTemplate module

### tasks.taskTemplate Module

Author Dominic

### **Classes**

Task()

The abstract tasks class from which all others inherit

# **Task**

 $\textbf{class} \ \texttt{tasks.taskTemplate.Task}$ 

Bases: object

The abstract tasks class from which all others inherit

Many general methods for tasks are found only here

Name

The name of the class used when recording what has been used.

Type string

### **Methods Summary**

feedback()	Responds to the action from the participant
get_name()	Returns the name of the class

Continued on next page

Table 10 – continued from previous page

next()	Produces the next stimulus for the iterator
params()	Returns the parameters of the task as a dictionary
proceed()	Updates the task before the next trialstep
receiveAction(action)	Receives the next action from the participant
returnTaskState()	Returns all the relevant data for this task run
standardResultOutput()	
storeState()	Stores the state of all the important variables so
	that they can be output later

### **Methods Documentation**

#### feedback()

Responds to the action from the participant

### Returns feedback

Return type None, int or float

### classmethod get\_name()

Returns the name of the class

### next()

Produces the next stimulus for the iterator

#### **Returns**

- stimulus (None)
- **nextValidActions** (*Tuple of ints*) The list of valid actions that the model can respond with. Set to None, as they never vary.

Raises StopIteration

#### params()

Returns the parameters of the task as a dictionary

**Returns** parameters – The parameters of the task

Return type dict

### proceed()

Updates the task before the next trialstep

### receiveAction (action)

Receives the next action from the participant

Parameters action (int or string) - The action taken by the model

### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

### standardResultOutput()

# storeState()

Stores the state of all the important variables so that they can be output later

# **Class Inheritance Diagram**

Author Dominic

# class tasks.taskTemplate.Task Bases: object The abstract tasks class from which all others inherit Many general methods for tasks are found only here Name The name of the class used when recording what has been used. Type string feedback() Responds to the action from the participant Returns feedback Return type None, int or float classmethod get\_name() Returns the name of the class next() Produces the next stimulus for the iterator Returns • stimulus (None) • nextValidActions (Tuple of ints) – The list of valid actions that the model can respond with. Set to None, as they never vary. Raises StopIteration params() Returns the parameters of the task as a dictionary **Returns** parameters – The parameters of the task Return type dict proceed() Updates the task before the next trialstep receiveAction (action) Receives the next action from the participant **Parameters action** (int or string) – The action taken by the model returnTaskState() Returns all the relevant data for this task run **Returns results** – A dictionary containing the class parameters as well as the other useful data Return type dictionary

# 6.5.2.6 tasks.pavlov module

storeState()

standardResultOutput()

**Author** Dominic Hunt

**Reference** Value and prediction error in medial frontal cortex: integrating the single-unit and systems levels of analysis. *Silvetti, M., Seurinck, R., & Verguts, T. (2011)*. Frontiers in Human Neuroscience, 5(August), 75. doi:10.3389/fnhum.2011.00075

Stores the state of all the important variables so that they can be output later

**class** tasks.pavlov.**Pavlov**(rewMag=4, rewProb=array([0.87, 0.33]), stimMag=1, stim-Dur=20, rewDur=4, simDur=30, stimRepeats=7)

Bases: tasks.taskTemplate.Task

Based on the Silvetti et al 2011 paper "Value and prediction error in medial frontal cortex: integrating the single-unit and systems levels of analysis."

Many methods are inherited from the tasks.taskTemplate.Task class. Refer to its documentation for missing methods.

#### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- rewMag (float, optional) The size of the stimulus. Default 4
- **rewProb** (array of floats, optional) The probabilities of each stimulus producing a reward. Default [0.85,0.33]
- stimMag(float, optional) The size of the stimulus. Default 1
- **stimDur** (*int*, *optional*) The duration, in tens of ms, that the stimulus is produced for. This should be longer than rewDur since rewDur is set to end when stimDur ends. Default 200
- rewDur(int, optional) The duration, in tens of ms, that the reward is produced for. Default 40
- **simDur** (*int*, *optional*) The duration, in tens of ms, that each stimulus event is run for. Default 300
- **stimRepeats** (*int*, *optional*) The number of times a stimulus is introduced. Default 72

### feedback()

Responds to the action from the participant

### next()

Produces the next stimulus for the iterator

#### Returns

- **nextStim** (tuple of c, rewSig and stimDur, described below)
- c (list of floats) Contains the inputs for each of the stimuli
- rewSig (list of lists of floats) Each list contains the rewards at each time
- stimDur (int)
- **nextValidActions** (*Tuple of ints*) The list of valid actions that the model can respond with. Set to None, as there are no actions.

Raises StopIteration

### proceed()

Updates the task after feedback

#### receiveAction (action)

Receives the next action from the participant

**Parameters action** (int or string) – The action taken by the model

#### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

#### storeState()

Stores the state of all the important variables so that they can be output later

```
tasks.pavlov.pavlovStimTemporal()
```

Passes the pavlov stimuli to models that cope with stimuli and rewards that have a duration.

Returns pavlovStim — The function expects to be passed an event with three components: (stim, rew, stimDur) `and an action (unused) and yield a series of events ``t,c,r`. stim is the value of the stimulus. It is expected to be a list-like object. rew is a list containing the reward for each trialstep. The reward is expected to be a float. stimDur is the duration of the stimulus, an int. This should be less than the length of rew. c the stimulus. r the reward. t is the time

### Return type function

```
tasks.pavlov.Name
```

The identifier of the function

Type string

### 6.5.2.7 tasks.probSelect module

Author Dominic Hunt

**Reference** Genetic triple dissociation reveals multiple roles for dopamine in reinforcement learning. Frank, M. J., Moustafa, A. a, Haughey, H. M., Curran, T., & Hutchison, K. E. (2007). Proceedings of the National Academy of Sciences of the United States of America, 104(41), 16311–16316. doi:10.1073/pnas.0706111104

```
class tasks.probSelect.ProbSelect (reward_probability=0.7, learning_action_pairs=None, action_reward_probabilities=None, learning_length=240, test_length=60, number_actions=None, reward_size=1)
```

Bases: tasks.taskTemplate.Task

Probabilistic selection task based on Genetic triple dissociation reveals multiple roles for dopamine in reinforcement learning. Frank, M. J., Moustafa, A. a, Haughey, H. M., Curran, T., & Hutchison, K. E. (2007). Proceedings of the National Academy of Sciences of the United States of America, 104(41), 16311–16316. doi:10.1073/pnas.0706111104

Many methods are inherited from the tasks.taskTemplate.Task class. Refer to its documentation for missing methods.

#### Name

The name of the class used when recording what has been used.

Type string

### **Parameters**

- reward\_probability (float in range [0,1], optional) The probability that a reward is given for choosing action A. Default is 0.7
- action\_reward\_probabilities (dictionary, optional) A dictionary of the potential actions that can be taken and the probability of a reward. Default {0:rewardProb, 1:1-rewardProb, 2:0.5, 3:0.5}
- learning\_action\_pairs (list of tuples, optional) The pairs of actions shown together in the learning phase.

- learning\_length (int, optional) The number of trials in the learning phase. Default is 240
- test\_length (int, optional) The number of trials in the test phase. Default is 60
- reward\_size (float, optional) The size of reward given if successful. Default 1
- number\_actions (int, optional) The number of actions that can be chosen at any given time, chosen at random from actRewardProb. Default 4

### **Notes**

The task is broken up into two sections: a learning phase and a transfer phase. Participants choose between pairs of four actions: A, B, M1 and M2. Each provides a reward with a different probability: A:P>0.5, B:1-P<0.5, M1=M2=0.5. The transfer phase has all the action pairs but no feedback. This class only covers the learning phase, but models are expected to be implemented as if there is a transfer phase.

#### feedback()

Responds to the action from the participant

#### next()

Produces the next stimulus for the iterator

#### **Returns**

- stimulus (None)
- **next\_valid\_actions** (*Tuple of length 2 of ints*) The list of valid actions that the model can respond with.

Raises StopIteration

### proceed()

Updates the task after feedback

### receiveAction(action)

Receives the next action from the participant

**Parameters action** (int or string) – The action taken by the model

## returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

#### storeState()

Stores the state of all the important variables so that they can be output later

```
class tasks.probSelect.RewardProbSelectDirect(**kwargs)
```

Bases: model.modelTemplate.Rewards

Processes the probabilistic selection reward for models expecting just the reward

processFeedback (reward, action, stimuli)

#### Returns

**Return type** modelFeedback

```
class tasks.probSelect.StimulusProbSelectDirect(**kwargs)
```

```
Bases: model.modelTemplate.Stimulus
```

Processes the selection stimuli for models expecting just the event

### **Examples**

```
>>> stim = StimulusProbSelectDirect()
>>> stim.processStimulus(1)
(1, 1)
>>> stim.processStimulus(0)
(1, 1)
```

#### processStimulus (observation)

Processes the decks stimuli for models expecting just the event

#### **Returns**

- **stimuliPresent** (int or list of int)
- stimuliActivity (float or list of float)

### 6.5.2.8 tasks.probStim module

Author Dominic Hunt

```
class tasks.probStim.Probstim(cues=None, actualities=None, trialsteps=100, numStim-
uli=4, correctProb=0.8, correctProbabilities=None, reward-
lessT=None)
```

Bases: tasks.taskTemplate.Task

Basic probabilistic

Many methods are inherited from the tasks.taskTemplate.Task class. Refer to its documentation for missing methods.

#### Name

The name of the class used when recording what has been used.

Type string

### **Parameters**

- **actualities** (*int*, *optional*) The actual reality the cues pointed to. The correct response the participant is trying to get correct
- cues (array of floats, optional) The cues used to guess the actualities
- **trialsteps** (*int*, *optional*) If no provided cues, it is the number of trialsteps for the generated set of cues. Default 100
- numStimuli (int, optional) If no provided cues, it is the number of distinct stimuli for the generated set of cues. Default 4
- **correctProb** (*float* in [0,1], optional) If no actualities provided, it is the probability of the correct answer being answer 1 rather than answer 0. The default is 0.8
- correctProbs (list or array of floats in [0,1], optional) —
  If no actualities provided, it is the probability of the correct answer being answer 1 rather than answer 0 for each of the different stimuli. Default [corrProb, 1-corrProb] \* (numStimuli//2) + [corrProb] \* (numStimuli%2)
- rewardlessT (int, optional) If no actualities provided, it is the number of actualities at the end of the tasks that will have a None reward. Default 2\*numStimuli

### feedback()

Feedback to the action from the participant

```
next()
```

Produces the next stimulus for the iterator

#### Returns

- **stimulus** (*Tuple*) The current cues
- **nextValidActions** (Tuple of ints or None) The list of valid actions that the model can respond with. Set to (0,1), as they never vary.

Raises StopIteration

### proceed()

Updates the task after feedback

#### receiveAction (action)

Receives the next action from the participant

**Parameters action** (int or string) – The action taken by the model

#### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

Return type dictionary

### storeState()

Stores the state of all the important variables so that they can be output later

```
class tasks.probStim.RewardProbStimDiff(**kwargs)
```

Bases: model.modelTemplate.Rewards

Processes the reward for models expecting reward corrections

processFeedback (feedback, lastAction, stimuli)

Returns

Return type modelFeedback

```
class tasks.probStim.RewardProbStimDualCorrection(**kwargs)
```

Bases: model.modelTemplate.Rewards

Processes the reward for models expecting the reward correction from two possible actions.

```
epsilon = 1
```

processFeedback (feedback, lastAction, stimuli)

**Returns** 

Return type modelFeedback

```
class tasks.probStim.StimulusProbStimDirect(**kwargs)
```

Bases: model.modelTemplate.Stimulus

Processes the stimuli for models expecting just the event

```
processStimulus (observation)
```

Processes the decks stimuli for models expecting just the event

### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- **stimuliActivity** (*float or list of float*) The activity of each of the elements

#### 6.5.2.9 tasks.weather module

Author Dominic Hunt

Reference Probabilistic classification learning in amnesia. Knowlton, B. J., Squire, L. R., & Gluck, M. a. (1994). Learning & Memory(Cold Spring Harbor, N.Y.), 1(2), 106–120. http://doi.org/10.1101/lm.1.2.106

class tasks.weather.RewardWeatherDiff(\*\*kwargs)

Bases: model.modelTemplate.Rewards

Processes the weather reward for models expecting reward corrections

processFeedback (feedback, lastAction, stimuli)

Returns

Return type modelFeedback

class tasks.weather.RewardWeatherDualCorrection(\*\*kwargs)

Bases: model.modelTemplate.Rewards

Processes the decks reward for models expecting the reward correction from two possible actions.

epsilon = 1

processFeedback (feedback, lastAction, stimuli)

**Returns** 

Return type modelFeedback

class tasks.weather.RewardsWeatherDirect(\*\*kwargs)

Bases: model.modelTemplate.Rewards

Processes the weather reward for models expecting the reward feedback

 ${\tt processFeedback}\ (\textit{feedback}, \textit{lastAction}, \textit{stimuli})$ 

Returns

Return type modelFeedback

class tasks.weather.StimulusWeatherDirect(\*\*kwargs)

Bases: model.modelTemplate.Stimulus

Processes the weather stimuli for models expecting just the event

processStimulus (observation)

Processes the decks stimuli for models expecting just the event

### Returns

- **stimuliPresent** (*int or list of int*) The elements present of the stimulus
- stimuliActivity (float or list of float) The activity of each of the elements

class tasks.weather.Weather(cueProbs=[[0.2, 0.8, 0.2, 0.8], [0.8, 0.2, 0.8], [0.8, 0.2]], learningLen=200, testLen=100,  $number\_cues=None$ , cues=None, actualities=None)

Bases: tasks.taskTemplate.Task

Based on the 1994 paper "Probabilistic classification learning in amnesia."

Many methods are inherited from the tasks.taskTemplate.Task class. Refer to its documentation for missing methods.

### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- **cueProbs** (array of int, optional) If generating data, the likelihood of each cue being associated with each actuality. Each row of the array describes one actuality, with each column representing one cue. Each column is assumed sum to 1
- number\_cues (int, optional) The number of cues
- **learningLen** (*int*, *optional*) The number of trials in the learning phase. Default is 200
- testLen (int, optional) The number of trials in the test phase. Default is 100
- actualities (array of int, optional) The actual reality the cues pointed to; the correct response the participant is trying to get correct
- **cues** (array of floats, optional) The stimulus cues used to guess the actualities

```
defaultCueProbs = [[0.2, 0.8, 0.2, 0.8], [0.8, 0.2, 0.8, 0.2]]
```

#### feedback()

Feedback to the action from the participant

#### next()

Produces the next stimulus for the iterator

#### Returns

- **stimulus** (*Tuple*) The current cues
- **nextValidActions** (Tuple of ints or None) The list of valid actions that the model can respond with. Set to (0,1), as they never vary.

Raises StopIteration

### proceed()

Updates the task after feedback

### receiveAction (action)

Receives the next action from the participant

Parameters action (int or string) - The action taken by the model

### returnTaskState()

Returns all the relevant data for this task run

**Returns results** – A dictionary containing the class parameters as well as the other useful data

**Return type** dictionary

#### storeState()

Stores the state of all the important variables so that they can be output later

tasks.weather.genActualities (cueProbs, cues, learningLen, testLen)

### **Parameters**

- cueProbs -
- cues -
- learningLen –
- testLen -

#### Returns

Return type actions

tasks.weather.genCues(number\_cues, taskLen)

#### **Parameters**

- cueProbs -
- taskLen -

#### Returns

Return type cues

# 6.6 modelGenerator module

# 6.6.1 modelGenerator Module

**Author** Dominic Hunt

#### 6.6.1.1 Classes

Model([number_actions, number_cues,	])	The model class is a general template for a model.
ModelGen(model_name[,	parameters,	Generates model class instances based on a model and
other_options])		a set of varying parameters
Rewards(**kwargs)		This acts as an interface between the feedback from a
		task and the feedback a model can process
Stimulus(**kwargs)		Stimulus processor class.

### ModelGen

Generates model class instances based on a model and a set of varying parameters

# **Parameters**

- model\_name (string) The name of the file where a model.modelTemplate.Model class can be found
- parameters (dictionary containing floats or lists of floats, optional) Parameters are the options that you are or are likely to change across model instances. When a parameter contains a list, an instance of the model will be created for every combination of this parameter with all the others. Default None
- other\_options(dictionary of float, string or binary valued elements, optional) These contain all the model options that define the version of the model being studied. Default None

### **Methods Summary**

iter_details()	Yields a list containing a model object and param-
	eters to initialise them
next()	Produces the next item for the iterator

### **Methods Documentation**

# iter details()

Yields a list containing a model object and parameters to initialise them

#### Returns

- model (model.modelTemplate.Model) The model to be initialised
- parameters (ordered dictionary of floats or bools) The model instance parameters
- **other\_options** (dictionary of floats, strings and binary values)

#### next()

Produces the next item for the iterator

#### Returns models

**Return type** list of model.model.model instances

### 6.6.1.2 Class Inheritance Diagram

#### Author Dominic Hunt

Generates model class instances based on a model and a set of varying parameters

#### **Parameters**

- model\_name (string) The name of the file where a model.modelTemplate.Model class can be found
- parameters (dictionary containing floats or lists of floats, optional) Parameters are the options that you are or are likely to change across model instances. When a parameter contains a list, an instance of the model will be created for every combination of this parameter with all the others. Default None
- other\_options (dictionary of float, string or binary valued elements, optional) These contain all the model options that define the version of the model being studied. Default None

#### iter details()

Yields a list containing a model object and parameters to initialise them

#### **Returns**

- model (model.modelTemplate.Model) The model to be initialised
- parameters (ordered dictionary of floats or bools) The model instance parameters
- other\_options (dictionary of floats, strings and binary values)

### next()

Produces the next item for the iterator

#### Returns models

Return type list of model.model.model instances

# 6.7 model package

### 6.7.1 Subpackages

### 6.7.1.1 model.decision package

### **Submodules**

### model.decision.binary module

### model.decision.binary Module

#### Author Dominic Hunt

A collection of decision making functions where there are only two possible actions

#### **Functions**

single([task\_responses])

Decisions using a switching probability

## single

```
model.decision.binary.single(task_responses=(0, 1))
Decisions using a switching probability
```

**Parameters task\_responses** (tuple of length two, optional) - Provides the two action responses expected by the task

#### Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (int or None) The action to be taken by the model
- **probabilities** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

### **Examples**

```
>>> np.random.seed(100)
>>> dec = single()
>>> dec(0.23)
(0, OrderedDict([(0, 0.77), (1, 0.23)]))
>>> dec(0.23, 0)
(0, OrderedDict([(0, 0.77), (1, 0.23)]))
```

### Author Dominic Hunt

A collection of decision making functions where there are only two possible actions

```
model.decision.binary.single(task_responses=(0, 1))

Decisions using a switching probability
```

**Parameters task\_responses** (tuple of length two, optional) - Provides the two action responses expected by the task

### Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (int or None) The action to be taken by the model
- **probabilities** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

### **Examples**

```
>>> np.random.seed(100)
>>> dec = single()
>>> dec(0.23)
(0, OrderedDict([(0, 0.77), (1, 0.23)]))
>>> dec(0.23, 0)
(0, OrderedDict([(0, 0.77), (1, 0.23)]))
```

### model.decision.discrete module

### model.decision.discrete Module

### Author Dominic Hunt

A collection of decision making functions where there are no limits on the number of actions, but they are countable.

### **Functions**

maxProb([task_responses])	Decisions for an arbitrary number of choices
probThresh([task_responses, eta])	Decisions for an arbitrary number of choices
weightProb([task_responses])	Decisions for an arbitrary number of choices

#### maxProb

```
\verb|model.decision.discrete.maxProb| (\textit{task\_responses} = (0,1))
```

Decisions for an arbitrary number of choices

Choice made by choosing the most likely

**Parameters task\_responses** (tuple) – Provides the action responses expected by the tasks for each probability estimate.

#### Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (int or None) The action to be taken by the model
- **probDict** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

### See also:

```
models.QLearn(), models.QLearn2(), models.OpAL()
```

# **Examples**

```
>>> np.random.seed(100)
>>> d = maxProb([1,2,3])
>>> d([0.6, 0.3, 0.5])
(1, OrderedDict([(1, 0.6), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.3, 0.5], trial_responses=[1, 2])
(2, OrderedDict([(1, 0.2), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.3, 0.5], trial_responses=[])
```

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```
(None, OrderedDict([(1, 0.2), (2, 0.3), (3, 0.5)]))
>>> d = maxProb(["A", "B", "C"])
>>> d([0.6, 0.3, 0.5], trial_responses=["A", "B"])
('A', OrderedDict([('A', 0.6), ('B', 0.3), ('C', 0.5)]))
```

### probThresh

```
model.decision.discrete.probThresh (task\_responses=(0, 1), eta=0.8)
Decisions for an arbitrary number of choices
```

Choice made by choosing when certain (when probability above a certain value), otherwise randomly

#### **Parameters**

- **task\_responses** (*tuple*) Provides the action responses expected by the tasks for each probability estimate.
- eta (float, optional) The value above which a non-random decision is made. Default value is 0.8

#### Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (*int or None*) The action to be taken by the model
- **probDict** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

# **Examples**

```
>>> np.random.seed(100)
>>> d = probThresh(task_responses=[0, 1, 2, 3], eta=0.8)
>>> d([0.2, 0.8, 0.3, 0.5])
(1, OrderedDict([(0, 0.2), (1, 0.8), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.8, 0.3, 0.5], trial_responses=[0, 2])
(0, OrderedDict([(0, 0.2), (1, 0.8), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.8, 0.3, 0.5], trial_responses=[])
(None, OrderedDict([(0, 0.2), (1, 0.8), (2, 0.3), (3, 0.5)]))
>>> d = probThresh(["A","B","C"])
>>> d([0.2, 0.3, 0.8], trial_responses=["A", "B"])
('A', OrderedDict([('A', 0.2), ('B', 0.3), ('C', 0.8)]))
```

# weightProb

```
model.decision.discrete.weightProb (task\_responses=(0, 1)) Decisions for an arbitrary number of choices
```

Choice made by choosing randomly based on which are valid and what their associated probabilities are

**Parameters** task\_responses (tuple) - Provides the action responses expected by the task for each probability estimate.

# Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (int or None) The action to be taken by the model

• **probDict** (*OrderedDict of valid responses*) – A dictionary of considered actions as keys and their associated probabilities as values

#### See also:

```
models.QLearn(), models.QLearn2(), models.OpAL()
```

### **Examples**

```
>>> np.random.seed(100)
>>> d = weightProb([0, 1, 2, 3])
>>> d([0.4, 0.8, 0.3, 0.5])
(1, OrderedDict([(0, 0.2), (1, 0.4), (2, 0.15), (3, 0.25)]))
>>> d([0.1, 0.3, 0.4, 0.2])
(1, OrderedDict([(0, 0.1), (1, 0.3), (2, 0.4), (3, 0.2)]))
>>> d([0.2, 0.5, 0.3, 0.5], trial_responses=[0, 2])
(2, OrderedDict([(0, 0.4), (1, 0), (2, 0.6), (3, 0)]))
>>> d = weightProb(["A", "B", "C"])
>>> d([0.2, 0.3, 0.5], trial_responses=["A", "B"])
(u'B', OrderedDict([(u'A', 0.4), (u'B', 0.6), (u'C', 0)]))
>>> d([0.2, 0.3, 0.5], trial_responses=[])
(None, OrderedDict([(u'A', 0.2), (u'B', 0.3), (u'C', 0.5)]))
```

#### Author Dominic Hunt

A collection of decision making functions where there are no limits on the number of actions, but they are countable

```
model.decision.discrete.maxProb (task\_responses=(0, 1))
Decisions for an arbitrary number of choices
```

Choice made by choosing the most likely

**Parameters task\_responses** (tuple) – Provides the action responses expected by the tasks for each probability estimate.

# Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (int or None) The action to be taken by the model
- **probDict** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

# See also:

```
models.QLearn(), models.QLearn2(), models.OpAL()
```

### **Examples**

```
>>> np.random.seed(100)
>>> d = maxProb([1,2,3])
>>> d([0.6, 0.3, 0.5])
(1, OrderedDict([(1, 0.6), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.3, 0.5], trial_responses=[1, 2])
(2, OrderedDict([(1, 0.2), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.3, 0.5], trial_responses=[])
(None, OrderedDict([(1, 0.2), (2, 0.3), (3, 0.5)]))
>>> d = maxProb(["A", "B", "C"])
>>> d([0.6, 0.3, 0.5], trial_responses=["A", "B"])
('A', OrderedDict([('A', 0.6), ('B', 0.3), ('C', 0.5)]))
```

```
model.decision.discrete.probThresh (task\_responses=(0, 1), eta=0.8)
```

Decisions for an arbitrary number of choices

Choice made by choosing when certain (when probability above a certain value), otherwise randomly

#### **Parameters**

- **task\_responses** (*tuple*) Provides the action responses expected by the tasks for each probability estimate.
- eta (float, optional) The value above which a non-random decision is made. Default value is 0.8

#### Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (*int or None*) The action to be taken by the model
- **probDict** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

### **Examples**

```
>>> np.random.seed(100)
>>> d = probThresh(task_responses=[0, 1, 2, 3], eta=0.8)
>>> d([0.2, 0.8, 0.3, 0.5])
(1, OrderedDict([(0, 0.2), (1, 0.8), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.8, 0.3, 0.5], trial_responses=[0, 2])
(0, OrderedDict([(0, 0.2), (1, 0.8), (2, 0.3), (3, 0.5)]))
>>> d([0.2, 0.8, 0.3, 0.5], trial_responses=[])
(None, OrderedDict([(0, 0.2), (1, 0.8), (2, 0.3), (3, 0.5)]))
>>> d = probThresh(["A","B","C"])
>>> d([0.2, 0.3, 0.8], trial_responses=["A", "B"])
('A', OrderedDict([('A', 0.2), ('B', 0.3), ('C', 0.8)]))
```

 $model.decision.discrete.weightProb(task\_responses=(0, 1))$ 

Decisions for an arbitrary number of choices

Choice made by choosing randomly based on which are valid and what their associated probabilities are

**Parameters** task\_responses (tuple) - Provides the action responses expected by the task for each probability estimate.

### Returns

- **decision\_function** (*function*) Calculates the decisions based on the probabilities and returns the decision and the probability of that decision
- **decision** (int or None) The action to be taken by the model
- **probDict** (*OrderedDict of valid responses*) A dictionary of considered actions as keys and their associated probabilities as values

#### See also:

```
models.QLearn(), models.QLearn2(), models.OpAL()
```

### **Examples**

```
>>> np.random.seed(100)
>>> d = weightProb([0, 1, 2, 3])
>>> d([0.4, 0.8, 0.3, 0.5])
```

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```
(1, OrderedDict([(0, 0.2), (1, 0.4), (2, 0.15), (3, 0.25)]))
>>> d([0.1, 0.3, 0.4, 0.2])
(1, OrderedDict([(0, 0.1), (1, 0.3), (2, 0.4), (3, 0.2)]))
>>> d([0.2, 0.5, 0.3, 0.5], trial_responses=[0, 2])
(2, OrderedDict([(0, 0.4), (1, 0), (2, 0.6), (3, 0)]))
>>> d = weightProb(["A", "B", "C"])
>>> d([0.2, 0.3, 0.5], trial_responses=["A", "B"])
(u'B', OrderedDict([(u'A', 0.4), (u'B', 0.6), (u'C', 0)]))
>>> d([0.2, 0.3, 0.5], trial_responses=[])
(None, OrderedDict([(u'A', 0.2), (u'B', 0.3), (u'C', 0.5)]))
```

### 6.7.2 Submodules

### 6.7.2.1 model.ACBasic module

Author Dominic Hunt

Reference Based on ideas we had.

A basic, complete actor-critic model

#### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- alphaE (float, optional) Learning rate parameter for the update of the expectations. Default lpha
- alphaA(float, optional) Learning rate parameter for the update of the actor.

  Default lpha
- beta (float, optional) Sensitivity parameter for probabilities
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- **number\_actions** (*integer*, *optional*) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)

- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

**Return type** 1D ndArray of floats

#### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

**Return type** 1D ndArray of floats

delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- **stimuli**({int | float | tuple | None}) The stimuli received

# Returns

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

#### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (list of bool) A list describing if a stimulus cue is present in this trialstep

### 6.7.2.2 model.ACE module

Author Dominic Hunt

Reference Based on ideas we had.

**class** model.ACE.**ACE** (alpha=0.3, epsilon=0.1, alphaE=None, alphaA=None, expect=None, actor-Expect=None, \*\*kwargs)

Bases: model.modelTemplate.Model

A basic, complete actor-critic model with decision making based on QLearnE

#### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- alphaE (float, optional) Learning rate parameter for the update of the expectations. Default lpha
- alphaA (float, optional) Learning rate parameter for the update of the actor. Default lpha
- **epsilon** (*float*, *optional*) Noise parameter. The larger it is the less likely the model is to choose the highest expected reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues

- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

Return type 1D ndArray of floats

## calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray - The probabilities associated with the action Values

Return type 1D ndArray of floats

delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- expectation (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

# **Returns**

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

### 6.7.2.3 model.ACES module

Author Dominic Hunt

Reference Based on ideas we had.

class model.ACES.ACES (alpha=0.3, epsilon=0.1, expect=None, actorExpect=None, \*\*kwargs)
Bases: model.modelTemplate.Model

A basic, complete actor-critic model with decision making based on QLearnE

#### Name

The name of the class used when recording what has been used.

Type string

### **Parameters**

- alpha (float, optional) Learning rate parameter
- **epsilon** (*float*, *optional*) Noise parameter. The larger it is the less likely the model is to choose the highest expected reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

# delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

### **Returns**

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

# storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- delta(float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.4 model.BP module

Author Dominic Hunt

Bases: model.modelTemplate.Model

The Bayesian predictor model

#### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- beta (float, optional) Sensitivity parameter for probabilities. Default 4
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- validRewards (list, np.ndarray, optional) The different reward values that can occur in the task. Default array ([0, 1])
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **dirichletInit** (*float*, *optional*) The initial values for values of the dirichlet distribution. Normally 0, 1/2 or 1. Default 1
- prior (array of floats in [0, 1], optional) Ignored in this case
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

actStimMerge (dirichletVals, stimuli)

# actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D np.ndArray of floats

calcActExpectations (dirichletVals)

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D np.ndArray of floats) -

Returns probArray – The probabilities associated with the actionValues

Return type 1D np.ndArray of floats

delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- **stimuli**({int | float | tuple | None}) The stimuli received

# Returns

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

## rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

### **Returns**

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

# storeState()

Stores the state of all the important variables so that they can be accessed later

updateExpectations (dirichletVals)

updateModel (delta, action, stimuli, stimuliFilter)

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- stimuli (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.5 model.BPE module

Author Dominic Hunt

class model.BPE.BPE (alpha=0.3, epsilon=0.1, dirichletInit=1, validRewards=array([0, 1]), \*\*kwargs)

Bases: model.modelTemplate.Model

The Bayesian predictor model

#### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- **epsilon** (*float*, *optional*) Noise parameter. The larger it is the less likely the model is to choose the highest expected reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- validRewards (list, np.ndarray, optional) The different reward values that can occur in the task. Default array ([0, 1])
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- dirichletInit(float, optional) The initial values for values of the dirichlet distribution. Normally 0, 1/2 or 1. Default 1
- prior (array of floats in [0, 1], optional) Ignored in this case
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- decFunc (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

# See also:

model.BP This model is heavily based on that one

actStimMerge (dirichletVals, stimuli)

# actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

```
Return type 1D ndArray of floats
```

## calcActExpectations (dirichletVals)

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

### delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

## **Returns**

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateExpectations (dirichletVals)

updateModel (delta, action, stimuli, stimuliFilter)

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- stimuli (list of float) The weights of the different stimuli in this trialstep
- $stimuliFilter(list\ of\ bool) A$  list describing if a stimulus cue is present in this trialstep

# 6.7.2.6 model.BPV module

### Author Dominic Hunt

**class** model.BPV.**BPV** (alpha=0.3, dirichletInit=1, validRewards=array([0, 1]), \*\*kwargs)
Bases: model.modelTemplate.Model

The Bayesian predictor model

### Name

The name of the class used when recording what has been used.

Type string

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- **validRewards** (*list*, *np.ndarray*, *optional*) The different reward values that can occur in the task. Default array ([0, 1])
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- dirichletInit(float, optional) The initial values for values of the dirichlet distribution. Normally 0, 1/2 or 1. Default 1
- prior (array of floats in [0, 1], optional) Ignored in this case
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

actStimMerge (dirichletVals, stimuli)

## actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

Return type 1D np.ndarray of floats

calcActExpectations (dirichletVals)

## calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D np.ndarray of floats) -

**Returns** probArray – The probabilities associated with the action Values

# Return type 1D np.ndarray of floats

### delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

### **Returns**

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

# storeState()

Stores the state of all the important variables so that they can be accessed later

updateExpectations (dirichletVals)

 ${\tt updateModel}\ (\textit{delta}, \textit{action}, \textit{stimuli}, \textit{stimuliFilter})$ 

# **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.7 model.OpAL module

Author Dominic Hunt

**Reference** Based on the paper Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. Collins, A. G. E., & Frank, M. J. (2014). Psychological Review, 121(3), 337–66. doi:10.1037/a0037015

class model.OpAL.OpAL (alpha=0.3, beta=4, rho=0, invBeta=None, alphaCrit=None, betaGo=None, betaNogo=None, alphaGo=None, alphaNogo=None, alphaGoDiff=None, alphaGoDiff=None, expect=None, expect=None, expectGo=None, \*\*kwargs)

Bases: model.modelTemplate.Model

The Opponent actor learning model

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- alpha (float, optional) Learning rate parameter, used as either the
- alphaGoNogoDiff (float, optional) The difference between alphaGo and alphaNogo. Default is None. If not None will overwrite alphaNogo  $\alpha_N=\alpha_G-\alpha_\delta$
- alphaCrit (float, optional) The critic learning rate. Default is alpha
- alphaGo (float, optional) Learning rate parameter for Go, the positive part of the actor learning Default is alpha
- alphaNogo (float, optional) Learning rate parameter for Nogo, the negative part of the actor learning Default is alpha
- alphaGoDiff (float, optional) The difference between alphaCrit and alphaGo. The default is None If not None and alphaNogoDiff is also not None, it will overwrite the alphaGo parameter  $\alpha_G=\alpha_C+\alpha$
- alphaNogoDiff (float, optional) The difference between alphaCrit and alphaNogo. The default is None If not None and alphaGoDiff is also not None, it will overwrite the alphaNogo parameter  $\alpha_N=\alpha_C+\alpha$
- **beta** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\beta$  in the paper
- invBeta (float, optional) Inverse of sensitivity parameter for the probabilities. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- **rho** (float, optional) The asymmetry between the actor weights.  $\rho = \beta_G \beta = \beta_N + \beta$
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues(integer, optional)-

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.

- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) / number critics
- expectGo (array of floats, optional) The initialisation of the the expected go and nogo. Default ones ((number\_actions, number\_cues)) / number\_critics
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### **Notes**

Actor: The chosen action is updated with

$$\delta_{d,t} = r_t - E_{d,t}$$
$$E_{d,t+1} = E_{d,t} + \alpha_E \delta_{d,t}$$

Critic: The chosen action is updated with

$$G_{d,t+1} = G_{d,t} + \alpha_G G_{d,t} \delta_{d,t}$$
  

$$N_{d,t+1} = N_{d,t} - \alpha_N N_{d,t} \delta_{d,t}$$

Probabilities: The probabilities for all actions are calculated using

$$A_{d,t} = (1 + \rho)G_{d,t} - (1 - \rho)N_{d,t}$$
 
$$P_{d,t} = \frac{e^{\beta A_{d,t}}}{\sum_{d \in D} e^{\beta A_{d,t}}}$$

# actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

- reward (float) The reward value
- **expectation** (*float*) The expected reward value

- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

### Returns

# Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

## Return type dict

# rewardExpectation(observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

#### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

### **Parameters**

- **delta** (*float*) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.8 model.OpALE module

# Author Dominic Hunt

**Reference** Based on the paper Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. Collins, A. G. E., & Frank, M. J. (2014). Psychological Review, 121(3), 337–66. doi:10.1037/a0037015

 $\textbf{class} \ \, \texttt{model.OpAle.OpAle} \, (alpha=0.3, \ epsilon=0.3, \ rho=0, \ alphaCrit=None, \ alphaGo=None, \\ alphaNogo=None, \ alphaGoDiff=None, \ alphaNogoDiff=None, \ alphaGoNogoDiff=None, \ expect=None, expectGo=None, **kwargs)$ 

Bases: model.modelTemplate.Model

The Opponent actor learning model

## Name

The name of the class used when recording what has been used.

Type string

# currAction

The current action chosen by the model. Used to pass participant action to model when fitting

# Type int

- alpha (float, optional) Learning rate parameter, used as either the
- alphaGoNogoDiff (float, optional) The difference between alphaGo and alphaNogo. Default is None. If not None will overwrite alphaNogo  $\alpha_N=\alpha_G-\alpha_\delta$
- alphaCrit (float, optional) The critic learning rate. Default is alpha
- alphaGo (float, optional) Learning rate parameter for Go, the positive part of the actor learning Default is alpha
- alphaNogo (float, optional) Learning rate parameter for Nogo, the negative part of the actor learning Default is alpha
- alphaGoDiff (float, optional) The difference between alphaCrit and alphaGo. The default is None If not None and alphaNogoDiff is also not None, it will overwrite the alphaGo parameter  $\alpha_G = \alpha_C + \alpha$
- alphaNogoDiff (float, optional) The difference between alphaCrit and alphaNogo. The default is None If not None and alphaGoDiff is also not None, it will overwrite the alphaNogo parameter  $\alpha_N=\alpha_C+\alpha$
- **epsilon** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\epsilon$  in the paper
- **rho** (float, optional) The asymmetry between the actor weights.  $\rho = \epsilon_G \epsilon = \epsilon_N + \epsilon$
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional)-
  - The initial maximum number of stimuli the model can expect to receive. Default
- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) / number\_critics
- expectGo (array of floats, optional) The initialisation of the the expected go and nogo. Default ones((number\_actions, number\_cues)) / number\_critics
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew

• **decFunc** (function, optional) – The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### **Notes**

Actor: The chosen action is updated with

$$\delta_{d,t} = r_t - E_{d,t}$$
$$E_{d,t+1} = E_{d,t} + \alpha_E \delta_{d,t}$$

Critic: The chosen action is updated with

$$G_{d,t+1} = G_{d,t} + \alpha_G G_{d,t} \delta_{d,t}$$
 
$$N_{d,t+1} = N_{d,t} - \alpha_N N_{d,t} \delta_{d,t}$$

Probabilities: The probabilities for all actions are calculated using

$$A_{d,t} = (1+\rho)G_{d,t} - (1-\rho)N_{d,t}$$
$$P_{d,t} = \frac{e^{\epsilon A_{d,t}}}{\sum_{d \in D} e^{\epsilon A_{d,t}}}$$

# actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

Return type 1D ndArray of floats

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

# Returns

Return type delta

# returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

## storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (*float*) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.9 model.OpALS module

Author Dominic Hunt

**Reference** Based on the paper Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. Collins, A. G. E., & Frank, M. J. (2014). Psychological Review, 121(3), 337–66. doi:10.1037/a0037015

class model.OpALS.OpALS (alpha=0.3, beta=4, rho=0, saturateVal=10, invBeta=None, alphaCrit=None, betaGo=None, betaNogo=None, alphaGoo=None, alphaNogo=None, alphaGoDiff=None, alphaNogoDiff=None, alphaGoNogoDiff=None, expect=None, expectGo=None, \*\*kwargs)

Bases: model.modelTemplate.Model

The Opponent actor learning model modified to have saturation values

The saturation values are the same for the actor and critic learners

### Name

The name of the class used when recording what has been used.

Type string

# currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

- alpha (float, optional) Learning rate parameter, used as either the
- alphaGoNogoDiff (float, optional) The difference between alphaGo and alphaNogo. Default is None. If not None will overwrite alphaNogo  $\alpha_N=\alpha_G-\alpha_\delta$
- alphaCrit (float, optional) The critic learning rate. Default is alpha
- alphaGo (float, optional) Learning rate parameter for Go, the positive part of the actor learning Default is alpha
- alphaNogo (float, optional) Learning rate parameter for Nogo, the negative part of the actor learning Default is alpha

- alphaGoDiff (float, optional) The difference between alphaCrit and alphaGo. The default is None If not None and alphaNogoDiff is also not None, it will overwrite the alphaGo parameter  $\alpha_G=\alpha_C+\alpha$
- alphaNogoDiff (float, optional) The difference between alphaCrit and alphaNogo. The default is None If not None and alphaGoDiff is also not None, it will overwrite the alphaNogo parameter  $\alpha_N = \alpha_C + \alpha$
- **beta** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\beta$  in the paper
- invBeta (float, optional) Inverse of sensitivity parameter for the probabilities. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- **rho** (float, optional) The asymmetry between the actor weights.  $\rho = \beta_G \beta = \beta_N + \beta$
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) / number\_critics
- expectGo (array of floats, optional) The initialisation of the the expected go and nogo. Default ones ((number\_actions, number\_cues)) / number\_critics
- saturateVal (float, optional) The saturation value for the model. Default is 10
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

# **Notes**

Actor: The chosen action is updated with

$$\delta_{d,t} = r_t - E_{d,t}$$
 
$$E_{d,t+1} = E_{d,t} + \alpha_E \delta_{d,t} \left(1 - \frac{E_{d,t}}{S}\right)$$

Critic: The chosen action is updated with

$$G_{d,t+1} = G_{d,t} + \alpha_G G_{d,t} \delta_{d,t} (1 - \frac{G_{d,t}}{S})$$
$$N_{d,t+1} = N_{d,t} - \alpha_N N_{d,t} \delta_{d,t} (1 - \frac{N_{d,t}}{S})$$

Probabilities: The probabilities for all actions are calculated using

$$A_{d,t} = (1+\rho)G_{d,t} - (1-\rho)N_{d,t}$$
$$P_{d,t} = \frac{e^{\beta A_{d,t}}}{\sum_{d \in D} e^{\beta A_{d,t}}}$$

## actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

**Return type** 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli({int | float | tuple | None}) The stimuli received

# Returns

Return type delta

# returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

## Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

#### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (list of bool) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.10 model.OpALSE module

Author Dominic Hunt

**Reference** Based on the paper Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. Collins, A. G. E., & Frank, M. J. (2014). Psychological Review, 121(3), 337–66. doi:10.1037/a0037015

```
class model.OpALSE.OpALSE (alpha=0.3, epsilon=0.3, rho=0, saturateVal=10, alphaCrit=None, alphaGo=None, alphaGoDiff=None, alphaGoDiff=None, alphaGoNogoDiff=None, expect=None, expectGo=None, **kwargs)
```

Bases: model.modelTemplate.Model

The Opponent actor learning model modified to have saturation values

The saturation values are the same for the actor and critic learners

### Name

The name of the class used when recording what has been used.

