

Technical University of Košice
Faculty of Electrical Engineering and Informatics

**Learning Using Teleoperation on
Humanoid Robotic Systems**

Appendix B

Reference Guide

Bachelor's Thesis

Study Programme: Cybernetics
Field of study: 9.2.7 Cybernetics
Department: Department of Cybernetics and Artificial Intelligence (KKUI)
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Košice 2015

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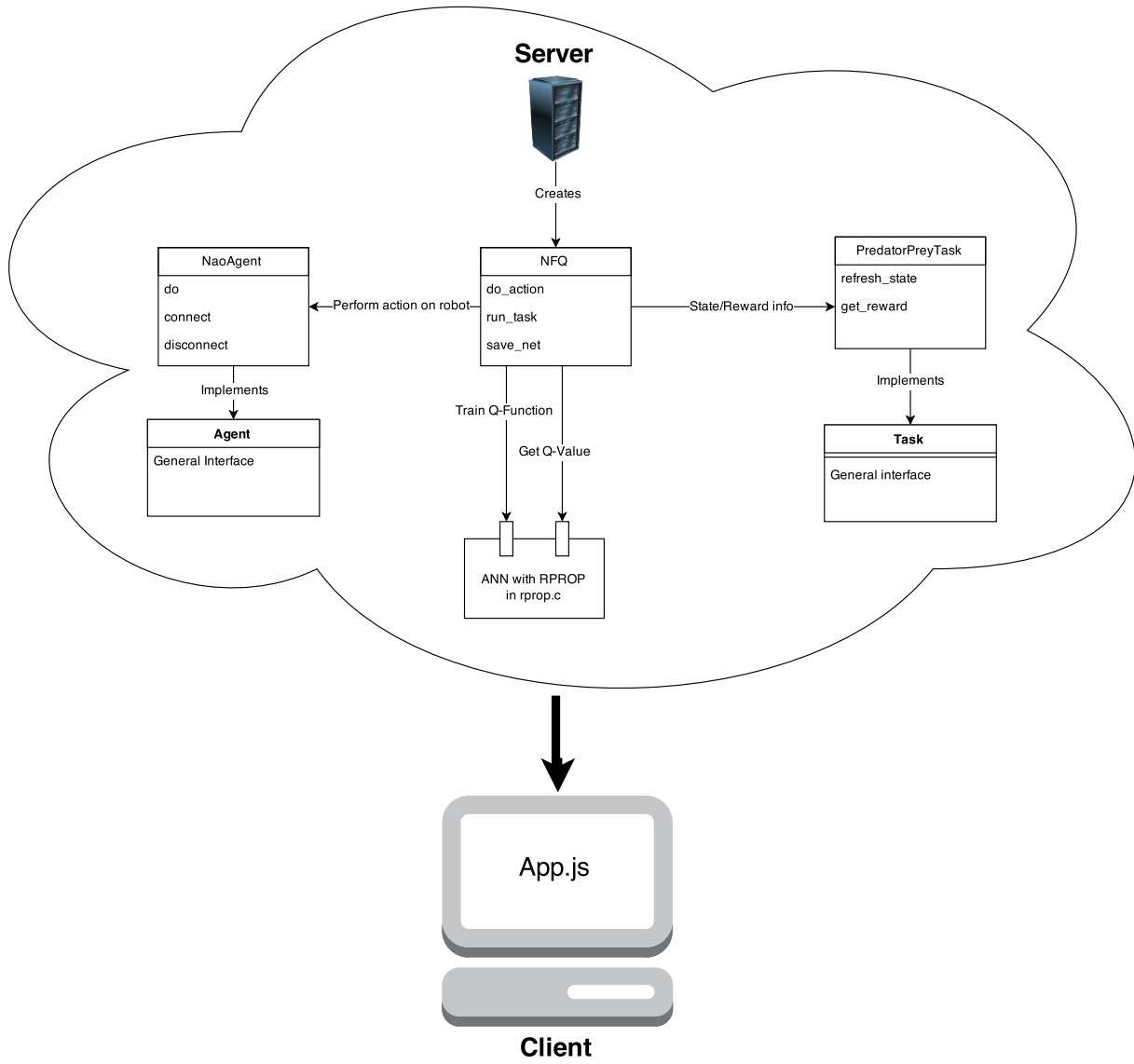


Figure 1: Class/dependency diagram

1 Data Structure Documentation

1.1 Agent Class Reference

Provides a default interface for [Agent](#) class.