Type string

### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

- alpha (float, optional) Learning rate parameter, used as either the
- alphaGoNogoDiff (float, optional) The difference between alphaGo and alphaNogo. Default is None. If not None will overwrite alphaNogo  $\alpha_N=\alpha_G-\alpha_\delta$
- alphaCrit (float, optional) The critic learning rate. Default is alpha
- alphaGo (float, optional) Learning rate parameter for Go, the positive part of the actor learning Default is alpha
- alphaNogo (float, optional) Learning rate parameter for Nogo, the negative part of the actor learning Default is alpha
- alphaGoDiff (float, optional) The difference between alphaCrit and alphaGo. The default is None If not None and alphaNogoDiff is also not None, it will overwrite the alphaGo parameter  $\alpha_G = \alpha_C + \alpha$
- alphaNogoDiff (float, optional) The difference between alphaCrit and alphaNogo. The default is None If not None and alphaGoDiff is also not None, it will overwrite the alphaNogo parameter  $\alpha_N=\alpha_C+\alpha$

- **epsilon** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\epsilon$  in the paper
- **rho** (float, optional) The asymmetry between the actor weights.  $\rho = \epsilon_G \epsilon = \epsilon_N + \epsilon$
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) / number\_critics
- expectGo (array of floats, optional) The initialisation of the the expected go and nogo. Default ones ((number\_actions, number\_cues)) / number\_critics
- saturateVal (float, optional) The saturation value for the model. Default is 10
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- decFunc (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### **Notes**

Actor: The chosen action is updated with

$$\delta_{d,t} = r_t - E_{d,t}$$
 
$$E_{d,t+1} = E_{d,t} + \alpha_E \delta_{d,t} \left(1 - \frac{E_{d,t}}{S}\right)$$

Critic: The chosen action is updated with

$$G_{d,t+1} = G_{d,t} + \alpha_G G_{d,t} \delta_{d,t} (1 - \frac{G_{d,t}}{S})$$
$$N_{d,t+1} = N_{d,t} - \alpha_N N_{d,t} \delta_{d,t} (1 - \frac{N_{d,t}}{S})$$

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Probabilities: The probabilities for all actions are calculated using

$$A_{d,t} = (1+\rho)G_{d,t} - (1-\rho)N_{d,t}$$
 
$$P_{d,t} = \frac{e^{\epsilon A_{d,t}}}{\sum_{d \in D} e^{\epsilon A_{d,t}}}$$

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the actionValues

Return type 1D ndArray of floats

# delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- **stimuli**({int | float | tuple | None}) The stimuli received

# Returns

Return type delta

# returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation(observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

## Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

### **Parameters**

• **delta** (float) – The difference between the reward and the expected reward

- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.11 model.OpAL\_H module

### Author Dominic Hunt

**Reference** Based on the paper Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. Collins, A. G. E., & Frank, M. J. (2014). Psychological Review, 121(3), 337–66. doi:10.1037/a0037015

class model.OpAL\_H.OpAL\_H (alpha=0.3, beta=4, rho=0, invBeta=None, alphaCrit=None, betaGo=None, betaNogo=None, alphaGo=None, alphaGoone, alphaGoone, alphaGoone, alphaGoone, alphaGoone, alphaGoone, alphaGoone, iff=None, expect=None, expectGo=None, \*\*kwargs)

Bases: model.modelTemplate.Model

The Opponent actor learning model without Hebbian learning

### Name

The name of the class used when recording what has been used.

Type string

## currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

- alpha (float, optional) Learning rate parameter, used as either the
- alphaGoNogoDiff (float, optional) The difference between alphaGo and alphaNogo. Default is None. If not None will overwrite alphaNogo  $\alpha_N=\alpha_G-\alpha_\delta$
- alphaCrit (float, optional) The critic learning rate. Default is alpha
- alphaGo (float, optional) Learning rate parameter for Go, the positive part of the actor learning Default is alpha
- alphaNogo (float, optional) Learning rate parameter for Nogo, the negative part of the actor learning Default is alpha
- alphaGoDiff (float, optional) The difference between alphaCrit and alphaGo. The default is None If not None and alphaNogoDiff is also not None, it will overwrite the alphaGo parameter  $\alpha_G=\alpha_C+\alpha$
- alphaNogoDiff (float, optional) The difference between alphaCrit and alphaNogo. The default is None If not None and alphaGoDiff is also not None, it will overwrite the alphaNogo parameter  $\alpha_N=\alpha_C+\alpha$
- **beta** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\beta$  in the paper
- invBeta (float, optional) Inverse of sensitivity parameter for the probabilities. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- **rho** (float, optional) The asymmetry between the actor weights.  $\rho = \beta_G \beta = \beta_N + \beta$
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.

• number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) / number\_critics
- expectGo (array of floats, optional) The initialisation of the expected go and nogo. Default ones ((number\_actions, number\_cues)) / number\_critics
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

# Notes

Actor: The chosen action is updated with

$$\delta_{d,t} = r_t - E_{d,t}$$

$$E_{d,t+1} = E_{d,t} + \alpha_E \delta_{d,t}$$

Critic: The chosen action is updated with

$$G_{d,t+1} = G_{d,t} + \alpha_G \delta_{d,t}$$
$$N_{d,t+1} = N_{d,t} - \alpha_N \delta_{d,t}$$

Probabilities: The probabilities for all actions are calculated using

$$A_{d,t} = (1 + \rho)G_{d,t} - (1 - \rho)N_{d,t}$$
 
$$P_{d,t} = \frac{e^{\beta A_{d,t}}}{\sum_{d \in D} e^{\beta A_{d,t}}}$$

# actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the actionValues

**Return type** 1D ndArray of floats

delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

## Returns

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation(observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

## **Returns**

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

## storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

# **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.12 model.OpAL HE module

Author Dominic Hunt

**Reference** Based on the paper Opponent actor learning (OpAL): Modeling interactive effects of striatal dopamine on reinforcement learning and choice incentive. Collins, A. G. E., & Frank, M. J. (2014). Psychological Review, 121(3), 337–66. doi:10.1037/a0037015

class model.Opal\_He.Opal\_He (alpha=0.3, epsilon=0.3, rho=0, alphaCrit=None, alphaGo=None, alphaNogo=None, alphaGoDiff=None, alphaNogoDiff=None, expect=None, expect=None, expectGo=None, \*\*kwargs)

Bases: model.modelTemplate.Model

The Opponent actor learning model without Hebbian learning

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- alpha (float, optional) Learning rate parameter, used as either the
- alphaGoNogoDiff (float, optional) The difference between alphaGo and alphaNogo. Default is None. If not None will overwrite alphaNogo  $\alpha_N=\alpha_G-\alpha_\delta$
- alphaCrit (float, optional) The critic learning rate. Default is alpha
- alphaGo (float, optional) Learning rate parameter for Go, the positive part of the actor learning Default is alpha
- alphaNogo (float, optional) Learning rate parameter for Nogo, the negative part of the actor learning Default is alpha
- alphaGoDiff (float, optional) The difference between alphaCrit and alphaGo. The default is None If not None and alphaNogoDiff is also not None, it will overwrite the alphaGo parameter  $\alpha_G=\alpha_C+\alpha$
- alphaNogoDiff (float, optional) The difference between alphaCrit and alphaNogo. The default is None If not None and alphaGoDiff is also not None, it will overwrite the alphaNogo parameter  $\alpha_N=\alpha_C+\alpha$
- **epsilon** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\epsilon$  in the paper
- rho (float, optional) The asymmetry between the actor weights.  $\rho=\epsilon_G-\epsilon=\epsilon_N+\epsilon$
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)

- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) / number\_critics
- expectGo (array of floats, optional) The initialisation of the the expected go and nogo. Default ones ((number\_actions, number\_cues)) / number\_critics
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

# **Notes**

Actor: The chosen action is updated with

$$\delta_{d,t} = r_t - E_{d,t}$$
$$E_{d,t+1} = E_{d,t} + \alpha_E \delta_{d,t}$$

Critic: The chosen action is updated with

$$G_{d,t+1} = G_{d,t} + \alpha_G \delta_{d,t}$$
$$N_{d,t+1} = N_{d,t} - \alpha_N \delta_{d,t}$$

Probabilities: The probabilities for all actions are calculated using

$$A_{d,t} = (1+\rho)G_{d,t} - (1-\rho)N_{d,t}$$
 
$$P_{d,t} = \frac{e^{\epsilon A_{d,t}}}{\sum_{d \in D} e^{\epsilon A_{d,t}}}$$

## actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

# calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray - The probabilities associated with the actionValues

Return type 1D ndArray of floats

 ${\tt delta}\ (\textit{reward}, \textit{expectation}, \textit{action}, \textit{stimuli})$ 

Calculates the comparison between the reward and the expectation

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

### **Returns**

Return type delta

# returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

# Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

 $\textbf{Parameters observation} \ (\{\textit{int | float | tuple}\}) - The \ set \ of \ stimuli$ 

# Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

# **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list* of *bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.13 model.modelTemplate module

# model.modelTemplate Module

Author Dominic Hunt

# **Classes**

Mode1([number_actions, number_cues,])	The model class is a general template for a model.
Rewards(**kwargs)	This acts as an interface between the feedback from a
	task and the feedback a model can process
Stimulus(**kwargs)	Stimulus processor class.

# Model

```
class model.modelTemplate.Model(number actions=2,
                                                                  number cues=1,
                                                                                        num-
                                         ber_critics=None,
                                                                           action_codes=None,
                                         non_action=u'None',
                                                                    prior=None,
                                                                                       stimu-
                                          lus_shaper=None,
                                                                  stimulus_shaper_name=None,
                                         stimulus_shaper_properties=None,
                                                                                          re-
                                                                   reward_shaper_name=None,
                                         ward_shaper=None,
                                         reward_shaper_properties=None,
                                                                                         deci-
                                         sion_function=None,
                                                                 decision_function_name=None,
                                         decision_function_properties=None, **kwargs)
```

Bases: object

The model class is a general template for a model. It also contains universal methods used by all models.

### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- prior (array of floats in [0,1], optional) The prior probability of of the states being the correct one. Default ones((self.number\_actions, self.number\_cues)) / self.number\_critics)
- **stimulus\_shaper\_name** (*string*, *optional*) The name of the function that transforms the stimulus into a form the model can understand and a string to identify it later. stimulus\_shaper takes priority
- reward\_shaper\_name (string, optional) The name of the function that transforms the reward into a form the model can understand. rewards\_shaper takes priority
- decision\_function\_name (string, optional) The name of the function that takes the internal values of the model and turns them in to a decision. decision function takes priority
- **stimulus\_shaper** (Stimulus class, optional) The class that transforms the stimulus into a form the model can understand and a string to identify it later. Default is Stimulus
- reward\_shaper (Rewards class, optional) The class that transforms the reward into a form the model can understand. Default is Rewards

- decision\_function (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is weightProb(range(number\_actions))
- **stimulus\_shaper\_properties** (*list*, optional) The valid parameters of the function. Used to filter the unlisted keyword arguments Default is None
- reward\_shaper\_properties (list, optional) The valid parameters of the function. Used to filter the unlisted keyword arguments Default is None
- decision\_function\_properties (list, optional) The valid parameters of the function. Used to filter the unlisted keyword arguments Default is None

# **Methods Summary**

actStimMerge(actStimuliParam[, stimFilter])	Takes the parameter to be merged by stimuli and
actstimmerge(acisumumraramį, stimfilterį)	filters it by the stimuli values
action()	Returns the action of the model
actorStimulusProbs()	Calculates in the model-appropriate way the probability of each action.
calcProbabilities(actionValues)	Calculate the probabilities associated with the action
choiceReflection()	Allows the model to update its state once an action has been chosen.
chooseAction(probabilities, lastAction,)	Chooses the next action and returns the associated probabilities
delta(reward, expectation, action, stimuli)	Calculates the comparison between the reward and the expectation
feedback(response)	Receives the reaction to the action and processes it
get_name()	
lastChoiceReinforcement()	Allows the model to update the reward expectation for the previous trialstep given the choice made in this trialstep
observe(state)	Receives the latest observation and decides what to do with it
overrideActionChoice(action)	Provides a method for overriding the model action choice.
params()	Returns the parameters of the model
<pre>processEvent([action, response])</pre>	Integrates the information from a stimulus, action, response set, regardless of which of the three elements are present.
returnTaskState()	Returns all the relevant data for this model
rewardExpectation(stimuli)	Calculate the expected reward for each action based on the stimuli
setsimID(simID)	
,	param simID
standardResultOutput()	Returns the relevant data expected from a model as well as the parameters for the current model
storeStandardResults()	Updates the store of standard results found across models
storeState()	Stores the state of all the important variables so that they can be accessed later
	Continued on next page

# Table 16 – continued from previous page

updateModel(delta, action, stimuli, ...)

**param delta** The difference between the reward and the expected reward

### **Methods Documentation**

# actStimMerge (actStimuliParam, stimFilter=1)

Takes the parameter to be merged by stimuli and filters it by the stimuli values

### **Parameters**

• actStimuliParam(list of floats)-

The list of values representing each action stimuli pair, where the stimuli will have their filtered values merged together.

• **stimFilter** (array of floats or a float, optional) – The list of active stimuli with their weightings or one weight for all. Default 1

Returns actionParams – The parameter values associated with each action

Return type list of floats

### action()

Returns the action of the model

### Returns action

Return type integer or None

### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the action

```
Parameters actionValues (1D ndArray of floats) -
```

Returns probArray – The probabilities associated with the actionValues

**Return type** 1D ndArray of floats

# choiceReflection()

Allows the model to update its state once an action has been chosen.

# chooseAction (probabilities, lastAction, events, validActions)

Chooses the next action and returns the associated probabilities

# **Parameters**

- probabilities (list of floats) The probabilities associated with each combinations
- lastAction (int) The last chosen action
- **events** (list of floats) The stimuli. If probActions is True then this will be unused as the probabilities will already be
- validActions (1D list or array) The actions permitted during this trialstep

# Returns

• **newAction** (*int*) – The chosen action

• **decProbabilities** (*list of floats*) – The weights for the different actions

### delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

### **Returns**

# Return type delta

# feedback (response)

Receives the reaction to the action and processes it

**Parameters response** (float) – The response from the task after an action. Returns without doing anything if the value of response is *None*.

# classmethod get\_name()

# lastChoiceReinforcement()

Allows the model to update the reward expectation for the previous trialstep given the choice made in this trialstep

#### observe (state)

Receives the latest observation and decides what to do with it

There are five possible states: Observation Observation Action Observation Action Feedback Action Feedback Observation Feedback

**Parameters state** (tuple of ({int | float | tuple}, {tuple of int | None})) – The stimulus from the task followed by the tuple of valid actions. Passes the values onto a processing function, self.\_updateObservation".

## overrideActionChoice (action)

Provides a method for overriding the model action choice. This is used when fitting models to participant actions.

**Parameters action** (*int*) – Action chosen by external source to same situation

### params()

Returns the parameters of the model

# **Returns parameters**

Return type dictionary

# processEvent (action=None, response=None)

Integrates the information from a stimulus, action, response set, regardless of which of the three elements are present.

# **Parameters**

- stimuli ({int | float | tuple | None}) The stimuli received
- action (int, optional) The chosen action of the model. Default None
- response (float, optional) The response from the task after an action.

  Default None

### returnTaskState()

Returns all the relevant data for this model

## Returns results

# Return type dictionary

## rewardExpectation (stimuli)

Calculate the expected reward for each action based on the stimuli

This contains parts that are task dependent

Parameters stimuli ({int | float | tuple}) - The set of stimuli

### Returns

- expectedRewards (float) The expected reward for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

setsimID (simID)

Parameters simID (float) -

## standardResultOutput()

Returns the relevant data expected from a model as well as the parameters for the current model

Returns results - A dictionary of details about the

Return type dictionary

### storeStandardResults()

Updates the store of standard results found across models

# storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

### **Parameters**

- **delta** (*float*) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# **Rewards**

```
class model.modelTemplate.Rewards(**kwargs)
    Bases: object
```

This acts as an interface between the feedback from a task and the feedback a model can process

### Name

The identifier of the function

Type string

# **Methods Summary**

details()	
get_name()	
processFeedback(feedback, lastAction, stim-	Takes the feedback and turns it into a form to be
uli)	processed by the model

# **Methods Documentation**

```
details()
classmethod get_name()
processFeedback (feedback, lastAction, stimuli)
```

Takes the feedback and turns it into a form to be processed by the model

# **Parameters**

- feedback -
- lastAction -
- stimuli -

### Returns

Return type modelFeedback

# **Stimulus**

```
class model.modelTemplate.Stimulus(**kwargs)
    Bases: object
```

Stimulus processor class. This acts as an interface between an observation and . Does nothing.

### Name

The identifier of the function

Type string

# **Methods Summary**

details()	
get_name()	
processStimulus(observation)	Takes the observation and turns it into a form the
	model can use

# **Methods Documentation**

```
details()
classmethod get_name()
processStimulus (observation)
    Takes the observation and turns it into a form the model can use
```

Parameters observation -

# Returns

- **stimuliPresent** (*int or list of int*)
- stimuliActivity (float or list of float)

# **Class Inheritance Diagram**

Author Dominic Hunt

```
class model.modelTemplate.Model(number_actions=2,
                                                                  number\_cues=1,
                                                                                        num-
                                                                          action\_codes=None,
                                         ber_critics=None,
                                         non_action=u'None',
                                                                    prior=None,
                                                                                       stimu-
                                         lus_shaper=None,
                                                                  stimulus_shaper_name=None,
                                         stimulus_shaper_properties=None,
                                         ward shaper=None,
                                                                   reward_shaper_name=None,
                                         reward shaper properties=None,
                                                                                        deci-
                                         sion function=None,
                                                                 decision function name=None,
                                         decision_function_properties=None, **kwargs)
```

Bases: object

The model class is a general template for a model. It also contains universal methods used by all models.

#### Name

The name of the class used when recording what has been used.

Type string

### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0,1], optional) The prior probability of of the states being the correct one. Default ones((self.number\_actions, self.number\_cues)) / self.number\_critics)
- **stimulus\_shaper\_name** (*string*, *optional*) The name of the function that transforms the stimulus into a form the model can understand and a string to identify it later. stimulus\_shaper takes priority
- reward\_shaper\_name (string, optional) The name of the function that transforms the reward into a form the model can understand. rewards\_shaper takes priority
- decision\_function\_name (string, optional) The name of the function that takes the internal values of the model and turns them in to a decision. decision function takes priority
- **stimulus\_shaper** (*Stimulus class*, *optional*) The class that transforms the stimulus into a form the model can understand and a string to identify it later. Default is Stimulus
- reward\_shaper (Rewards class, optional) The class that transforms the reward into a form the model can understand. Default is Rewards
- **decision\_function** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is weightProb(range(number\_actions))

- stimulus\_shaper\_properties (list, optional) The valid parameters of the function. Used to filter the unlisted keyword arguments Default is None
- reward\_shaper\_properties (list, optional) The valid parameters of the function. Used to filter the unlisted keyword arguments Default is None
- decision\_function\_properties (list, optional) The valid parameters of the function. Used to filter the unlisted keyword arguments Default is None

### actStimMerge (actStimuliParam, stimFilter=1)

Takes the parameter to be merged by stimuli and filters it by the stimuli values

#### **Parameters**

• actStimuliParam(list of floats)-

The list of values representing each action stimuli pair, where the stimuli will have their filtered values merged together.

• **stimFilter** (array of floats or a float, optional) – The list of active stimuli with their weightings or one weight for all. Default 1

Returns actionParams – The parameter values associated with each action

Return type list of floats

#### action()

Returns the action of the model

**Returns action** 

Return type integer or None

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the action

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

# choiceReflection()

Allows the model to update its state once an action has been chosen.

chooseAction (probabilities, lastAction, events, validActions)

Chooses the next action and returns the associated probabilities

# **Parameters**

- **probabilities** (*list of floats*) The probabilities associated with each combinations
- lastAction (int) The last chosen action
- **events** (*list of floats*) The stimuli. If probActions is True then this will be unused as the probabilities will already be
- validActions (1D list or array) The actions permitted during this trialstep

## Returns

• **newAction** (*int*) – The chosen action

• **decProbabilities** (*list of floats*) – The weights for the different actions

### delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

### **Returns**

# Return type delta

### feedback (response)

Receives the reaction to the action and processes it

**Parameters response** (float) – The response from the task after an action. Returns without doing anything if the value of response is *None*.

# classmethod get\_name()

# lastChoiceReinforcement()

Allows the model to update the reward expectation for the previous trialstep given the choice made in this trialstep

### observe (state)

Receives the latest observation and decides what to do with it

There are five possible states: Observation Observation Action Observation Action Feedback Action Feedback Observation Feedback

**Parameters state** (tuple of ({int | float | tuple}, {tuple of int | None})) – The stimulus from the task followed by the tuple of valid actions. Passes the values onto a processing function, self.\_updateObservation".

## overrideActionChoice (action)

Provides a method for overriding the model action choice. This is used when fitting models to participant actions.

**Parameters action** (*int*) – Action chosen by external source to same situation

### params()

Returns the parameters of the model

# **Returns parameters**

Return type dictionary

# processEvent (action=None, response=None)

Integrates the information from a stimulus, action, response set, regardless of which of the three elements are present.

# **Parameters**

- **stimuli**({int | float | tuple | None}) The stimuli received
- action (int, optional) The chosen action of the model. Default None
- response (float, optional) The response from the task after an action.

  Default None

### returnTaskState()

Returns all the relevant data for this model

## Returns results

# Return type dictionary

## rewardExpectation (stimuli)

Calculate the expected reward for each action based on the stimuli

This contains parts that are task dependent

```
Parameters stimuli ({int | float | tuple}) - The set of stimuli
```

#### Returns

- expectedRewards (float) The expected reward for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

```
setsimID (simID)
```

```
Parameters simID (float) -
```

## standardResultOutput()

Returns the relevant data expected from a model as well as the parameters for the current model

Returns results – A dictionary of details about the

Return type dictionary

### storeStandardResults()

Updates the store of standard results found across models

## storeState()

Stores the state of all the important variables so that they can be accessed later

 ${\tt updateModel}\ (\textit{delta}, \textit{action}, \textit{stimuli}, \textit{stimuliFilter})$ 

### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

```
class model.modelTemplate.Rewards(**kwargs)
```

```
Bases: object
```

This acts as an interface between the feedback from a task and the feedback a model can process

# Name

The identifier of the function

```
Type string
```

```
details()
```

```
classmethod get_name()
```

```
processFeedback (feedback, lastAction, stimuli)
```

Takes the feedback and turns it into a form to be processed by the model

### **Parameters**

- feedback -
- lastAction -
- stimuli -

# Returns

## Return type modelFeedback

```
class model.modelTemplate.Stimulus(**kwargs)
    Bases: object
```

Stimulus processor class. This acts as an interface between an observation and . Does nothing.

#### Name

The identifier of the function

Type string

details()

classmethod get\_name()

processStimulus(observation)

Takes the observation and turns it into a form the model can use

Parameters observation -

#### Returns

- **stimuliPresent** (*int or list of int*)
- stimuliActivity (float or list of float)

## 6.7.2.14 model.qLearn module

Author Dominic Hunt

**Reference** Based on the paper Regulatory fit effects in a choice task Worthy, D. a, Maddox, W. T., & Markman, A. B. (2007). Psychonomic Bulletin & Review, 14(6), 1125–32. Retrieved from <a href="http://www.ncbi.nlm.nih.gov/pubmed/18229485">http://www.ncbi.nlm.nih.gov/pubmed/18229485</a>

class model.qLearn.QLearn (alpha=0.3, beta=4, invBeta=None, expect=None, \*\*kwargs)
Bases: model.modelTemplate.Model

The q-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- alpha (float, optional) Learning rate parameter
- **beta** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\beta$  in the paper
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

• number\_critics (integer, optional) - The number of different reaction learning sets. Default number\_actions\*number\_cues

- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

#### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the actionValues

**Return type** 1D ndArray of floats

# ${\tt delta}\ ({\it reward}, {\it expectation}, {\it action}, {\it stimuli})$

Calculates the comparison between the reward and the expectation

## **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

**Parameters observation** ({int | float | tuple}) - The set of stimuli

#### **Returns**

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list* of *bool*) A list describing if a stimulus cue is present in this trialstep

## 6.7.2.15 model.qLearn2 module

#### **Author** Dominic Hunt

**Reference** Modified version of that found in the paper The role of the ventromedial prefrontal cortex in abstract state-based inference during decision making in humans. Hampton, A. N., Bossaerts, P., & O'Doherty, J. P. (2006). The Journal of Neuroscience: The Official Journal of the Society for Neuroscience, 26(32), 8360–7. doi:10.1523/JNEUROSCI.1010-06.2006

**Notes** In the original paper this model used the Luce choice algorithm, rather than the logistic algorithm used here. This generalisation has meant that the variable nu is no longer possible to

Bases: model.modelTemplate.Model

The q-Learning algorithm modified to have different positive and negative reward prediction errors

### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

- alpha (float, optional) Learning rate parameter. For this model only used when setting alphaPos and alphaNeg to the same value. Default 0.3
- alphaPos (float, optional) The positive learning rate parameter. Used when RPE is positive. Default is alpha
- alphaNeg (float, optional) The negative learning rate parameter. Used when RPE is negative. Default is alpha
- beta (float, optional) Sensitivity parameter for probabilities
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2

- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

## See also:

model.QLearn This model is heavily based on that one

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

**Return type** 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

**Return type** 1D ndArray of floats

### delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- **stimuli** ({int | float | tuple | None}) The stimuli received

#### **Returns**

#### Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

#### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.16 model.qLearn2E module

Author Dominic Hunt

**Reference** Modified version of that found in the paper The role of the ventromedial prefrontal cortex in abstract state-based inference during decision making in humans. Hampton, A. N., Bossaerts, P., & O'Doherty, J. P. (2006). The Journal of Neuroscience: The Official Journal of the Society for Neuroscience, 26(32), 8360–7. doi:10.1523/JNEUROSCI.1010-06.2006

**Notes** In the original paper this model used the Luce choice algorithm, rather than the logistic algorithm used here. This generalisation has meant that the variable nu is no longer possible to use.

Bases: model.modelTemplate.Model

The q-Learning algorithm modified to have different positive and negative reward prediction errors and use the Epsylon greedy method for claculating probabilities

### Name

The name of the class used when recording what has been used.

Type string

## currAction

The current action chosen by the model. Used to pass participant action to model when fitting

#### Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter. For this model only used when setting alphaPos and alphaNeg to the same value. Default 0.3
- alphaPos (float, optional) The positive learning rate parameter. Used when RPE is positive. Default is alpha
- alphaNeg (float, optional) The negative learning rate parameter. Used when RPE is negative. Default is alpha
- **epsilon** (*float*, *optional*) Noise parameter. The larger it is the less likely the model is to choose the highest expected reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### See also:

model.QLearn This model is heavily based on that one

### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

**Return type** 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

### Return type 1D ndArray of floats

#### delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### **Returns**

## Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

## Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (*float*) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- stimuli (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

### 6.7.2.17 model.qLearnCorr module

### **Author** Dominic Hunt

**Reference** Based on the QLearn model and the choice autocorrelation equation in the paper Trial-bytrial data analysis using computational models. Daw, N. D. (2011). Decision Making, Affect, and Learning: Attention and Performance XXIII (pp. 3–38). http://doi.org/10.1093/acprof: oso/9780199600434.003.0001

Bases: model.modelTemplate.Model

The q-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- beta (float, optional) Sensitivity parameter for probabilities
- **kappa** (*float*, *optional*) The autocorelation parameter for which positive values promote sticking and negative values promote alternation
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

## See also:

model.QLearn This model is heavily based on that one

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

## delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- delta(float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

## 6.7.2.18 model.qLearnE module

Author Dominic Hunt

**Reference** Based on the Epsilon-greedy method along with a past choice autocorrelation inspired by QLearnCorr

class model.qLearnE.QLearnE (alpha=0.3, epsilon=0.1, expect=None, \*\*kwargs)
Bases: model.modelTemplate.Model

The q-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- **epsilon** (*float*, *optional*) Noise parameter. The larger it is the less likely the model is to choose the highest expected reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### See also:

model.QLearn This model is heavily based on that one

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

**Return type** 1D ndArray of floats

### delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- delta(float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

### 6.7.2.19 model.qLearnECorr module

Author Dominic Hunt

**Reference** Based on the Epsilon-greedy method along with a past choice autocorrelation inspired by QLearnCorr

Bases: model.modelTemplate.Model

The q-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- **kappa** (*float*, *optional*) The autocorrelation parameter for which positive values promote sticking and negative values promote alternation
- **epsilon** (*float*, *optional*) Noise parameter. The larger it is the less likely the model is to choose the highest expected reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### See also:

model.QLearnCorr This model is heavily based on that one

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

**Return type** 1D ndArray of floats

#### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

## rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

## Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

 ${\tt updateModel}\ (\textit{delta}, \textit{action}, \textit{stimuli}, \textit{stimuliFilter})$ 

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- stimuli (list of float) The weights of the different stimuli in this trialstep

• **stimuliFilter** (*list of bool*) – A list describing if a stimulus cue is present in this trialstep

## 6.7.2.20 model.qLearnF module

Author Dominic Hunt

**Reference** Based on the paper Regulatory fit effects in a choice task Worthy, D. a, Maddox, W. T., & Markman, A. B. (2007). Psychonomic Bulletin & Review, 14(6), 1125–32. Retrieved from <a href="http://www.ncbi.nlm.nih.gov/pubmed/18229485">http://www.ncbi.nlm.nih.gov/pubmed/18229485</a>

Bases: model.modelTemplate.Model

The q-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- beta (float, optional) Sensitivity parameter for probabilities
- gamma (float, optional) future expectation discounting
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew

• **decFunc** (function, optional) – The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### See also:

model.QLearn This model is heavily based on that one

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

**Return type** 1D ndArray of floats

#### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

## delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- expectation (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

## Returns

Return type delta

### lastChoiceReinforcement()

Allows the model to update its expectations once the action has been chosen.

## returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

## 6.7.2.21 model.qLearnK module

Author Dominic Hunt

**Reference** Based on the paper Cortical substrates for exploratory decisions in humans. Daw, N. D., O'Doherty, J. P., Dayan, P., Dolan, R. J., & Seymour, B. (2006). Nature, 441(7095), 876–9. https://doi.org/10.1038/nature04766

Bases: model.modelTemplate.Model

The q-Learning Kalman algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- sigma (float, optional) Uncertainty scale measure
- **sigmaG** (float, optional) Uncertainty measure growth
- drift (float, optional) The drift rate
- **beta** (float, optional) Sensitivity parameter for probabilities. Also known as an exploration- exploitation parameter. Defined as  $\beta$  in the paper
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)

- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- sigmaA (array of floats, optional) The initialisation of the uncertainty measure
- alphaA (array of floats, optional) The initialisation of the learning rates
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray - The probabilities associated with the actionValues

Return type 1D ndArray of floats

## delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

## **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- **stimuli** ({int | float | tuple | None}) The stimuli received

### Returns

Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

## rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

# Returns

• actionExpectations (array of floats) – The expected rewards for each action

- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

#### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

# 6.7.2.22 model.qLearnMeta module

Author Dominic Hunt

**Reference** Based on the model QLearn as well as the paper: Meta-learning in Reinforcement Learning

 $\verb| class model.qLearnMeta.QLearnMeta| (alpha=0.3, tau=0.2, rewardD=None, rewardDD=None, expect=None, **kwargs) |$ 

Bases: model.modelTemplate.Model

The q-Learning algorithm with a second-order adaptive beta

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- alpha (float, optional) Learning rate parameter
- tau (float, optional) Beta rate Sensitivity parameter for probabilities
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.

- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model decision. binary.eta

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities - The probabilities associated with the action choices

Return type 1D ndArray of floats

#### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

**Return type** 1D ndArray of floats

### delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

# Returns

Return type delta

## returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations

• activeStimuli (list of [0, 1] mapping to [False, True]) – A list of the stimuli that were or were not present

#### storeState()

Stores the state of all the important variables so that they can be accessed later

updateBeta(reward, action)

**Parameters** reward (float) - The reward value

updateModel (delta, action, stimuli, stimuliFilter)

#### **Parameters**

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (list of bool) A list describing if a stimulus cue is present in this trialstep

### 6.7.2.23 model.randomBias module

#### Author Dominic Hunt

class model.randomBias.RandomBias(expect=None, \*\*kwargs)

Bases: model.modelTemplate.Model

A model replicating a participant who chooses randomly, but with a bias towards certain actions

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

## **Parameters**

- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

### Return type 1D ndArray of floats

#### calcProbabilities()

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

Returns probArray – The probabilities associated with the action Values

**Return type** 1D ndArray of floats

## delta (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

### Returns

# Return type delta

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

### Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

## Returns

- actionExpectations (array of floats) The expected rewards for each action
- **stimuli** (*list of floats*) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- **delta** (float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- stimuli (list of float) The weights of the different stimuli in this trialstep
- $stimuliFilter(list\ of\ bool) A$  list describing if a stimulus cue is present in this trialstep

### 6.7.2.24 model.td0 module

Author Dominic Hunt

Reference Based on the description on p134-135 of Reinforcement Learning, Sutton & Barto 1998

class model.td0.TD0 (alpha=0.3, beta=4, gamma=0.3, invBeta=None, expect=None, \*\*kwargs)
Bases: model.modelTemplate.Model

The td-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

### **Parameters**

- alpha (float, optional) Learning rate parameter
- beta (float, optional) Sensitivity parameter for probabilities
- gamma (float, optional) future expectation discounting
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

Returns probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

Parameters actionValues (1D ndArray of floats) -

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

#### **delta** (reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (float) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

#### lastChoiceReinforcement()

Allows the model to update its expectations once the action has been chosen.

#### returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- delta(float) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep
- **stimuliFilter** (*list of bool*) A list describing if a stimulus cue is present in this trialstep

### 6.7.2.25 model.tdE module

Author Dominic Hunt

Reference Based on the description on p134-135 of Reinforcement Learning, Sutton & Barto 1998

class model.tdE.TDE (alpha=0.3, epsilon=0.1, gamma=0.3, expect=None, \*\*kwargs)
 Bases: model.modelTemplate.Model

The td-Learning algorithm

### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- epsilon (float, optional) Sensitivity parameter for probabilities
- gamma (float, optional) future expectation discounting
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

#### See also:

model. TDO This model is heavily based on that one

#### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

```
Parameters actionValues (1D ndArray of floats) -
```

**Returns** probArray – The probabilities associated with the action Values

Return type 1D ndArray of floats

## delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

#### lastChoiceReinforcement()

Allows the model to update its expectations once the action has been chosen.

## returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

# $\verb"rewardExpectation" (observation")$

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- **delta** (*float*) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep

• **stimuliFilter** (*list of bool*) – A list describing if a stimulus cue is present in this trialstep

### 6.7.2.26 model.tdr module

### **Author** Dominic Hunt

Bases: model.modelTemplate.Model

The td-Learning algorithm

#### Name

The name of the class used when recording what has been used.

Type string

#### currAction

The current action chosen by the model. Used to pass participant action to model when fitting

Type int

#### **Parameters**

- alpha (float, optional) Learning rate parameter
- beta (float, optional) Sensitivity parameter for probabilities
- invBeta (float, optional) Inverse of sensitivity parameter. Defined as  $\frac{1}{\beta+1}$ . Default 0.2
- tau (float, optional) Learning rate for average reward
- number\_actions (integer, optional) The maximum number of valid actions the model can expect to receive. Default 2.
- number\_cues (integer, optional) -

The initial maximum number of stimuli the model can expect to receive. Default 1.

- number\_critics (integer, optional) The number of different reaction learning sets. Default number\_actions\*number\_cues
- action\_codes (dict with string or int as keys and int values, optional) A dictionary used to convert between the action references used by the task or dataset and references used in the models to describe the order in which the action information is stored.
- **prior** (array of floats in [0, 1], optional) The prior probability of of the states being the correct one. Default ones ((number\_actions, number\_cues)) / number\_critics)
- expect (array of floats, optional) The initialisation of the expected reward. Default ones((number\_actions, number\_cues)) \* 5 / number\_cues
- **stimFunc** (function, optional) The function that transforms the stimulus into a form the model can understand and a string to identify it later. Default is blankStim
- rewFunc (function, optional) The function that transforms the reward into a form the model can understand. Default is blankRew
- **decFunc** (function, optional) The function that takes the internal values of the model and turns them in to a decision. Default is model.decision.discrete.weightProb

### actorStimulusProbs()

Calculates in the model-appropriate way the probability of each action.

**Returns** probabilities – The probabilities associated with the action choices

Return type 1D ndArray of floats

### calcProbabilities (actionValues)

Calculate the probabilities associated with the actions

```
Parameters actionValues (1D ndArray of floats) -
```

**Returns** probArray – The probabilities associated with the action Values

**Return type** 1D ndArray of floats

## delta(reward, expectation, action, stimuli)

Calculates the comparison between the reward and the expectation

#### **Parameters**

- reward (float) The reward value
- **expectation** (*float*) The expected reward value
- action (int) The chosen action
- stimuli ({int | float | tuple | None}) The stimuli received

#### Returns

Return type delta

#### lastChoiceReinforcement()

Allows the model to update its expectations once the action has been chosen.

## returnTaskState()

Returns all the relevant data for this model

**Returns results** – The dictionary contains a series of keys including Name, Probabilities, Actions and Events.

Return type dict

#### rewardExpectation (observation)

Calculate the estimated reward based on the action and stimuli

This contains parts that are task dependent

Parameters observation ({int | float | tuple}) - The set of stimuli

#### Returns

- actionExpectations (array of floats) The expected rewards for each action
- stimuli (list of floats) The processed observations
- activeStimuli (list of [0, 1] mapping to [False, True]) A list of the stimuli that were or were not present

### storeState()

Stores the state of all the important variables so that they can be accessed later

updateModel (delta, action, stimuli, stimuliFilter)

- **delta** (*float*) The difference between the reward and the expected reward
- action (int) The action chosen by the model in this trialstep
- **stimuli** (list of float) The weights of the different stimuli in this trialstep

• **stimuliFilter** (list of bool) – A list describing if a stimulus cue is present in this trialstep

# 6.8 fitAlgs package

# 6.8.1 fitAlgs Package

## 6.8.2 Submodules

## 6.8.2.1 fitAlgs.basinhopping module

**Author** Dominic Hunt

Bases: fitAlgs.fitAlg.FitAlg

The class for fitting data using scipy.optimise.basinhopping

- **fit\_sim** (fitAlgs.fitSims.FitSim instance, optional) An instance of one of the fitting simulation methods. Default fitAlgs.fitSims. FitSim
- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default -loge
- **fit\_measure\_args** (*dict*, *optional*) The parameters used to initialise fit\_measure and extra\_fit\_measures. Default None
- extra\_fit\_measures (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fit\_measure\_args. Default None
- bounds (dictionary of tuples of length two with floats, optional) The boundaries for methods that use bounds. If unbounded methods are specified then the bounds will be ignored. Default is None, which translates to boundaries of (0, np.inf) for each parameter.
- boundary\_excess\_cost (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- boundary\_excess\_cost\_properties (dict, optional) The parameters for the boundary\_excess\_cost function. Default {}
- method (string or list of strings, optional) The name of the fitting method or list of names of fitting methods or name of list of fitting methods. Valid names found in the notes. Default unconstrained
- number\_start\_points (int, optional) The number of starting points generated for each parameter. Default 4
- allow\_boundary\_fits (bool, optional) Defines if fits that reach a boundary should be considered the same way as those that do not. Default is True
- boundSensitivity (int, optional) Defines the smallest number of decimal places difference (so the minimal difference) between a fit value and its related boundaries before a fit value is considered different from a boundary. The default is 5. This is only valid if allow\_boundary\_fits is False

#### Name

The name of the fitting method

**Type** string

#### unconstrained

The list of valid unconstrained fitting methods

Type list

#### constrained

The list of valid constrained fitting methods

Type list

### **Notes**

unconstrained = ['Nelder-Mead', 'Powell', 'CG', 'BFGS'] constrained = ['L-BFGS-B', 'TNC', 'SLSQP'] Custom fitting algorithms are also allowed in theory, but it has yet to be implemented.

For each fitting function a set of different starting parameters will be tried. These are the combinations of all the values of the different parameters. For each starting parameter provided a set of number\_start\_points starting points will be chosen, surrounding the starting point provided. If the starting point provided is less than one it will be assumed that the values cannot exceed 1, otherwise, unless otherwise told, it will be assumed that they can take any value and will be chosen to be eavenly spaced around the provided value.

#### See also:

fitAlgs.fitAlg.fitAlg The general fitting method class, from which this one inherits

filtAlgs.fitSims.fitSim The general fitting class

scipy.optimise.basinhopping The fitting class this wraps around

callback(x, f, accept)

Used for storing the state after each stage of fitter

#### Parameters

- x(coordinates of the trial minimum) -
- f(function value of the trial minimum)-
- accept (whether or not that minimum was accepted) -

```
constrained = [u'L-BFGS-B', u'TNC', u'SLSQP']
```

fit (simulator, model\_parameter\_names, model\_initial\_parameters)

Runs the model through the fitting algorithms and starting parameters and returns the best one.

#### **Parameters**

- **simulator** (function) The function used by a fitting algorithm to generate a fit for given model parameters. One example is fitAlgs.fitAlg.fitness
- model\_parameter\_names (list of strings) The list of initial parameter names
- model\_initial\_parameters (list of floats) The list of the intial parameters

## Returns

- best\_fit\_parameters (list of floats) The best fitting parameters
- fit\_quality (float) The quality of the fit as defined by the quality function chosen.

• **testedParams** (*tuple of two lists and a dictionary*) – The two lists are a list containing the parameter values tested, in the order they were tested, and the fit qualities of these parameters. The dictionary contains the coordinates of the trial minimum, the function value of the trial minimum and whether or not that minimum was accepted. Each is stored in a list.

#### See also:

```
fitAlgs.fitAlg.fitness()
unconstrained = [u'Nelder-Mead', u'Powell', u'CG', u'BFGS']
```

## 6.8.2.2 fitAlgs.boundFunc module

## fitAlgs.boundFunc Module

Author Dominic Hunt

#### **Functions**

infBound([base])	Boundary excess of inf when over bounds
scalarBound([base])	Boundary excess calculated as a scalar increase based
	on difference with bounds

#### infBound

```
fitAlgs.boundFunc.infBound(base=0)
```

Boundary excess of inf when over bounds

```
Parameters base (float, optional) - The cost at the boundary. Default 0
```

**Returns cost** – Calculates the cost of exceeding the bounday using the parameters and the boundaries, and returns the cost.

Return type function

## **Examples**

```
>>> cst = infBound(base = 160)

>>> cst([0.5, 2], [(0, 1), (0, 5)])

160

>>> cst([0.5, 7], [(0, 1), (0, 5)])

inf
```

# scalarBound

```
fitAlgs.boundFunc.scalarBound(base=0)
```

Boundary excess calculated as a scalar increase based on difference with bounds

```
Parameters base (float, optional) - The cost at the boundary. Default 0
```

**Returns cost** – Calculates the cost of exceeding the boundary using the parameters and the boundaries, and returns the cost.

Return type function

## **Examples**

```
>>> cst = scalarBound(base=160)
>>> cst([0.5, 2], [(0, 1), (0, 5)])
160.0
>>> cst([0.5, 7], [(0, 1), (0, 5)])
162.0
```

Author Dominic Hunt

fitAlgs.boundFunc.infBound(base=0)

Boundary excess of inf when over bounds

**Parameters** base (float, optional) - The cost at the boundary. Default 0

**Returns cost** – Calculates the cost of exceeding the bounday using the parameters and the boundaries, and returns the cost.

Return type function

## **Examples**

```
>>> cst = infBound(base = 160)

>>> cst([0.5, 2], [(0, 1), (0, 5)])

160

>>> cst([0.5, 7], [(0, 1), (0, 5)])

inf
```

fitAlgs.boundFunc.scalarBound(base=0)

Boundary excess calculated as a scalar increase based on difference with bounds

**Parameters base** (float, optional) – The cost at the boundary. Default 0

**Returns cost** – Calculates the cost of exceeding the boundary using the parameters and the boundaries, and returns the cost.