Inherited by [NaoAgent](#).

Public Member Functions

- def [connect](#)
This method should handle connection to a real world agent.
- def [disconnect](#)
This methods should handle disconnection from a real world agent.
- def [do](#)
This methods handles performing selected action according to action number on a real world agent.

1.1.1 Detailed Description

Provides a default interface for [Agent](#) class.

1.1.2 Member Function Documentation

1.1.2.1 def connect (self)

This method should handle connection to a real world agent.

This method must be implemented

1.1.2.2 def disconnect (self)

This methods should handle disconnection from a real world agent.

This method must be implemented

1.1.2.3 def do (self, action_number)

This methods handles performing selected action according to action number on a real world agent.

This method must be implemented

Parameters

<i>action_number</i>	Number of action to be performed
----------------------	----------------------------------

The documentation for this class was generated from the following file:

- [Agent.py](#)

1.2 ann_t Struct Reference

Struct representing a neural network.

Data Fields

- double *x* [Nx]
- double *y* [Nx]

- double [delta](#) [Nx]
- double [prevGrad](#) [Nx][Nx]
- double [currGrad](#) [Nx][Nx]
- double [updateValue](#) [Nx][Nx]
- double [wDelta](#) [Nx][Nx]
- double [w](#) [Nx][Nx]
- double [dv](#) [Nou]

1.2.1 Detailed Description

Struct representing a neural network.

Container for a complex MLP structure.

1.2.2 Field Documentation

1.2.2.1 double [currGrad](#)[Nx][Nx]

Weight current error gradient

1.2.2.2 double [delta](#)[Nx]

Delta value on neurons

1.2.2.3 double [dv](#)[Nou]

Target value on output neurons

1.2.2.4 double [prevGrad](#)[Nx][Nx]

Weight error gradient from last step

1.2.2.5 double [updateValue](#)[Nx][Nx]

Update value according to RPROP algorithm for each weight

1.2.2.6 double [w](#)[Nx][Nx]

Weights matrix

1.2.2.7 double [wDelta](#)[Nx][Nx]

Delta of weights change

1.2.2.8 double [x](#)[Nx]

Input of neurons

1.2.2.9 double [y](#)[Nx]

Output of neurons

The documentation for this struct was generated from the following file:

- [rprop.c](#)

1.3 MainHandler Class Reference

Operates a web server for web application.

Inherits RequestHandler.

Public Member Functions

- def [get](#)
Handles asynchronous web request and renders a web app.

1.3.1 Detailed Description

Operates a web server for web application.

1.3.2 Member Function Documentation

1.3.2.1 def get (request)

Handles asynchronous web request and renders a web app.

Parameters

<i>request</i>	Web request received
----------------	----------------------

The documentation for this class was generated from the following file:

- server.py

1.4 NaoAgent Class Reference

Implementation of Agent interface on Nao robot in Webots simulator.

Inherits [Agent](#).

Public Member Functions

- def [__init__](#)
Constructor method setups default parameters.
- def [connect](#)
Method handles connection to simulated robot and initialization of its features.
- def [disconnect](#)
Disconnects from simulated Nao.
- def [do](#)
Perform specified action from the set of all available motions.
- def [go_forward](#)
This method performs movements along the X-axis, with 0.25m distance.
- def [go_right](#)
This method performs a rotation 30 degrees to the right.
- def [go_left](#)
This method perform movement 30 degrees left.
- def [StiffnessOn](#)
Sets the stiffnes of Nao's joints to maximal value, to make him ready to perform motions.

Data Fields

- [robot_ip](#)
Default connection IP address.
- [robot_port](#)
Default connection port.

1.4.1 Detailed Description

Implementation of Agent interface on Nao robot in Webots simulator.

1.4.2 Member Function Documentation

1.4.2.1 `def connect (self, ip = None, port = None)`

Method handles connection to simulated robot and initialization of its features.

It connection to the robot on specified Ip:port and initializes the robot to the init position, preparing it for motions.

Parameters

<i>ip</i>	IP address of a robot
<i>port</i>	Port number of a robot

Returns

True, if connection was succesful, else False

1.4.2.2 `def do (self, action_number)`

Perform specified action from the set of all available motions.