Return type function

## **Examples**

```
>>> cst = scalarBound(base=160)
>>> cst([0.5, 2], [(0, 1), (0, 5)])
160.0
>>> cst([0.5, 7], [(0, 1), (0, 5)])
162.0
```

### 6.8.2.3 fitAlgs.evolutionary module

Author Dominic Hunt

```
class fitAlgs.evolutionary. Evolutionary (strategy=None, polish=False, population\_size=20, tolerance=0.01, **kwargs)

Bases: fitAlgs.fitAlg.FitAlg
```

The class for fitting data using scipy.optimise.differential\_evolution

#### **Parameters**

• **fit\_sim** (fitAlgs.fitSims.FitSim instance, optional) - An instance of one of the fitting simulation methods. Default fitAlgs.fitSims. FitSim

- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default –loge
- **fit\_measure\_args** (*dict*, *optional*) The parameters used to initialise fit\_measure and extra\_fit\_measures. Default None
- extra\_fit\_measures (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fit\_measure\_args. Default None
- bounds (dictionary of tuples of length two with floats, optional) The boundaries for methods that use bounds. If unbounded methods are specified then the bounds will be ignored. Default is None, which translates to boundaries of (0, np.inf) for each parameter.
- boundary\_excess\_cost (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- boundary\_excess\_cost\_properties (dict, optional) The parameters for the boundary\_excess\_cost function. Default {}
- **strategy** (*string or list of strings*, *optional*) The name of the fitting strategy or list of names of fitting strategies or name of a list of fitting strategies. Valid names found in the notes. Default best1bin
- **polish** (bool, optional) If True (default), then scipy.optimize.minimize with the L-BFGS-B method is used to polish the best population member at the end, which can improve the minimization slightly. Default False
- **population\_size** (*int*, *optional*) A multiplier for setting the total population size. The population has popsize \* len(x) individuals. Default 20
- **tolerance** (*float*, *optional*) When the mean of the population energies, multiplied by tol, divided by the standard deviation of the population energies is greater than 1 the solving process terminates: convergence = mean(pop) \* tol / stdev(pop) > 1 Default 0.01

### Name

The name of the fitting strategies

**Type** string

#### strategySet

The list of valid fitting strategies. Currently these are: 'best1bin', 'best1exp', 'rand1exp', 'rand1exp', 'rand2exp', 'rand2exp', 'rand2bin', 'rand2bin', 'rand2bin', 'rand1bin' For all strategies, use 'all'

Type list

### See also:

fitAlgs.fitAlg.FitAlg The general fitting strategy class, from which this one inherits
fitAlgs.fitSims.FitSim The general class for seeing how a parameter combination perform
scipy.optimise.differential\_evolution The fitting method this wraps around

callback (xk, convergence)

Used for storing the state after each stage of fitting

- xk (coordinates of best fit) -
- convergence (the proportion of the points from the iteration that have converged)-

**fit** (simulator, model\_parameter\_names, model\_initial\_parameters)

Runs the model through the fitting algorithms and starting parameters and returns the best one.

#### **Parameters**

- **simulator** (*function*) The function used by a fitting algorithm to generate a fit for given model parameters. One example is fitAlgs.fitSim.fitness
- model\_parameter\_names (list of strings) The list of initial parameter names
- model\_initial\_parameters (list of floats) The list of the initial parameters

#### **Returns**

- **best\_fit\_parameters** (*list of floats*) The best fitting parameters
- fit\_quality (float) The quality of the fit as defined by the quality function chosen.
- **testedParams** (*tuple of two lists and a dictionary*) The two lists are a list containing the parameter values tested, in the order they were tested, and the fit qualities of these parameters. The dictionary contains the parameters and convergence values from each iteration, stored in two lists.

#### See also:

```
fitAlgs.fitAlg.fitness()
```

validStrategySet = [u'best1bin', u'best1exp', u'rand1exp', u'randtobest1exp', u'best

## 6.8.2.4 fitAlgs.fitAlg module

#### Author Dominic Hunt

Bases: object

The abstract class for fitting data

- **fit\_sim** (fitAlgs.fitSims.FitSim instance, optional) An instance of one of the fitting simulation methods. Default fitAlgs.fitSims. FitSim
- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default –loge
- **fit\_measure\_args** (*dict*, *optional*) The parameters used to initialise fit\_measure and extra\_fit\_measures. Default None
- extra\_fit\_measures (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fit\_measure\_args. Default None
- bounds (dictionary of tuples of length two with floats, optional) The boundaries for methods that use bounds. If unbounded methods are specified then the bounds will be ignored. Default is None, which translates to boundaries of (0, np.inf) for each parameter.

- boundary\_excess\_cost (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- boundary\_excess\_cost\_properties (dict, optional) The parameters for the boundary\_excess\_cost function. Default {}
- calculate\_covariance (bool, optional) Is the covariance calculated.

  Default False

#### Name

The name of the fitting method

Type string

See also:

fitAlgs.fitSims.fitSim The general fitting class

covariance (model\_parameter\_names, paramvals, fitinfo)

The covariance at a point

#### **Parameters**

- paramvals (array or list) The parameters at which the
- **fitinfo** (dict) The

**Returns covariance** – The covariance at the point paramvals

Return type float

extra\_measures (\*model\_parameter\_values)

**Parameters** \*model\_parameter\_values (array of floats) - The parameters proposed by the fitting algorithm

**Returns** fit\_quality - The fit quality value calculated using the fit quality functions described in extraMeasures

Return type dict of float

#### find name()

Returns the name of the class

 $\verb|fit| (simulator, model_parameter_names, model_initial_parameters)|$ 

Runs the model through the fitting algorithms and starting parameters and returns the best one. This is the abstract version that always returns (0,0)

#### **Parameters**

- **simulator** (*function*) The function used by a fitting algorithm to generate a fit for given model parameters. One example is fitAlgs.fitAlg.fitness
- model\_parameter\_names (list of strings) The list of initial parameter names
- model\_initial\_parameters (list of floats) The list of the initial parameters

### Returns

- **best\_fit\_parameters** (*list of floats*) The best fitting parameters
- fit\_quality (float) The quality of the fit as defined by the quality function chosen.
- **tested\_parameters** (*tuple of two lists*) The two lists are a list containing the parameter values tested, in the order they were tested, and the fit qualities of these parameters.

#### See also:

```
fitAlgs.fitAlg.fitness()
```

### fitness(\*params)

Generates a fit quality value used by the fitting function. This is the function passed to the fitting function.

**Parameters \*params** (array of floats) – The parameters proposed by the fitting algorithm

**Returns** fit\_quality - The fit quality value calculated using the fitQualFunc function

Return type float

See also:

fitAlgs.qualityFunc() the module of fitQualFunc functions

fitAlg.invalidParams() Checks if the parameters are valid and if not returns inf

fitAlgs.fitSims.fitSim.fitness() Runs the model simulation and returns the values used to calculate the fit quality

#### info()

The information relating to the fitting method used

Includes information on the fitting algorithm used

Returns info – The fitSims info and the fitAlgs.fitAlg info

Return type (dict,dict)

#### See also:

```
fitAlg.fitSims.fitSim.info()
```

#### invalid\_parameters(\*params)

Identifies if the parameters passed are within the bounds provided

If they are not returns inf

Parameters params (list of floats) - Parameters to be passed to the sim

Returns validity – If the parameters are valid or not

Return type Bool

### **Notes**

No note

### **Examples**

```
>>> a = FitAlg(bounds={1:(0,5), 2:(0,2), 3:(-1,1)})
>>> a.set_bounds([3, 1])
>>> a.invalid_parameters(0, 0)
False
>>> a.invalid_parameters(2, 0)
True
>>> a.invalid_parameters(0, -1)
True
>>> a.invalid_parameters(6, 6)
True
```

participant (model, model\_parameters, model\_properties, participant\_data)
Fit participant data to a model for a given task

#### **Parameters**

- model (model.modelTemplate.Model inherited class) The model you wish to try and fit values to
- model\_parameters (dict) The model initial parameters
- model\_properties (dict) The model static properties
- participant\_data (dict) The participant data

#### Returns

- **model** (*model.modelTemplate.Model inherited class instance*) The model with the best fit parameters
- fit\_quality (float) Specifies the fit quality for this participant to the model
- **fitting\_data** (*tuple of OrderedDict and list*) They are an ordered dictionary containing the parameter values tested, in the order they were tested, and the fit qualities of these parameters.

```
set_bounds (model_parameter_names)
```

Checks if the bounds have changed

**Parameters model\_parameter\_names** (list of strings) – An ordered list of the names of the parameters to be fitted

## **Examples**

```
>>> a = FitAlg(bounds={1: (0, 5), 2: (0, 2), 3: (-1, 1)})
>>> a.boundaries
{1: (0, 5), 2: (0, 2), 3: (-1, 1)}
>>> a.set_bounds([])
>>> a.boundaries
{1: (0, 5), 2: (0, 2), 3: (-1, 1)}
>>> a.boundary_names
[]
>>> a.set_bounds([3,1])
>>> a.boundary_values
[(-1, 1), (0, 5)]
>>> a.set_bounds([2,1])
>>> a.boundary_values
[(0, 2), (0, 5)]
```

**classmethod startParams** (*initial\_parameters*, *bounds=None*, *number\_starting\_points=3*)

Defines a list of different starting parameters to run the minimization over

#### **Parameters**

- initial\_parameters (list of floats) The initial starting values proposed
- bounds (list of tuples of length two with floats, optional) The boundaries for methods that use bounds. If unbounded methods are specified then the bounds will be ignored. Default is None, which translates to boundaries of (0,float('Inf')) for each parameter.
- number\_starting\_points (int) The number of starting parameter values to be calculated around each initial point

**Returns** startParamSet – The generated starting parameter combinations

Return type list of list of floats

#### See also:

FitAlg.start\_parameter\_values() Used in this function

#### **Examples**

static start\_parameter\_values(initial, boundary\_min=-inf, boundary\_max=inf, number\_starting\_points=3)

Provides a set of starting points

#### **Parameters**

- initial (float) The initial starting value proposed
- boundary\_min (float, optional) The minimum value of the parameter.

  Default is float ('-Inf')
- boundary\_max (float, optional) The maximum value of the parameter.

  Default is float ('Inf')
- number\_starting\_points (int) The number of starting parameter values to be calculated around the inital point

**Returns** startParams – The generated starting parameters

Return type list of floats

#### **Notes**

For each starting parameter provided a set of numStartPoints starting points will be chosen, surrounding the starting point provided. If the starting point provided is less than one but greater than zero it will be assumed that the values cannot leave those bounds, otherwise, unless otherwise told, it will be assumed that they can take any positive value and will be chosen to be eavenly spaced around the provided value.

### **Examples**

```
>>> FitAlg.start_parameter_values(0.5)
array([0.25, 0.5 , 0.75])
>>> FitAlg.start_parameter_values(5)
array([2.5, 5. , 7.5])
>>> FitAlg.start_parameter_values(-5)
array([2.5, 5. , 7.5])
>>> FitAlg.start_parameter_values(5, boundary_min = 0, boundary_max = 7)
array([4., 5., 6.])
>>> FitAlg.start_parameter_values(5, boundary_min = -3, boundary_max = 30)
array([1., 5., 9.])
>>> FitAlg.start_parameter_values(5, boundary_min = 0, boundary_max = 30)
array([2.5, 5. , 7.5])
>>> FitAlg.start_parameter_values(5, boundary_min = 3, boundary_max = 30,
array([2.5, 5. , 7.5])
>>> FitAlg.start_parameter_values(5, boundary_min = 3, boundary_max = 30,
array([3.5, 4. , 4.5, 5. , 5.5, 6. , 6.5])
```

fitAlgs.fitAlg.covariance(jac)

Calculates the covariance based on the estimated jacobian

Inspired by how this is calculated in scipy.optimise.curve\_fit, as found at https://github.com/scipy/scipy/blob/2526df72e5d4ca8bad6e2f4b3cbdfbc33e805865/scipy/optimize/minpack.py#L739

#### 6.8.2.5 fitAlgs.fitSims module

### fitAlgs.fitSims Module

Author Dominic Hunt

### **Classes**

ActionError	
FitSim([participant_choice_property,])	A class for fitting data by passing the participant data through the model.
FitSubsetError	
StimuliError	

#### **ActionError**

exception fitAlgs.fitSims.ActionError

### **FitSim**

Bases: object

A class for fitting data by passing the participant data through the model.

This has been setup for fitting action-response models

- participant\_choice\_property (string, optional) The participant data key of their action choices. Default 'Actions'
- participant\_reward\_property (string, optional) The participant data key of the participant reward data. Default 'Rewards'
- model\_fitting\_variable (string, optional) The key to be compared in the model data. Default 'ActionProb'
- task\_stimuli\_property (list of strings or None, optional) The keys containing the stimuli seen by the participant before taking a decision on an action. Default None
- action\_options\_property (string or None or list of ints, optional) The name of the key in partData where the list of valid actions can be found. If None then the action list is considered to stay constant. If a list then the list will be taken as the list of actions that can be taken at each instance. Default None

- **float\_error\_response\_value** (*float*, optional) If a floating point error occurs when running a fit the fitter function will return a value for each element of fpRespVal. Default is 1/1e100
- fit\_subset (float ('Nan'), None, "rewarded", "unrewarded", "all" or list of int, optional) Describes which, if any, subset of trials will be used to evaluate the performance of the model. This can either be described as a list of trial numbers or, by passing "all" for fitting all trials float ('Nan') or "unrewarded" for all those trials whose feedback was float ('Nan') "rewarded" for those who had feedback that was not float ('Nan') Default None, which means all trials will be used.

#### Name

The name of the fitting type

Type string

#### See also:

fitAlgs.fitAlg.FitAlg The general fitting class

### **Methods Summary**

find_name()	Returns the name of the class
<pre>fitness(*model_parameters)</pre>	Used by a fitter to generate the list of values char-
	acterising how well the model parameters describe
	the participants actions.
<pre>fitted_model(*model_parameters)</pre>	Simulating a model run with specific parameter
	values
<pre>get_model_parameters(*model_parameters)</pre>	Compiles the model parameter arguments based on
	the model parameters
<pre>get_model_properties(*model_parameters)</pre>	Compiles the kwarg model arguments based on the
	model_parameters and previously specified other
	parameters
info()	The dictionary describing the fitters algorithm cho-
	sen
<pre>participant_sequence_generation()</pre>	Finds the stimuli in the participant data and returns
	formatted observations
<pre>prepare_sim(model, model_parameters,)</pre>	Set up the simulation of a model following the be-
	haviour of a participant

## **Methods Documentation**

### find\_name()

Returns the name of the class

### fitness(\*model\_parameters)

Used by a fitter to generate the list of values characterising how well the model parameters describe the participants actions.

**Parameters model\_parameters** (list of floats) – A list of the parameters used by the model in the order previously defined

**Returns model\_performance** – The choices made by the model that will be used to characterise the quality of the fit.

Return type list of floats

See also:

```
fitAlgs.fitSims.FitSim.participant() Fits participant data
```

fitAlgs.fitAlg.fitAlg() The general fitting class

fitAlgs.fitAlg.fitness() The function that this one is called by

### fitted\_model (\*model\_parameters)

Simulating a model run with specific parameter values

**Parameters** \*model\_parameters (floats) - The model parameters provided in the order defined in the model setup

Returns model instance

**Return type** model.modelTemplate.Model class instance

### get\_model\_parameters(\*model\_parameters)

Compiles the model parameter arguments based on the model parameters

**Parameters model\_parameters** (list of floats) – The parameter values in the order extracted from the modelSetup parameter dictionary

**Returns** parameters – The kwarg model parameter arguments

Return type dict

### get\_model\_properties (\*model\_parameters)

Compiles the kwarg model arguments based on the model\_parameters and previously specified other parameters

**Parameters model\_parameters** (list of floats) – The parameter values in the order extracted from the modelSetup parameter dictionary

Returns model\_properties - The kwarg model arguments

Return type dict

info()

The dictionary describing the fitters algorithm chosen

Returns fitInfo – The dictionary of fitters class information

Return type dict

Finds the stimuli in the participant data and returns formatted observations

### **Parameters**

- participant\_data (dict) The participant data
- **choice\_property** (*string*) The participant data key of their action choices.
- reward\_property (string) The participant data key of the participant reward data
- **stimuli\_property** (*string or None or list of strings*) A list of the keys in partData representing participant stimuli
- action\_options\_property (string or None or list of strings, ints or None) The name of the key in partData where the list of valid actions can be found. If None then the action list is considered to stay constant. If a list then the list will be taken as the list of actions that can be taken at every trialstep. If the list is shorter than the number of trialsteps, then it will be considered to be a list of valid actions for each trialstep.

**Returns participant\_sequence** – Each list element contains the observation, action and feedback for each trial taken by the participant

### **Return type** list of three element tuples

**prepare\_sim** (*model*, *model\_parameters*, *model\_properties*, *participant\_data*)

Set up the simulation of a model following the behaviour of a participant

#### **Parameters**

- model (model.modelTemplate.Model inherited class) The model you wish to try and fit values to
- model\_parameters (dict) The model initial parameters
- model\_properties (dict) The model static properties
- participant\_data (dict) The participant data

#### Returns

Return type fitness

#### **FitSubsetError**

```
exception fitAlgs.fitSims.FitSubsetError
```

#### StimuliError

```
exception fitAlgs.fitSims.StimuliError
```

### **Class Inheritance Diagram**

### Author Dominic Hunt

```
exception fitAlgs.fitSims.ActionError
Bases: exceptions.Exception
```

Bases: object

A class for fitting data by passing the participant data through the model.

This has been setup for fitting action-response models

- participant\_choice\_property (string, optional) The participant data key of their action choices. Default 'Actions'
- participant\_reward\_property (string, optional) The participant data key of the participant reward data. Default 'Rewards'
- model\_fitting\_variable (string, optional) The key to be compared in the model data. Default 'ActionProb'
- task\_stimuli\_property (list of strings or None, optional) The keys containing the stimuli seen by the participant before taking a decision on an action. Default None

- action\_options\_property (string or None or list of ints, optional) The name of the key in partData where the list of valid actions can be found. If None then the action list is considered to stay constant. If a list then the list will be taken as the list of actions that can be taken at each instance. Default None
- **float\_error\_response\_value** (*float*, optional) If a floating point error occurs when running a fit the fitter function will return a value for each element of fpRespVal. Default is 1/1e100
- fit\_subset (float ('Nan'), None, "rewarded", "unrewarded", "all" or list of int, optional) Describes which, if any, subset of trials will be used to evaluate the performance of the model. This can either be described as a list of trial numbers or, by passing "all" for fitting all trials float ('Nan') or "unrewarded" for all those trials whose feedback was float ('Nan') "rewarded" for those who had feedback that was not float ('Nan') Default None, which means all trials will be used.

#### Name

The name of the fitting type

Type string

See also:

fitAlgs.fitAlg.FitAlg The general fitting class

#### find\_name()

Returns the name of the class

fitness(\*model\_parameters)

Used by a fitter to generate the list of values characterising how well the model parameters describe the participants actions.

**Parameters model\_parameters** (list of floats) – A list of the parameters used by the model in the order previously defined

**Returns model\_performance** – The choices made by the model that will be used to characterise the quality of the fit.

Return type list of floats

See also:

```
fitAlgs.fitSims.FitSim.participant() Fits participant data
fitAlgs.fitAlg.fitAlg() The general fitting class
fitAlgs.fitAlg.fitAlg.fitness() The function that this one is called by
```

```
fitted_model (*model_parameters)
```

Simulating a model run with specific parameter values

**Parameters** \*model\_parameters (floats) - The model parameters provided in the order defined in the model setup

Returns model instance

**Return type** model.modelTemplate.Model class instance

```
get_model_parameters(*model_parameters)
```

Compiles the model parameter arguments based on the model parameters

**Parameters model\_parameters** (list of floats) – The parameter values in the order extracted from the modelSetup parameter dictionary

**Returns** parameters – The kwarg model parameter arguments

Return type dict

#### get\_model\_properties (\*model\_parameters)

Compiles the kwarg model arguments based on the model\_parameters and previously specified other parameters

**Parameters model\_parameters** (list of floats) – The parameter values in the order extracted from the modelSetup parameter dictionary

Returns model\_properties - The kwarg model arguments

Return type dict

info()

The dictionary describing the fitters algorithm chosen

Returns fitInfo – The dictionary of fitters class information

Return type dict

Finds the stimuli in the participant data and returns formatted observations

#### **Parameters**

- participant\_data (dict) The participant data
- **choice\_property** (*string*) The participant data key of their action choices.
- reward\_property (string) The participant data key of the participant reward data
- **stimuli\_property** (*string or None or list of strings*) A list of the keys in partData representing participant stimuli
- action\_options\_property (string or None or list of strings, ints or None) The name of the key in partData where the list of valid actions can be found. If None then the action list is considered to stay constant. If a list then the list will be taken as the list of actions that can be taken at every trialstep. If the list is shorter than the number of trialsteps, then it will be considered to be a list of valid actions for each trialstep.

**Returns participant\_sequence** – Each list element contains the observation, action and feedback for each trial taken by the participant

Return type list of three element tuples

**prepare\_sim** (*model*, *model\_parameters*, *model\_properties*, *participant\_data*)

Set up the simulation of a model following the behaviour of a participant

#### **Parameters**

- model (model.modelTemplate.Model inherited class) The model you wish to try and fit values to
- model\_parameters (dict) The model initial parameters
- model\_properties (dict) The model static properties
- participant\_data (dict) The participant data

### Returns

Return type fitness

```
exception fitAlgs.fitSims.FitSubsetError Bases: exceptions.Exception
```

**exception** fitAlgs.fitSims.**StimuliError**Bases: exceptions.Exception

### 6.8.2.6 fitAlgs.leastsq module

Author Dominic Hunt

class fitAlgs.leastsq.Leastsq(method=u'dogbox', jacobian\_method=u'3-point', \*\*kwargs)
 Bases: fitAlgs.fitAlg.FitAlg

Fits data based on the least squared optimizer scipy.optimize.least\_squares

Not properly developed and will not be documented until upgrade

#### **Parameters**

- **fit\_sim** (fitAlgs.fitSims.FitSim instance, optional) An instance of one of the fitting simulation methods. Default fitAlgs.fitSims. FitSim
- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default -loge
- **fit\_measure\_args** (*dict*, *optional*) The parameters used to initialise fit\_measure and extra\_fit\_measures. Default None
- extra\_fit\_measures (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fit\_measure\_args. Default None
- bounds (dictionary of tuples of length two with floats, optional) The boundaries for methods that use bounds. If unbounded methods are specified then the bounds will be ignored. Default is None, which translates to boundaries of (0, np.inf) for each parameter.
- boundary\_excess\_cost (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- boundary\_excess\_cost\_properties (dict, optional) The parameters for the boundary\_excess\_cost function. Default {}
- method ({ 'trf', 'dogbox', 'lm'}, optional) Algorithm to perform minimization. Default dogbox

#### Name

The name of the fitting method

Type string

See also:

fitAlgs.fitAlg The general fitting method class, from which this one inherits fitAlgs.fitSims.fitSim The general fitting class

scipy.optimize.least\_squares The fitting class this wraps around

**fit** (simulator, model\_parameter\_names, model\_initial\_parameters)

Runs the model through the fitting algorithms and starting parameters and returns the best one.

- **simulator** (*function*) The function used by a fitting algorithm to generate a fit for given model parameters. One example is fitAlg.fitness
- model\_parameter\_names (list of strings) The list of initial parameter names
- model\_initial\_parameters (list of floats) The list of the initial parameters

#### Returns

- **fitParams** (*list of floats*) The best fitting parameters
- **fit\_quality** (*float*) The quality of the fit as defined by the quality function chosen.
- **testedParams** (*tuple of two lists*) The two lists are a list containing the parameter values tested, in the order they were tested, and the fit qualities of these parameters.

#### See also:

```
fitAlgs.fitAlg.fitness()
```

#### 6.8.2.7 fitAlgs.minimize module

#### Author Dominic Hunt

```
 \begin{array}{lll} \textbf{class} & \textbf{fitAlgs.minimize}. \textbf{Minimize} (\textit{method=None}, & \textit{number\_start\_points=4}, & \textit{al-low\_boundary\_fits=True}, & \textit{boundary\_fit\_sensitivity=5}, \\ & & **kwargs) \end{array}
```

Bases: fitAlgs.fitAlg.FitAlg

The class for fitting data using scipy.optimise.minimize

- **fit\_sim** (fitAlgs.fitSims.FitSim instance, optional) An instance of one of the fitting simulation methods. Default fitAlgs.fitSims. FitSim
- **fit\_measure** (*string*, *optional*) The name of the function used to calculate the quality of the fit. The value it returns provides the fitter with its fitting guide. Default –loge
- **fit\_measure\_args** (*dict*, *optional*) The parameters used to initialise fit\_measure and extra\_fit\_measures. Default None
- extra\_fit\_measures (list of strings, optional) List of fit measures not used to fit the model, but to provide more information. Any arguments needed for these measures should be placed in fit\_measure\_args. Default None
- bounds (dictionary of tuples of length two with floats, optional) The boundaries for methods that use bounds. If unbounded methods are specified then the bounds will be ignored. Default is None, which translates to boundaries of (0, np.inf) for each parameter.
- boundary\_excess\_cost (basestring or callable returning a function, optional) The function is used to calculate the penalty for exceeding the boundaries. Default is boundFunc.scalarBound()
- boundary\_excess\_cost\_properties (dict, optional) The parameters for the boundary\_excess\_cost function. Default {}
- method (string or list of strings, optional) The name of the fitting method or list of names of fitting methods or name of list of fitting methods. Valid names found in the notes. Default unconstrained
- number\_start\_points (int, optional) The number of starting points generated for each parameter. Default 4
- allow\_boundary\_fits (bool, optional) Defines if fits that reach a boundary should be considered the same way as those that do not. Default is True
- **boundary\_fit\_sensitivity** (*int*, *optional*) Defines the smallest number of decimal places difference (so the minimal difference) between a parameter value and its related boundaries before a parameter value is considered different from a boundary. The default is 5. This is only valid if allow\_boundary\_fits is False

#### Name

The name of the fitting method

**Type** string

#### unconstrained

The list of valid unconstrained fitting methods

Type list

#### constrained

The list of valid constrained fitting methods

Type list

#### **Notes**

unconstrained = ['Nelder-Mead','Powell','CG','BFGS'] constrained = ['L-BFGS-B','TNC','SLSQP'] Custom fitting algorithms are also allowed in theory, but it has yet to be implemented.

For each fitting function a set of different starting parameters will be tried. These are the combinations of all the values of the different parameters. For each starting parameter provided a set of number\_start\_points starting points will be chosen, surrounding the starting point provided. If the starting point provided is less than one it will be assumed that the values cannot exceed 1, otherwise, unless otherwise told, it will be assumed that they can take any value and will be chosen to be eavenly spaced around the provided value.

#### See also:

```
fitAlgs.fitAlg.fitAlg The general fitting method class, from which this one inherits
fitAlgs.fitSims.fitSim The general fitSim class
scipy.optimise.minimize The fitting class this wraps around
```

```
constrained = [u'L-BFGS-B', u'TNC', u'SLSQP']
```

fit (simulator, model\_parameter\_names, model\_initial\_parameters)

Runs the model through the fitting algorithms and starting parameters and returns the best one.

#### **Parameters**

- **simulator** (function) The function used by a fitting algorithm to generate a fit for given model parameters. One example is fitAlgs.fitAlg.fitness
- model\_parameter\_names (list of strings) The list of initial parameter names
- model\_initial\_parameters (list of floats) The list of the initial parameters

#### Returns

- **best\_fit\_parameters** (*list of floats*) The best fitting parameters
- fit\_quality (float) The quality of the fit as defined by the quality function chosen.
- **testedParams** (*tuple of two lists*) The two lists are a list containing the parameter values tested, in the order they were tested, and the fit qualities of these parameters.

#### See also:

```
fitAlgs.fitAlg.fitness()
unconstrained = [u'Nelder-Mead', u'Powell', u'CG', u'BFGS']
```

## 6.8.2.8 fitAlgs.qualityFunc module

## fitAlgs.qualityFunc Module

Author Dominic Hunt

## **Functions**

BIC2(**kwargs)	Generates a function that calculates the Bayesian In-
<u>-</u> .	formation Criterion (BIC)
BIC2norm(**kwargs)	
	param numParams The number of pa-
	rameters used by the model used for
	the fits process. Default 2
BIC2normBoot(**kwargs)	An attempt at looking what would happen if the sam-
-	ples were resampled.
WBIC2(**kwargs)	Unfinished WBIC implementation
bayesFactor(**kwargs)	:math: <b>'</b> 2^{
bayesInv(**kwargs)	
	param numParams The number of pa-
	rameters used by the model used for
	the fitters process. Default 2
bayesRand(**kwargs)	
logAverageProb(modVals)	Generates a fit quality value based on $\sum -2\log_2(\vec{x})$
logeprob(modVals)	Generates a fit quality value based on
	:math: f_{mathrm{mod}}left(vec x
logprob(modVals)	Generates a fit quality value based on
	:math: f_{mathrm{mod}}left(vec x
maxprob(modVals)	Generates a fit quality value based on $\sum 1 - \vec{x}$
qualFuncIdent(value, **kwargs)	
r2(**kwargs)	
simpleSum(modVals)	Generates a fit quality value based on $\sum \vec{x}$

## BIC<sub>2</sub>

```
\label{eq:fitAlgs_qualityFunc.BIC2} FitAlgs. qualityFunc.BIC2 (**kwargs) $$ Generates a function that calculates the Bayesian Information Criterion (BIC) $$ :math: 'lambda mathrm{log}_2(T)+ f_{mathrm{mod}}left(vec x ight)' $$ kwargs $$
```

### **BIC2norm**

```
fitAlgs.qualityFunc.BIC2norm(**kwargs)
```

### **Parameters**

• numParams (int, optional) - The number of parameters used by the model used for the fits process. Default 2

- qualityThreshold (float, optional) The BIC minimum fit quality criterion used for determining if a fit is valid. Default 20.0
- number\_actions (int or list of ints the length of the number of trials being fitted, optional) The number of actions the participant can choose between for each trialstep of the task. May need to be specified for each trial if the number of action choices varies between trials. Default 2
- randActProb (float or list of floats the length of the number of trials being fitted. Optional) The prior probability of an action being randomly chosen. May need to be specified for each trial if the number of action choices varies between trials. Default 1/number\_actions

#### **BIC2normBoot**

```
fitAlgs.qualityFunc.BIC2normBoot (**kwargs)
```

An attempt at looking what would happen if the samples were resampled. It was hoped that by doing this, the difference between different sample distributions would become more pronounced. This was not found to be true.

#### **Parameters**

- numParams (int, optional) The number of parameters used by the model used for the fits process. Default 2
- qualityThreshold (float, optional) The BIC minimum fit quality criterion used for determining if a fit is valid. Default 20.0
- number\_actions (int or list of ints the length of the number of trials being fitted, optional) The number of actions the participant can choose between for each trialstep of the task. May need to be specified for each trial if the number of action choices varies between trials. Default 2
- randActProb (float or list of floats the length of the number of trials being fitted. Optional) The prior probability of an action being randomly chosen. May need to be specified for each trial if the number of action choices varies between trials. Default 1/number\_actions
- numSamples (int, optional) The number of samples that will be randomly resampled from modVals. Default 100
- sampleLen (int, optional) The length of the random sample. Default 1

### WBIC2

```
fitAlgs.qualityFunc.WBIC2(**kwargs)
    Unfinished WBIC implementation
```

## bayesFactor

```
\label{eq:fitAlgs.qualityFunc.bayesFactor} $$\inf_{2^{{x}}{2^{{x}}}}$$ in $\mathbb{R}^{2}$$ in $\mathbb{R}^{2}$$ kwargs
```

### bayesInv

```
fitAlgs.qualityFunc.bayesInv(**kwargs)
```

#### **Parameters**

- numParams (int, optional) The number of parameters used by the model used for the fitters process. Default 2
- qualityThreshold (float, optional) The BIC minimum fit quality criterion used for determining if a fit is valid. Default 20.0
- number\_actions (int or list of ints the length of the number of trials being fitted, optional) The number of actions the participant can choose between for each trialstep of the task. May need to be specified for each trial if the number of action choices varies between trials. Default 2
- randActProb (float or list of floats the length of the number of trials being fitted. Optional) The prior probability of an action being randomly chosen. May need to be specified for each trial if the number of action choices varies between trials. Default 1/number\_actions

### bayesRand

```
fitAlgs.qualityFunc.bayesRand(**kwargs)
```

### **logAverageProb**

```
fitAlgs.qualityFunc.logAverageProb (modVals) Generates a fit quality value based on \sum -2{\log _2}(\vec{x})
```

**Returns** fit – The sum of the model values returned

Return type float

### logeprob

```
fitAlgs.qualityFunc.logeprob (modVals)
    Generates a fit quality value based on :math: f_{mathrm{mod}}left(vec x
    ight) = sum -mathrm{log}_e(vec x)'
    fit [float] The sum of the model values returned
```

### logprob

```
fitAlgs.qualityFunc.logprob (modVals)
    Generates a fit quality value based on :math: f_{mathrm{mod}}left(vec x
    ight) = sum -2mathrm{log}_2(vec x)'
    fit [float] The sum of the model values returned
```

### maxprob

```
fitAlgs.qualityFunc.maxprob(modVals)
     Generates a fit quality value based on \sum 1 - \vec{x}
          Returns fit – The sum of the model values returned
          Return type float
qualFuncIdent
fitAlgs.qualityFunc.qualFuncIdent (value, **kwargs)
r2
fitAlgs.qualityFunc.r2(**kwargs)
simpleSum
fitAlgs.qualityFunc.simpleSum (modVals)
     Generates a fit quality value based on \sum \vec{x}
          Returns fit – The sum of the model values returned
          Return type float
     Author Dominic Hunt
fitAlgs.qualityFunc.BIC2(**kwargs)
          Generates a function that calculates the Bayesian Information Criterion (BIC)
          :math: ^{lambda} mathrm^{log}_2(T) + f_{mathrm}^{lambda} left(vec x
     ight) '
          kwargs
fitAlgs.qualityFunc.BIC2norm(**kwargs)
```

### **Parameters**

- numParams (int, optional) The number of parameters used by the model used for the fits process. Default 2
- qualityThreshold (float, optional) The BIC minimum fit quality criterion used for determining if a fit is valid. Default 20.0
- number\_actions (int or list of ints the length of the number of trials being fitted, optional) The number of actions the participant can choose between for each trialstep of the task. May need to be specified for each trial if the number of action choices varies between trials. Default 2
- randActProb (float or list of floats the length of the number of trials being fitted. Optional) The prior probability of an action being randomly chosen. May need to be specified for each trial if the number of action choices varies between trials. Default 1/number\_actions

```
fitAlgs.qualityFunc.BIC2normBoot (**kwargs)
```

An attempt at looking what would happen if the samples were resampled. It was hoped that by doing this, the difference between different sample distributions would become more pronounced. This was not found to be true.

- numParams (int, optional)—The number of parameters used by the model used for the fits process. Default 2
- qualityThreshold (float, optional) The BIC minimum fit quality criterion used for determining if a fit is valid. Default 20.0
- number\_actions (int or list of ints the length of the number of trials being fitted, optional) The number of actions the participant can choose between for each trialstep of the task. May need to be specified for each trial if the number of action choices varies between trials. Default 2
- randActProb (float or list of floats the length of the number of trials being fitted. Optional) The prior probability of an action being randomly chosen. May need to be specified for each trial if the number of action choices varies between trials. Default 1/number\_actions
- numSamples (int, optional) The number of samples that will be randomly resampled from modVals. Default 100
- sampleLen (int, optional) The length of the random sample. Default 1

```
fitAlgs.qualityFunc.WBIC2(**kwargs)
     Unfinished WBIC implementation

fitAlgs.qualityFunc.bayesFactor(**kwargs)
     :math:'2^{
    rac{x}{2}}'
         kwargs

fitAlgs.qualityFunc.bayesInv(**kwargs)
```

- numParams (int, optional) The number of parameters used by the model used for the fitters process. Default 2
- qualityThreshold (float, optional) The BIC minimum fit quality criterion used for determining if a fit is valid. Default 20.0
- number\_actions (int or list of ints the length of the number of trials being fitted, optional) The number of actions the participant can choose between for each trialstep of the task. May need to be specified for each trial if the number of action choices varies between trials. Default 2
- randActProb (float or list of floats the length of the number of trials being fitted. Optional) The prior probability of an action being randomly chosen. May need to be specified for each trial if the number of action choices varies between trials. Default 1/number actions

```
\label{eq:fitAlgs.qualityFunc.bayesRand} \begin{tabular}{ll} fitAlgs.qualityFunc.logAverageProb $(modVals)$ Generates a fit quality value based on $\sum -2\log_2(\vec{x})$ \\ Returns fit - The sum of the model values returned \\ Return type float \\ fitAlgs.qualityFunc.logeprob $(modVals)$ \\ Generates a fit quality value based on :math: $^f_{\mathbf{x}}$ fmathrm{mod}} eff(vec x ight) = sum -mathrm{log}_e(vec x)$ \\ fit [float] The sum of the model values returned \\ fitAlgs.qualityFunc.logprob $(modVals)$ \\ \end{tabular}
```

Generates a fit quality value based on :math: f\_{mathrm{mod}}left(vec x

 $ight) = sum - 2mathrm\{log\}_2(vec x)$ 

fit [float] The sum of the model values returned

fitAlgs.qualityFunc.maxprob(modVals)

Generates a fit quality value based on  $\sum 1 - \vec{x}$ 

**Returns** fit – The sum of the model values returned

Return type float

fitAlgs.qualityFunc.qualFuncIdent(value, \*\*kwargs)

fitAlgs.qualityFunc.r2(\*\*kwargs)

 $\verb|fitAlgs.qualityFunc.simpleSum| (modVals)|$ 

Generates a fit quality value based on  $\sum \vec{x}$ 

**Returns** fit – The sum of the model values returned

Return type float

# 6.9 outputting module

## 6.9.1 outputting Module

Author Dominic Hunt

### 6.9.1.1 Functions

date()	Calculate today's date as a string in the form <year>-</year>
	<month>-<day> and returns it</day></month>
<pre>dictKeyGen(store[, maxListLen, returnList,])</pre>	Identifies the columns necessary to convert a dictio-
	nary into a table
<pre>fancy_logger([log_file, log_level,])</pre>	Sets up the style of logging for all the simulations
<pre>file_name_generator([output_folder])</pre>	Keeps track of filenames that have been used and gen-
	erates the next unused one
<pre>flatDictKeySet(store[, selectKeys])</pre>	Generates a dictionary of keys and identifiers for the
	new dictionary, including only the keys in the keys
	list.
folder_path_cleaning(folder)	Modifies string file names from Windows format to
	Unix format if necessary and makes sure there is a /
	at the end.
<pre>folder_setup(label, date_string[,])</pre>	Identifies and creates the folder the data will be stored
	in
<pre>listKeyGen(data[, maxListLen, returnList,])</pre>	Identifies the columns necessary to convert a list into
	a table
listSelection(data, loc)	Allows numpy array-like referencing of lists
<pre>newFlatDict(store[, selectKeys, labelPrefix])</pre>	Takes a list of dictionaries and returns a dictionary of
	1D lists.
<pre>newListDict(store[, labelPrefix, maxListLen])</pre>	Takes a dictionary of numbers, strings, lists and arrays
	and returns a dictionary of 1D arrays.
pad(values, maxListLen)	Pads a list with None
pickleLog(results, file_name_gen[, label])	Stores the data in the appropriate pickle file in a Pickle
	subfolder of the outputting folder
	subtotact of the outputting forcer

#### date

```
outputting.date()
```

Calculate today's date as a string in the form <year>-<month>-<day> and returns it

**Returns todayDate** – The current date in the format <year>-<month>-<day> **Return type** basestring

## dictKeyGen

outputting.dictKeyGen (store, maxListLen=None, returnList=False, abridge=False)
Identifies the columns necessary to convert a dictionary into a table

#### **Parameters**

- **store** (dict) The dictionary to be broken down into keys
- maxListLen (int or float with no decimal places or None, optional) The length of the longest expected list. Only useful if returnList is True. Default None
- returnList (bool, optional) Defines if the lists will be broken into 1D lists or values. Default False, lists will be broken into values
- abridge (bool, optional) Defines if the final dataset will be a summary or the whole lot. If it is a summary, lists of more than 10 elements are removed. Default False, not abridged

#### Returns

- keySet (OrderedDict with values of OrderedDict, list or None) The dictionary of keys to be extracted
- maxListLen (int or float with no decimal places or None, optional) If returnList is True this should be the length of the longest list. If returnList is False this should return its original value

### **Examples**

## fancy\_logger

```
outputting.fancy_logger(log_file=None, log_level=20, numpy_error_level=u'log') Sets up the style of logging for all the simulations
```

- date\_string (basestring) The date the log will start at
- log\_file (string, optional) Provides the path the log will be written to. Default "./log.txt"
- log\_level ({logging.DEBUG, logging.INFO, logging.WARNING, logging.ERROR, logging.CRITICAL}) Defines the level of the log. Default logging.INFO
- numpy\_error\_level ({'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr

**Returns** close\_loggers – Closes the logging systems that have been set up

Return type function

See also:

logging () The Python standard logging library

**numpy.seterr()** The function npErrResp is passed to for defining the response to numpy errors

### file\_name\_generator

```
outputting.file_name_generator(output_folder=None)
```

Keeps track of filenames that have been used and generates the next unused one

**Parameters output\_folder**(*string*, *optional*) – The folder into which the new file will be placed. Default is the current working directory

**Returns** new\_file\_name - Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

**Return type** function

### **Examples**

```
>>> file_name_gen = file_name_generator("./")
>>> file_name_gen("a", "b")
'./a.b'
>>> file_name_gen("a", "b")
'./a_1.b'
>>> file_name_gen("", "")
'./'
>>> file_name_gen = file_name_generator()
>>> fileName = file_name_gen("", "")
>>> fileName == os.getcwd()
False
```

## flatDictKeySet

```
outputting.flatDictKeySet (store, selectKeys=None)
```

Generates a dictionary of keys and identifiers for the new dictionary, including only the keys in the keys list. Any keys with lists will be split into a set of keys, one for each element in the original key.

These are named <key><location>

- **store** (list of dicts) The dictionaries would be expected to have many of the same keys. Any dictionary keys containing lists in the input have been split into multiple numbered keys
- **selectKeys** (*list of strings*, *optional*) The keys whose data will be included in the return dictionary. Default None, which results in all keys being returned

**Returns** keySet – The dictionary of keys to be extracted

Return type OrderedDict with values of OrderedDict, list or None

#### See also:

```
reframeListDicts(), newFlatDict()
```

### folder path cleaning

```
outputting.folder_path_cleaning(folder)
```

Modifies string file names from Windows format to Unix format if necessary and makes sure there is a / at the end.

```
Parameters folder (string) - The folder path
```

Returns folder\_path - The folder path

**Return type** basestring

### folder setup

```
outputting.folder_setup(label, date_string, pickle_data=False, base_path=None)
```

Identifies and creates the folder the data will be stored in

Folder will be created as "./Outputs/<sim\_label>\_<date>/". If that had previously been created then it is created as "./Outputs/<sim\_label>\_<date>\_no\_<#>/", where "<#>" is the first available integer.

A subfolder is also created with the name Pickle if pickle is true.

## **Parameters**

- label (basestring) The label for the simulation
- date\_string (basestring) The date identifier
- pickle\_data (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- base\_path (basestring, optional) The path into which the new folder will be placed. Default is current working directory

**Returns folder\_name** – The folder path that has just been created

Return type string

See also:

```
newFile() Creates a new file
```

saving() Creates the log system

## listKeyGen

```
outputting.listKeyGen (data, maxListLen=None, returnList=False, abridge=False) Identifies the columns necessary to convert a list into a table
```

- data (numpy.ndarray or list) The list to be broken down
- maxListLen (int or float with no decimal places or None, optional) The length of the longest expected list. Only useful if returnList is True. Default None
- returnList (bool, optional) Defines if the lists will be broken into 1D lists or values. Default False, lists will be broken into values
- **abridge** (bool, optional) Defines if the final dataset will be a summary or the whole lot. If it is a summary, lists of more than 10 elements are removed. Default False, not abridged

#### Returns

- **returnList** (*None or list of tuples of ints or ints*) The list of co-ordinates for the elements to be extracted from the data. If None the list is used as-is.
- maxListLen (int or float with no decimal places or None, optional) If returnList is True this should be the length of the longest list. If returnList is False this should return its original value

### **Examples**

#### **listSelection**

outputting.listSelection(data, loc)

Allows numpy array-like referencing of lists

#### **Parameters**

- data (list) The data to be referenced
- loc (tuple of integers) The location to be referenced

Returns selection – The referenced subset

Return type list

## **Examples**

```
>>> listSelection([1, 2, 3], (0,))

1
>>> listSelection([[1, 2, 3], [4, 5, 6]], (0,))
[1, 2, 3]
>>> listSelection([[1, 2, 3], [4, 5, 6]], (0, 2))
3
```

### newFlatDict

```
outputting.newFlatDict (store, selectKeys=None, labelPrefix=u") Takes a list of dictionaries and returns a dictionary of 1D lists.
```

If a dictionary did not have that key or list element, then 'None' is put in its place

#### **Parameters**

- **store** (list of dicts) The dictionaries would be expected to have many of the same keys. Any dictionary keys containing lists in the input have been split into multiple numbered keys
- **selectKeys** (*list of strings*, *optional*) The keys whose data will be included in the return dictionary. Default None, which results in all keys being returned
- **labelPrefix** (*string*) An identifier to be added to the beginning of each key string.

**Returns** newStore – The new dictionary with the keys from the keySet and the values as 1D lists with 'None' if the keys, value pair was not found in the store.

Return type dict

#### **Examples**

### newListDict

```
outputting.newListDict(store, labelPrefix=u", maxListLen=0)
```

Takes a dictionary of numbers, strings, lists and arrays and returns a dictionary of 1D arrays.

If there is a single value, then a list is created with that value repeated

### **Parameters**

- store (dict) A dictionary of numbers, strings, lists, dictionaries and arrays
- **labelPrefix** (*string*) An identifier to be added to the beginning of each key string. Default empty string

**Returns newStore** – The new dictionary with the keys from the keySet and the values as 1D lists.

Return type dict

## **Examples**

```
>>> store = {'list': [1, 2, 3, 4, 5, 6]}
>>> newListDict(store)
OrderedDict([('list', [1, 2, 3, 4, 5, 6])])
>>> store = {'string': 'string'}
>>> newListDict(store)
OrderedDict([('string', ['string'])])
>>> store = {'dict': {1: {3: "a"}, 2: "b"}}
>>> newListDict(store)
OrderedDict([(u'dict_1_3', ['a']), (u'dict_2', ['b'])])
```

### pad

outputting.pad(values, maxListLen)

Pads a list with None

#### **Parameters**

- **values** (*list*) The list to be extended
- maxListLen (int) The number of elements the list needs to have

### pickleLog

outputting.pickleLog(results, file\_name\_gen, label=u")

Stores the data in the appropriate pickle file in a Pickle subfolder of the outputting folder

#### **Parameters**

- results (dict) The data to be stored
- **file\_name\_gen** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string
- label (string, optional) A label for the results file

### pickle\_write

outputting.pickle\_write(data, handle, file\_name\_gen)

Writes the data to a pickle file

#### **Parameters**

- data (object) Data to be written to the file
- handle (string) The name of the file
- **file\_name\_gen** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

### 6.9.1.2 Classes

LoggerWriter(writer)	Fake file-like stream object that redirects writes to a
	logger instance.
Saving([label, output_path, config,])	Creates the folder structure for the saved data and cre-
	ated the log file as log.txt

## LoggerWriter

```
class outputting.LoggerWriter(writer)
```

Bases: object

Fake file-like stream object that redirects writes to a logger instance. Taken from https://stackoverflow.com/a/51612402

Parameters writer (logging function) -

### **Methods Summary**

```
flush()
```

write(message)

#### **Methods Documentation**

```
flush()
```

write (message)

### Saving

Bases: object

Creates the folder structure for the saved data and created the log file as log.txt

### **Parameters**

- label (string, optional) The label for the simulation. Default None will mean no data is saved to files.
- output\_path (string, optional) The path that will be used for the run output. Default None
- **config** (*dict*, *optional*) The parameters of the running simulation/fitting. This is used to create a YAML configuration file. Default None
- **config\_file** (*string*, *optional*) The file name and path of a .yaml configuration file. Default None
- pickle\_store (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- min\_log\_level (basestring, optional) Defines the level of the log from (DEBUG, INFO, WARNING, ERROR, CRITICAL). Default INFO See https://docs.python.org/3/library/logging.html#levels
- numpy\_error\_level ({'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr

**Returns** file\_name\_gen - Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

Return type function

See also:

folderSetup creates the folders

### 6.9.1.3 Class Inheritance Diagram

```
Author Dominic Hunt
```

```
class outputting.LoggerWriter(writer)
```

Bases: object

Fake file-like stream object that redirects writes to a logger instance. Taken from https://stackoverflow.com/a/51612402

Parameters writer (logging function) -

flush()

write (message)

Bases: object

Creates the folder structure for the saved data and created the log file as log.txt

#### **Parameters**

- label (string, optional) The label for the simulation. Default None will mean no data is saved to files.
- output\_path (string, optional) The path that will be used for the run output. Default None
- **config** (dict, optional) The parameters of the running simulation/fitting. This is used to create a YAML configuration file. Default None
- **config\_file** (*string*, *optional*) The file name and path of a .yaml configuration file. Default None
- pickle\_store (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- min\_log\_level (basestring, optional) Defines the level of the log from (DEBUG, INFO, WARNING, ERROR, CRITICAL). Default INFO See https://docs.python.org/3/library/logging.html#levels
- numpy\_error\_level ({'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr

**Returns** file\_name\_gen - Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

Return type function

See also:

folderSetup creates the folders

```
outputting.date()
```

Calculate today's date as a string in the form <year>-<month>-<day> and returns it

Returns todayDate - The current date in the format <year>-<month>-<day>

Return type basestring

outputting.dictKeyGen (store, maxListLen=None, returnList=False, abridge=False)

Identifies the columns necessary to convert a dictionary into a table

- **store** (dict) The dictionary to be broken down into keys
- maxListLen (int or float with no decimal places or None, optional) The length of the longest expected list. Only useful if returnList is True. Default None
- returnList (bool, optional) Defines if the lists will be broken into 1D lists or values. Default False, lists will be broken into values
- **abridge** (bool, optional) Defines if the final dataset will be a summary or the whole lot. If it is a summary, lists of more than 10 elements are removed. Default False, not abridged

#### Returns

- keySet (OrderedDict with values of OrderedDict, list or None) The dictionary of keys to be extracted
- maxListLen (int or float with no decimal places or None, optional) If returnList is True this should be the length of the longest list. If returnList is False this should return its original value

### **Examples**

outputting.fancy\_logger(log\_file=None, log\_level=20, numpy\_error\_level=u'log') Sets up the style of logging for all the simulations

#### **Parameters**

- date\_string (basestring) The date the log will start at
- log\_file (string, optional) Provides the path the log will be written to. Default "./log.txt"
- log\_level ({logging.DEBUG, logging.INFO, logging.WARNING, logging.ERROR, logging.CRITICAL}) Defines the level of the log. Default logging.INFO
- numpy\_error\_level ({'log', 'raise'}) Defines the response to numpy errors. Default log. See numpy.seterr

**Returns close\_loggers** – Closes the logging systems that have been set up

Return type function

#### See also:

logging () The Python standard logging library

numpy.seterr() The function npErrResp is passed to for defining the response to numpy errors

```
outputting.file_name_generator(output_folder=None)
```

Keeps track of filenames that have been used and generates the next unused one

**Parameters output\_folder** (string, optional) – The folder into which the new file will be placed. Default is the current working directory

**Returns** new\_file\_name - Creates a new file with the name < handle> and the extension < extension>. It takes two string parameters: (handle, extension) and returns one fileName string

Return type function

### **Examples**

```
>>> file_name_gen = file_name_generator("./")
>>> file_name_gen("a", "b")
'./a.b'
>>> file_name_gen("a", "b")
'./a_1.b'
>>> file_name_gen("", "")
'./'
>>> file_name_gen = file_name_generator()
>>> fileName = file_name_gen("", "")
>>> fileName == os.getcwd()
False
```

#### outputting.flatDictKeySet(store, selectKeys=None)

Generates a dictionary of keys and identifiers for the new dictionary, including only the keys in the keys list. Any keys with lists will be split into a set of keys, one for each element in the original key.

These are named <key><location>

### **Parameters**

- **store** (*list of dicts*) The dictionaries would be expected to have many of the same keys. Any dictionary keys containing lists in the input have been split into multiple numbered keys
- **selectKeys** (*list of strings*, *optional*) The keys whose data will be included in the return dictionary. Default None, which results in all keys being returned

**Returns** keySet – The dictionary of keys to be extracted

Return type OrderedDict with values of OrderedDict, list or None

### See also:

```
reframeListDicts(), newFlatDict()
```

```
outputting.folder_path_cleaning(folder)
```

Modifies string file names from Windows format to Unix format if necessary and makes sure there is a / at the end.

Parameters folder (string) - The folder path

**Returns folder\_path** – The folder path

Return type basestring

```
outputting.folder_setup(label, date_string, pickle_data=False, base_path=None)
```

Identifies and creates the folder the data will be stored in

Folder will be created as "./Outputs/<sim\_label>\_<date>/". If that had previously been created then it is created as "./Outputs/<sim\_label>\_<date>\_no\_<#>/", where "<#>" is the first available integer.

A subfolder is also created with the name Pickle if pickle is true.

#### **Parameters**

- label (basestring) The label for the simulation
- date\_string (basestring) The date identifier
- pickle\_data (bool, optional) If true the data for each model, task and participant is recorded. Default is False
- base\_path (basestring, optional) The path into which the new folder will be placed. Default is current working directory

**Returns folder\_name** – The folder path that has just been created

Return type string

#### See also:

**newFile()** Creates a new file

saving() Creates the log system

outputting.listKeyGen (*data*, *maxListLen=None*, *returnList=False*, *abridge=False*) Identifies the columns necessary to convert a list into a table

#### **Parameters**

- data (numpy.ndarray or list) The list to be broken down
- maxListLen (int or float with no decimal places or None, optional) The length of the longest expected list. Only useful if returnList is True. Default None
- returnList (bool, optional) Defines if the lists will be broken into 1D lists or values. Default False, lists will be broken into values
- abridge (bool, optional) Defines if the final dataset will be a summary or the whole lot. If it is a summary, lists of more than 10 elements are removed. Default False, not abridged

#### Returns

- **returnList** (*None or list of tuples of ints or ints*) The list of co-ordinates for the elements to be extracted from the data. If None the list is used as-is.
- maxListLen (int or float with no decimal places or None, optional) If returnList is True this should be the length of the longest list. If returnList is False this should return its original value

### **Examples**

outputting.listSelection(data, loc)

Allows numpy array-like referencing of lists

#### **Parameters**

- data (list) The data to be referenced
- loc (tuple of integers) The location to be referenced

**Returns** selection – The referenced subset

Return type list

#### **Examples**

```
>>> listSelection([1, 2, 3], (0,))

1
>>> listSelection([[1, 2, 3], [4, 5, 6]], (0,))
[1, 2, 3]
>>> listSelection([[1, 2, 3], [4, 5, 6]], (0, 2))
3
```

outputting.newFlatDict(store, selectKeys=None, labelPrefix=u")

Takes a list of dictionaries and returns a dictionary of 1D lists.

If a dictionary did not have that key or list element, then 'None' is put in its place

#### **Parameters**

- **store** (list of dicts) The dictionaries would be expected to have many of the same keys. Any dictionary keys containing lists in the input have been split into multiple numbered keys
- **selectKeys** (*list of strings*, *optional*) The keys whose data will be included in the return dictionary. Default None, which results in all keys being returned
- labelPrefix (string) An identifier to be added to the beginning of each key string.

**Returns** newStore – The new dictionary with the keys from the keySet and the values as 1D lists with 'None' if the keys, value pair was not found in the store.

Return type dict

### **Examples**

outputting.newListDict(store, labelPrefix=u", maxListLen=0)

Takes a dictionary of numbers, strings, lists and arrays and returns a dictionary of 1D arrays.

If there is a single value, then a list is created with that value repeated

- store (dict) A dictionary of numbers, strings, lists, dictionaries and arrays
- **labelPrefix** (*string*) An identifier to be added to the beginning of each key string. Default empty string

**Returns newStore** – The new dictionary with the keys from the keySet and the values as 1D lists.

Return type dict

### **Examples**

```
>>> store = {'list': [1, 2, 3, 4, 5, 6]}
>>> newListDict(store)
OrderedDict([('list', [1, 2, 3, 4, 5, 6])])
>>> store = {'string': 'string'}
>>> newListDict(store)
OrderedDict([('string', ['string'])])
>>> store = {'dict': {1: {3: "a"}, 2: "b"}}
>>> newListDict(store)
OrderedDict([(u'dict_1_3', ['a']), (u'dict_2', ['b'])])
```

outputting.pad(values, maxListLen)

Pads a list with None

#### **Parameters**

- values (list) The list to be extended
- maxListLen (int) The number of elements the list needs to have

outputting.pickleLog(results, file\_name\_gen, label=u")

Stores the data in the appropriate pickle file in a Pickle subfolder of the outputting folder

#### **Parameters**

- results (dict) The data to be stored
- **file\_name\_gen** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string
- label (string, optional) A label for the results file

outputting.pickle\_write(data, handle, file\_name\_gen)

Writes the data to a pickle file

### **Parameters**

- data (object) Data to be written to the file
- handle (string) The name of the file
- **file\_name\_gen** (function) Creates a new file with the name <handle> and the extension <extension>. It takes two string parameters: (handle, extension) and returns one fileName string

## 6.10 utils module

#### 6.10.1 utils Module

Author Dominic Hunt

## **6.10.1.1 Functions**

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argProcess(**kwargs)	
callableDetails(item)	Takes a callable item and extracts the details.
callableDetailsString(item)	Takes a callable item and returns a string detailing the
	function.
date()	Provides a string of today's date
discountAverage(data, discount)	An accumulating mean
errorResp()	Takes an error that has been caught and returns the
	details as a string
<pre>find_class(class_name, class_folder,[,])</pre>	Finds and imports a class from a given folder.
<pre>find_function(function_name, function_folder)</pre>	Finds and imports a function from a given folder.
flatten(data)	Yields the elements in order from any N dimensional
	iterable
<pre>getClassArgs(inspected_class[, arg_ignore])</pre>	Finds the arguments that could be passed into the
	specified class
<pre>getClassAttributes(inspected_class[, ignore])</pre>	Finds the public attributes of the specified class
getFuncArgs(inspected_function)	Finds the arguments that could be passed into the
	specified function
kendalw(data[, ranked])	Calculates Kendall's W for a n*m array with n items
	and m 'judges'.
kendalwt(data[, ranked])	Calculates Kendall's W for a n*m array with n items
	and m 'judges'.
kendalwts(data[, ranked])	Calculates Kendall's W for a n*m array with n items
	and m 'judges'.
kldivergence(m0, m1, c0, c1)	Calculates the Kullback–Leibler divergence between
	two distributions using the means and covariances
listMerge(*args)	For merging lists with objects that are not solely num-
	bers
listMergeGen(*args)	Fast merging of lists of numbers
listMergeNP(*args)	Fast merging of lists of numbers
list_all_equal(data)	Checks if all of the elements of a list are the same.
mergeDatasetRepr(data[, dataLabel])	Take a list of dictionaries and turn it into a dictionary
	of lists of strings
mergeDatasets(data[, extend])	Take a list of dictionaries and turn it into a dictionary
	of lists of objects
mergeDicts(*args)	Merges any number of dictionaries with different keys
	into a new dict
mergeTwoDicts(x, y)	Given two dicts, merge them into a new dict as a shal-
•	low copy
movingaverage(data, windowSize[, edgeCorrec-	Average over an array
tion])	
runningAverage(data)	An accumulating mean
runningMean(oldMean, newValue, numValues)	A running mean
runningSTD(oldSTD, oldMean, newMean, new-	
Value)	param oldSTD The old running aver-
	age standard deviation
unique(seq[, idfun])	Finds the unique items in a list and returns them in
	order found.
varyingParams(intObjects, params)	Takes a list of models or tasks and returns a dictionary with only the parameters which vary and their values

# argProcess

utils.argProcess(\*\*kwargs)

#### callableDetails

```
utils.callableDetails(item)
```

Takes a callable item and extracts the details.

Currently only extracts things stored in item. Name and item. Params

```
Parameters item (callable item) -
```

Returns details - Contains the properties of the

Return type tuple pair with string and dictionary of strings

### **Examples**

```
>>> from utils import callableDetails
>>> def foo(): print("foo")
>>> foo.Name = "boo"
>>> callableDetails(foo)
('boo', None)
>>> foo.Params = {1: 2, 2: 3}
>>> callableDetails(foo)
('boo', {'1': '2', '2': '3'})
```

### callableDetailsString

```
utils.callableDetailsString(item)
```

Takes a callable item and returns a string detailing the function.

Currently only extracts things stored in item. Name and item. Params

```
Parameters item (callable item) -
```

**Returns description** – Contains the properties and name of the callable

Return type string

### **Examples**

```
>>> from utils import callableDetailsString
>>> def foo(): print("foo")
>>> foo.Name = "boo"
>>> callableDetailsString(foo)
'boo'
>>> foo.Params = {1: 2, 2: 3}
>>> callableDetailsString(foo)
'boo with 1: 2, 2: 3'
```

#### date

```
utils.date()
```

Provides a string of today's date

**Returns date** – The string is of the form [year]-[month]-[day]

Return type string

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#### discountAverage

```
utils.discountAverage(data, discount)
```

An accumulating mean

#### **Parameters**

- data(list or 1-D array of floats) The set of values to be averaged
- discount (float) The value by which each previous value is discounted

**Returns results** – The values from the moving average

Return type ndArray of length data

### **Examples**

```
>>> discountAverage([1, 2, 3, 4], 1)
array([1., 1.5, 2., 2.5])
>>> discountAverage([1, 2, 3, 4], 0.25)
array([1., 1.8, 2.71428571, 3.68235294])
```

#### errorResp

```
utils.errorResp()
```

Takes an error that has been caught and returns the details as a string

**Returns description** – Contains the description of the error

Return type string

### find class

utils.**find\_class** (class\_name, class\_folder, inherited\_class, excluded\_files=None)
Finds and imports a class from a given folder. Does not look in subfolders

#### **Parameters**

- class\_name (string) The name of the class to be used
- class\_folder (basestring) The path where the class is likely to be found
- inherited\_class (class) The class that the searched for class inherits from
- **excluded\_files** (*list*, *optional*) A list of modules to be excluded from the search. Can be described using portions of file names.

**Returns** sought\_class – The uninstansiated class sought

Return type inherited\_class

### find function

utils.**find\_function** (function\_name, function\_folder, excluded\_files=None) Finds and imports a function from a given folder. Does not look in subfolders

- function\_name (string) The name of the function to be used
- **function\_folder** (basestring) The path where the function is likely to be found

• **excluded\_files** (*list*, *optional*) – A list of modules to be excluded from the search. Can be described using portions of file names.

Returns sought\_class - The uninstansiated class sought

Return type inherited\_class

#### flatten

```
utils.flatten(data)
```

Yields the elements in order from any N dimensional iterable

```
Parameters data (iterable) -
```

**Yields ID** ((*string*, *list*)) – A pair containing the value at each location and the co-ordinates used to access them.

### **Examples**

```
>>> a = [[1, 2, 3], [4, 5, 6]]
>>> for i, loc in flatten(a): print(i, loc)
1 [0, 0]
2 [0, 1]
3 [0, 2]
4 [1, 0]
5 [1, 1]
6 [1, 2]
```

### getClassArgs

```
utils.getClassArgs (inspected_class, arg_ignore=[u'self'])
Finds the arguments that could be passed into the specified class
```

## getClassAttributes

```
utils.getClassAttributes (inspected_class, ignore=[u'self']) Finds the public attributes of the specified class
```

### getFuncArgs

```
utils.getFuncArgs(inspected_function)
```

Finds the arguments that could be passed into the specified function

Parameters inspected\_function -

Returns

## kendalw

```
utils.kendalw(data, ranked=False)
```

Calculates Kendall's W for a n\*m array with n items and m 'judges'.

### **Parameters**

• data (list or np.ndarray) - The data in the form of an n\*m array with n items and m 'judges'

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• ranked (bool, optional) - If the data has already been ranked or not. Default False

**Returns** w – The Kendall's W

Return type float

#### **Notes**

Based on Legendre, P. (2010). Coefficient of Concordance. In Encyclopedia of Research Design (pp. 164–169). 2455 Teller Road, Thousand Oaks California 91320 United States: SAGE Publications, Inc. http://doi.org/10.4135/9781412961288.n55

### **Examples**

```
>>> data = np.array([[2., 0., 5., 1.], [3., 3., 3., 4.], [1., 5., 3., 5.], [1., 4., 4., 2.], [2., 4., 5., 1.], [1., 0., 0., 2.]])
```

```
>>> kendalw(data)
0.22857142857142856
```

```
>>> data = np.array([[1, 1, 1, 1], [2, 2, 2, 2], [3, 3, 3, 3], [4, 4, 4, 4], __ 

[5, 5, 5, 5], [6, 6, 6, 6]])
```

```
>>> kendalw(data)
1.0
```

### kendalwt

utils.kendalwt(data, ranked=False)

Calculates Kendall's W for a n\*m array with n items and m 'judges'. Corrects for ties.

#### **Parameters**

- data (list or np.ndarray) The data in the form of an n\*m array with n items and m 'judges'
- ranked (bool, optional) If the data has already been ranked or not. Default False

**Returns** w – The Kendall's W

Return type float

#### **Notes**

Based on Legendre, P. (2010). Coefficient of Concordance. In Encyclopedia of Research Design (pp. 164–169). 2455 Teller Road, Thousand Oaks California 91320 United States: SAGE Publications, Inc. http://doi.org/10.4135/9781412961288.n55

## **Examples**

```
>>> data = np.array([[2., 0., 5., 1.], [3., 3., 3., 4.], [1., 5., 3., 5.], [1., 

\( \to 1., 4., 2. \], [2., 4., 5., 1.], [1., 0., 0., 2.]])
>>> kendalwt(data)
0.24615384615384617
```

```
>>> data = np.array([[1, 1, 1, 1], [2, 2, 2, 2], [3, 3, 3, 3], [4, 4, 4, 4], 

\(\to [5, 5, 5, 5], [6, 6, 6, 6]])\)
>>> kendalwt(data)
1.0
```

#### kendalwts

utils.kendalwts(data, ranked=False)

Calculates Kendall's W for a n\*m array with n items and m 'judges'. Corrects for ties.

#### **Parameters**

- data (list or np.ndarray) The data in the form of an n\*m array with n items and m 'judges'
- ranked (bool, optional) If the data has already been ranked or not. Default False

**Returns** w – The Kendall's W

Return type float

#### **Notes**

Based on Legendre, P. (2010). Coefficient of Concordance. In Encyclopedia of Research Design (pp. 164–169). 2455 Teller Road, Thousand Oaks California 91320 United States: SAGE Publications, Inc. http://doi.org/10.4135/9781412961288.n55

### **Examples**

```
>>> data = np.array([[2., 0., 5., 1.], [3., 3., 3., 4.], [1., 5., 3., 5.], [1., \dots 1., 4., 2.], [2., 4., 5., 1.], [1., 0., 0., 2.]])
>>> kendalwts(data)
0.24615384615384617
```

```
>>> data = np.array([[1, 1, 1, 1], [2, 2, 2, 2], [3, 3, 3, 3], [4, 4, 4, 4], 

\(\infty\)[5, 5, 5, 5], [6, 6, 6, 6]])
>>> kendalwts(data)
1.0
```

## kldivergence

#### utils.kldivergence (m0, m1, c0, c1)

Calculates the Kullback-Leibler divergence between two distributions using the means and covariances

#### **Parameters**

- m0 (array of N floats) The means of distribution 0
- m1 (array of N floats) The means of distribution 1
- **c0** (NxN array of floats) The covariance matrix for distribution 0
- c1 (NxN array of floats) The covariance matrix for distribution 1

**Returns** kl – The Kullback–Leibler divergence

Return type float

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## **listMerge**

```
utils.listMerge(*args)
```

For merging lists with objects that are not solely numbers

Parameters args (list of lists) - A list of 1D lists of objects

Returns combinations - An np.array with len(args) columns and a row for each combination

Return type np.array

### **Examples**

```
>>> listMerge([1, 2, 3], [5, 6, 7]).T
array([[1, 2, 3, 1, 2, 3, 1, 2, 3],
[5, 5, 5, 6, 6, 6, 7, 7, 7]])
```

### listMergeGen

```
utils.listMergeGen(*args)
```

Fast merging of lists of numbers

Parameters args (list of lists of numbers) - A list of 1D lists of numbers

**Yields combination** (numpy.array of 1 x len(args)) – Array of all combinations

### **Examples**

```
>>> for i in listMergeGen(0.7): print(repr(i))
array([0.7])
>>> for i in listMergeGen([0.7, 0.1]): print(repr(i))
array([0.7])
array([0.1])
>>> for i in listMergeGen([0.7, 0.1], [0.6]): print(repr(i))
array([0.7, 0.6])
array([0.1, 0.6])
>>> for i in listMergeGen([0.7, 0.1], []): print(repr(i))
```

```
>>> for i in listMergeGen([0.7, 0.1], 0.6): print(repr(i))
array([0.7, 0.6])
array([0.1, 0.6])
```

## **listMergeNP**

```
utils.listMergeNP(*args)
```

Fast merging of lists of numbers

Parameters args (list of lists of numbers) - A list of 1D lists of numbers

Returns combinations - An np.array with len(args) columns and a row for each combination

Return type np.array

### **Examples**

```
>>> listMergeNP([1, 2, 3], [5, 6, 7]).T
array([[1, 2, 3, 1, 2, 3, 1, 2, 3], [5, 5, 5, 6, 6, 6, 7, 7, 7]])
```

#### list\_all\_equal

```
utils.list_all_equal(data)
```

Checks if all of the elements of a list are the same.

Parameters data (list of 1D) - The list of elements to compare

Returns equivalence – True if the elements are all the same

Return type bool

#### **Notes**

Based on https://stackoverflow.com/questions/3844801

#### mergeDatasetRepr

```
utils.mergeDatasetRepr(data, dataLabel=u")
```

Take a list of dictionaries and turn it into a dictionary of lists of strings

#### **Parameters**

- data(list of dicts containing strings, lists or numbers)-
- dataLabel (string, optional) This string will be appended to the front of each key in the new dataset Default blank

**Returns** newStore – For each key a list will be formed of the string representations of each of the former key values.

Return type dictionary of lists of strings

## mergeDatasets

```
utils.mergeDatasets(data, extend=False)
```

Take a list of dictionaries and turn it into a dictionary of lists of objects

#### **Parameters**

- data(list of dicts containing strings, lists or numbers)-
- **extend** (bool, optional) If lists should be extended rather than appended. Default False

**Returns** newStore – For each key a list will be formed of the former key values. If a data set did not contain a key a value of None will be entered for it.

Return type dictionary of lists of objects

#### **Examples**

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```
>>> mergeDatasets(data, extend = True)
{'b': [array([7, 8, 9]), array([1, 2, 3]), array([4, 5, 6]), array([2, 3, 4])]}
>>> mergeDatasets(data)
{'b': [array([[7, 8, 9], [1, 2, 3]]), array([[4, 5, 6], [2, 3, 4]])]}
```

#### mergeDicts

```
utils.mergeDicts(*args)
```

Merges any number of dictionaries with different keys into a new dict

Precedence goes to key value pairs in latter dicts

```
Parameters args (list of dictionaries) -
```

Returns mergedDict

Return type dictionary

## mergeTwoDicts

```
utils.mergeTwoDicts(x, y)
```

Given two dicts, merge them into a new dict as a shallow copy

Assumes different keys in both dictionaries

#### **Parameters**

- x (dictionary) -
- y (dictionary) -

## Returns mergedDict

Return type dictionary

## movingaverage

```
utils.movingaverage(data, windowSize, edgeCorrection=False)
```

Average over an array

## **Parameters**

- data (list of floats) The data to average
- windowSize (int) The size of the window
- edgeCorrection (bool) If True the edges are repaired so that there is no unusual dropoff

## **Returns convolution**

Return type array

#### **Examples**

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```
>>> movingaverage([1, 1, 1, 1, 1], 3, edgeCorrection=True)
array([1., 1., 1., 1.])
```

## runningAverage

```
utils.runningAverage(data)
```

An accumulating mean

Parameters data (list or 1-D array of floats) - The set of values to be averaged

**Returns results** – The values from the moving average

Return type ndArray of length data

## **Examples**

```
>>> runningAverage([1,2,3,4])
array([1., 1.5, 2., 2.5])
```

## runningMean

utils.runningMean(oldMean, newValue, numValues)

A running mean

#### **Parameters**

- oldMean (float) The old running average mean
- newValue (float) The new value to be added to the mean
- numValues (int) The number of values in the new running mean once this value is included

Returns newMean - The new running average mean

Return type float

#### **Notes**

Based on Donald Knuth's Art of Computer Programming, Vol 2, page 232, 3rd edition and taken from https://www.johndcook.com/blog/standard\_deviation/

#### **Examples**

```
>>> runningMean(1, 2, 2)
1.5
>>> runningMean(1.5, 3, 3)
2.0
```

## runningSTD

utils.runningSTD (oldSTD, oldMean, newMean, newValue)

#### **Parameters**

• oldSTD (float) - The old running average standard deviation

- oldMean (float) The old running average mean
- **newMean** (float) The new running average mean
- **newValue** (float) The new value to be added to the mean

Returns newSTD - The new running average standard deviation

Return type float

#### **Notes**

Based on Donald Knuth's Art of Computer Programming, Vol 2, page 232, 3rd edition (which is based on B. P. Welford (2012) Note on a Method for Calculating Corrected Sums of Squares and Products, Technometrics, 4:3, 419-420, DOI: 10.1080/00401706.1962.10490022 This version is taken from https://www.johndcook.com/blog/standard\_deviation/

## **Examples**

```
>>> runningSTD(0, 1, 1.5, 2)
0.5
```

```
>>> runningSTD(0.5, 1.5, 2.0, 3)
2.0
```

## unique

```
utils.unique(seq, idfun=None)
```

Finds the unique items in a list and returns them in order found.

Inspired by discussion on http://www.peterbe.com/plog/uniqifiers-benchmark Notably f10 Andrew Dalke and f8 by Dave Kirby

## **Parameters**

- **seq** (an iterable object) The sequence from which the unique list will be compiled
- idfun (function, optional) A hashing function for transforming the items into the form that is to be compared. Default is the None

**Returns** result – The list of unique items

Return type list

## **Examples**

```
>>> a=list('ABeeE')
>>> unique(a)
['A', 'B', 'e', 'E']
```

```
>>> unique(a, lambda x: x.lower())
['A', 'B', 'e']
```

**Note:** Unless order is needed it is best to use list(set(seq))

## varyingParams

```
utils.varyingParams(intObjects, params)
```

Takes a list of models or tasks and returns a dictionary with only the parameters which vary and their values

#### 6.10.1.2 Classes

```
ClassNameError
FunctionNameError
```

#### ClassNameError

```
exception utils.ClassNameError
```

#### **FunctionNameError**

```
exception utils.FunctionNameError
```

## 6.10.1.3 Class Inheritance Diagram

```
Author Dominic Hunt

exception utils.ClassNameError
Bases: exceptions.Exception

exception utils.FunctionNameError
Bases: exceptions.Exception

utils.argProcess(**kwargs)

utils.callableDetails(item)
Takes a callable item and extracts the details.
```

Currently only extracts things stored in item.Name and item.Params

```
Parameters item (callable item) -
```

Returns details - Contains the properties of the

Return type tuple pair with string and dictionary of strings

## **Examples**

```
>>> from utils import callableDetails
>>> def foo(): print("foo")
>>> foo.Name = "boo"
>>> callableDetails(foo)
('boo', None)
>>> foo.Params = {1: 2, 2: 3}
>>> callableDetails(foo)
('boo', {'1': '2', '2': '3'})
```

## utils.callableDetailsString(item)

Takes a callable item and returns a string detailing the function.

Currently only extracts things stored in item. Name and item. Params

Parameters item (callable item) -

**Returns description** – Contains the properties and name of the callable

Return type string

#### **Examples**

```
>>> from utils import callableDetailsString
>>> def foo(): print("foo")
>>> foo.Name = "boo"
>>> callableDetailsString(foo)
'boo'
>>> foo.Params = {1: 2, 2: 3}
>>> callableDetailsString(foo)
'boo with 1: 2, 2: 3'
```

#### utils.date()

Provides a string of today's date

**Returns date** – The string is of the form [year]-[month]-[day]

Return type string

utils.discountAverage(data, discount)

An accumulating mean

#### **Parameters**

- data(list or 1-D array of floats) The set of values to be averaged
- **discount** (float) The value by which each previous value is discounted

**Returns results** – The values from the moving average

Return type ndArray of length data

#### **Examples**

```
>>> discountAverage([1, 2, 3, 4], 1)
array([1., 1.5, 2., 2.5])
>>> discountAverage([1, 2, 3, 4], 0.25)
array([1., 1.8, 2.71428571, 3.68235294])
```

```
utils.errorResp()
```

Takes an error that has been caught and returns the details as a string

Returns description – Contains the description of the error

**Return type** string

utils.**find\_class** (*class\_name*, *class\_folder*, *inherited\_class*, *excluded\_files=None*) Finds and imports a class from a given folder. Does not look in subfolders

#### **Parameters**

- class\_name (string) The name of the class to be used
- class\_folder (basestring) The path where the class is likely to be found
- inherited\_class (class) The class that the searched for class inherits from
- **excluded\_files** (*list*, *optional*) A list of modules to be excluded from the search. Can be described using portions of file names.

Returns sought\_class - The uninstansiated class sought

#### Return type inherited\_class

utils.find\_function (function\_name, function\_folder, excluded\_files=None)

Finds and imports a function from a given folder. Does not look in subfolders

#### **Parameters**

- function\_name (string) The name of the function to be used
- function\_folder (basestring) The path where the function is likely to be found
- **excluded\_files** (*list*, *optional*) A list of modules to be excluded from the search. Can be described using portions of file names.

**Returns** sought\_class – The uninstansiated class sought

**Return type** inherited\_class

```
utils.flatten(data)
```

Yields the elements in order from any N dimensional iterable

```
Parameters data (iterable) -
```

**Yields ID** ((string, list)) – A pair containing the value at each location and the co-ordinates used to access them.

#### **Examples**

```
>>> a = [[1, 2, 3], [4, 5, 6]]
>>> for i, loc in flatten(a): print(i, loc)

1 [0, 0]
2 [0, 1]
3 [0, 2]
4 [1, 0]
5 [1, 1]
6 [1, 2]
```

```
utils.getClassArgs(inspected_class, arg_ignore=[u'self'])
```

Finds the arguments that could be passed into the specified class

```
utils.getClassAttributes(inspected_class, ignore=[u'self'])
```

Finds the public attributes of the specified class

```
utils.getFuncArgs(inspected_function)
```

Finds the arguments that could be passed into the specified function

Parameters inspected\_function -

## Returns

```
utils.kendalw(data, ranked=False)
```

Calculates Kendall's W for a n\*m array with n items and m 'judges'.

#### **Parameters**

- data (list or np.ndarray) The data in the form of an n\*m array with n items and m 'judges'
- ranked (bool, optional) If the data has already been ranked or not. Default False

**Returns** w – The Kendall's W

Return type float

#### **Notes**

Based on Legendre, P. (2010). Coefficient of Concordance. In Encyclopedia of Research Design (pp. 164–169). 2455 Teller Road, Thousand Oaks California 91320 United States: SAGE Publications, Inc. http://doi.org/10.4135/9781412961288.n55

## **Examples**

```
>>> data = np.array([[2., 0., 5., 1.], [3., 3., 3., 4.], [1., 5., 3., 5.], [1., 4., 4., 2.], [2., 4., 5., 1.], [1., 0., 0., 2.]])
```

```
>>> kendalw(data)
0.22857142857142856
```

```
>>> data = np.array([[1, 1, 1, 1], [2, 2, 2, 2], [3, 3, 3, 3], [4, 4, 4, 4], ... 

\[ \( \) [5, 5, 5], [6, 6, 6, 6]])
```

```
>>> kendalw(data)
1.0
```

#### utils.kendalwt(data, ranked=False)

Calculates Kendall's W for a n\*m array with n items and m 'judges'. Corrects for ties.

#### **Parameters**

- data (list or np.ndarray) The data in the form of an n\*m array with n items and m 'judges'
- ranked (bool, optional) If the data has already been ranked or not. Default False

Returns w – The Kendall's W

Return type float

#### **Notes**

Based on Legendre, P. (2010). Coefficient of Concordance. In Encyclopedia of Research Design (pp. 164–169). 2455 Teller Road, Thousand Oaks California 91320 United States: SAGE Publications, Inc. http://doi.org/10.4135/9781412961288.n55

#### **Examples**

```
>>> data = np.array([[2., 0., 5., 1.], [3., 3., 3., 4.], [1., 5., 3., 5.], [1., 

\( \to 1., 4., 2. \)], [2., 4., 5., 1.], [1., 0., 0., 2.]])
>>> kendalwt(data)
0.24615384615384617
```

```
>>> data = np.array([[1, 1, 1, 1], [2, 2, 2, 2], [3, 3, 3, 3], [4, 4, 4, 4], 

\( \to [5, 5, 5], [6, 6, 6, 6]]) \)
>>> kendalwt(data)
1.0
```

## utils.kendalwts(data, ranked=False)

Calculates Kendall's W for a n\*m array with n items and m 'judges'. Corrects for ties.

#### **Parameters**

- data (list or np.ndarray) The data in the form of an n\*m array with n items and m 'judges'
- ranked (bool, optional) If the data has already been ranked or not. Default False

**Returns** w – The Kendall's W

Return type float

#### **Notes**

Based on Legendre, P. (2010). Coefficient of Concordance. In Encyclopedia of Research Design (pp. 164–169). 2455 Teller Road, Thousand Oaks California 91320 United States: SAGE Publications, Inc. http://doi.org/10.4135/9781412961288.n55

## **Examples**

```
>>> data = np.array([[2., 0., 5., 1.], [3., 3., 3., 4.], [1., 5., 3., 5.], [1., 

\( \to 1., 4., 2. \], [2., 4., 5., 1.], [1., 0., 0., 2.]])
>>> kendalwts(data)
0.24615384615384617
```

#### utils.kldivergence (m0, m1, c0, c1)

Calculates the Kullback-Leibler divergence between two distributions using the means and covariances

#### **Parameters**

- m0 (array of N floats) The means of distribution 0
- m1 (array of N floats) The means of distribution 1
- ${\tt c0}$  (NxN array of floats) The covariance matrix for distribution 0
- c1 (NxN array of floats) The covariance matrix for distribution 1

**Returns** kl – The Kullback–Leibler divergence

Return type float

#### utils.listMerge(\*args)

For merging lists with objects that are not solely numbers

Parameters args (list of lists) - A list of 1D lists of objects

Returns combinations – An np.array with len(args) columns and a row for each combination

Return type np.array

## **Examples**

#### utils.listMergeGen(\*args)

Fast merging of lists of numbers

Parameters args (list of lists of numbers) - A list of 1D lists of numbers

**Yields combination** ( $numpy.array of 1 \times len(args)$ ) – Array of all combinations

## **Examples**

```
>>> for i in listMergeGen(0.7): print(repr(i))
array([0.7])
>>> for i in listMergeGen([0.7, 0.1]): print(repr(i))
array([0.7])
array([0.1])
>>> for i in listMergeGen([0.7, 0.1], [0.6]): print(repr(i))
array([0.7, 0.6])
array([0.1, 0.6])
>>> for i in listMergeGen([0.7, 0.1], []): print(repr(i))
```

```
>>> for i in listMergeGen([0.7, 0.1], 0.6): print(repr(i))
array([0.7, 0.6])
array([0.1, 0.6])
```

#### utils.listMergeNP(\*args)

Fast merging of lists of numbers

Parameters args (list of lists of numbers) - A list of 1D lists of numbers

Returns combinations – An np.array with len(args) columns and a row for each combination

Return type np.array

#### **Examples**

```
>>> listMergeNP([1, 2, 3], [5, 6, 7]).T
array([[1, 2, 3, 1, 2, 3, 1, 2, 3], [5, 5, 5, 6, 6, 6, 7, 7, 7]])
```

#### utils.list\_all\_equal(data)

Checks if all of the elements of a list are the same.

Parameters data (list of 1D) - The list of elements to compare

Returns equivalence – True if the elements are all the same

Return type bool

## Notes

Based on https://stackoverflow.com/questions/3844801

```
utils.mergeDatasetRepr(data, dataLabel=u")
```

Take a list of dictionaries and turn it into a dictionary of lists of strings

## **Parameters**

- data(list of dicts containing strings, lists or numbers)-
- dataLabel (string, optional) This string will be appended to the front of each key in the new dataset Default blank

**Returns** newStore – For each key a list will be formed of the string representations of each of the former key values.

**Return type** dictionary of lists of strings

```
utils.mergeDatasets(data, extend=False)
```

Take a list of dictionaries and turn it into a dictionary of lists of objects

#### **Parameters**

- data(list of dicts containing strings, lists or numbers)-
- **extend** (bool, optional) If lists should be extended rather than appended. Default False

**Returns** newStore – For each key a list will be formed of the former key values. If a data set did not contain a key a value of None will be entered for it.

**Return type** dictionary of lists of objects

## **Examples**

#### utils.mergeDicts(\*args)

Merges any number of dictionaries with different keys into a new dict

Precedence goes to key value pairs in latter dicts

```
Parameters args (list of dictionaries) -
```

Returns mergedDict

Return type dictionary

#### utils.mergeTwoDicts(x, y)

Given two dicts, merge them into a new dict as a shallow copy

Assumes different keys in both dictionaries

#### **Parameters**

- x (dictionary) -
- y (dictionary) -

#### Returns mergedDict

**Return type** dictionary

```
utils.movingaverage(data, windowSize, edgeCorrection=False)
```

Average over an array

## **Parameters**

- data (list of floats) The data to average
- windowSize (int) The size of the window
- edgeCorrection (bool) If True the edges are repaired so that there is no unusual dropoff

**Returns convolution** 

#### Return type array

#### **Examples**

#### utils.runningAverage(data)

An accumulating mean

Parameters data (list or 1-D array of floats) - The set of values to be averaged

**Returns** results – The values from the moving average

Return type ndArray of length data

#### **Examples**

```
>>> runningAverage([1,2,3,4])
array([1. , 1.5, 2. , 2.5])
```

## utils.runningMean(oldMean, newValue, numValues)

A running mean

#### **Parameters**

- oldMean (float) The old running average mean
- newValue(float) The new value to be added to the mean
- **numValues** (*int*) The number of values in the new running mean once this value is included

Returns newMean - The new running average mean

Return type float

#### **Notes**

Based on Donald Knuth's Art of Computer Programming, Vol 2, page 232, 3rd edition and taken from https://www.johndcook.com/blog/standard\_deviation/

## **Examples**

```
>>> runningMean(1, 2, 2)
1.5
>>> runningMean(1.5, 3, 3)
2.0
```

#### utils.runningSTD (oldSTD, oldMean, newMean, newValue)

## **Parameters**

- oldSTD (float) The old running average standard deviation
- oldMean (float) The old running average mean
- **newMean** (float) The new running average mean

• **newValue** (float) – The new value to be added to the mean

Returns newSTD - The new running average standard deviation

Return type float

#### **Notes**

Based on Donald Knuth's Art of Computer Programming, Vol 2, page 232, 3rd edition (which is based on B. P. Welford (2012) Note on a Method for Calculating Corrected Sums of Squares and Products, Technometrics, 4:3, 419-420, DOI: 10.1080/00401706.1962.10490022 This version is taken from https://www.johndcook.com/blog/standard\_deviation/

#### **Examples**

```
>>> runningSTD(0, 1, 1.5, 2)
0.5

>>> runningSTD(0.5, 1.5, 2.0, 3)
```

## utils.unique(seq, idfun=None)

Finds the unique items in a list and returns them in order found.

Inspired by discussion on http://www.peterbe.com/plog/uniqifiers-benchmark Notably f10 Andrew Dalke and f8 by Dave Kirby

#### **Parameters**

- **seq** (an iterable object) The sequence from which the unique list will be compiled
- idfun (function, optional) A hashing function for transforming the items into the form that is to be compared. Default is the None

**Returns** result – The list of unique items

Return type list

## **Examples**

```
>>> a=list('ABeeE')
>>> unique(a)
['A', 'B', 'e', 'E']
```

```
>>> unique(a, lambda x: x.lower())
['A', 'B', 'e']
```

**Note:** Unless order is needed it is best to use list(set(seq))

#### utils.varyingParams(intObjects, params)

Takes a list of models or tasks and returns a dictionary with only the parameters which vary and their values

# $\mathsf{CHAPTER}\ 7$

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