Parameters

<i>action_number</i>	specifies position of action in the action list
----------------------	---

1.4.2.3 `def StiffnessOn (self, proxy)`

Sets the stiffnes of Nao's joints to maximal value, to make him ready to perform motions.

Parameters

<i>proxy</i>	specifies a proxy(path) for setting the joint's stiffness
--------------	---

The documentation for this class was generated from the following file:

- NaoAgent.py

1.5 NFQ Class Reference

This class handles mechanism behind [NFQ](#) learning and also decision process.

Public Member Functions

- `def __init__`
Constructor of the class.
- `def save_net`

- *Saves current network to database.*
- def `load_net`
Loads and update current network weights with the network saved in database.
- def `load_tasks`
Loads a list of all previously learned tasks from a database.
- def `load_samples`
Loads a previously collected samples from the database and update current ones with them.
- def `write_samples`
Upload current training samples set into database in JSON format.
- def `sample_to_patterns`
This method provides basic transformation from the training sample into training patterns.
- def `get_training_set_from_samples`
Transform whole set of training samples into training patterns according to the proposed algorithm.
- def `learn`
The key method of this class, if target state is reached, this method updates a current Q-function.
- def `choose_controller`
This method controls the decision process according to current autonomy level.
- def `run_task`
Runs a task saved in database with a specific name.
- def `make_step_task`
This methods handles steps and reward counting during performing loaded tasks.
- def `do_action`
Method representing an elementary step of agent in the environment.
- def `getQ`
General method for acquiring the Q-value for current state-action pair.
- def `minQ`
Gets a minimum Q-value in current state for available actions.
- def `minQ_index`
Gets an index of action with minimal Q-value in current state.
- def `maxQ`
Gets a maximal Q-value in current state for available actions.
- def `maxQ_index`
Gets an index of action with a maximal Q-value in current state.
- def `get_target`
Calculates a target Q-value according to Bellman equation mentioned in the work.

Data Fields

- `agent`
An Agent performs actions in the environment.
- `task`
A Task object provides reward function and also environment state update.
- `connected`
State variable signaling if Agent is connected to the real robot.
- `redis_server`
Connection to the Redis database.
- `epoch`
Episode counter.
- `discount`
Discount factor constant for learning process.
- `network`

- Holds weights of the neural network.*

 - [samples](#)

Set of training samples in a form of tuples according to work.
 - [training_set](#)

Set of training pattern, which can be applied directly to the neural network.
 - [state](#)

Representation of environment state.
 - [step_counter](#)

Counts steps made during current episode.

Static Public Attributes

- list [action_codes](#)

Encoding of action number for purposes of neural network input.

1.5.1 Detailed Description

This class handles mechanism behind [NFQ](#) learning and also decision process.

It contains definitions for methods that handles communication with database, operating the neural network, performing tasks and finally the [NFQ](#) learning and decision procedure.

```
@author Jan Gamec
@version 1.0
```

1.5.2 Constructor & Destructor Documentation

1.5.2.1 `def __init__(self, discount = 0.99)`

Constructor of the class.

Handles basic configuration of the [NFQ](#) module and its constants. It's arranging connection with Redis database and initializes Agent and Task objects, that are necessary for algorithm. It handles initialization of neural network keeping learned knowledge if no record of network configuration is in database. It also loads information about previous learning process from the database and parses previous samples into training patterns.

Parameters

<i>discount</i>	Discount factor constant used during learning
-----------------	---

1.5.3 Member Function Documentation

1.5.3.1 `def choose_controller(self)`

This method controls the decision process according to current autonomy level.

It either asks a human operator for action or decides according to the policy

1.5.3.2 `def do_action(self, action_num, autonomy = False)`

Method representing an elementary step of agent in the environment.

Given the action number, method make an Agent do selected action and collect a sample information. Samples are collected in a tuples according to work.

```
[state at t, action number, state at t+1, epoch, step]
```

If total autonomy (in a case of performing leaded task) is off, sample is appended to current sample set. This method then delegates decision process back to the [learn\(\)](#) method in a recursive way

Parameters

<i>action_num</i>	Number of action in the action set
<i>autonomy</i>	Default value is False. During autonomy samples are not stored

1.5.3.3 def get_target (self, state = None, step = None)

Calculates a target Q-value according to Bellman equation mentioned in the work.

Parameters

<i>state</i>	Represents an environment state. Default is current state.
<i>step</i>	Time step. Default value is step count in current episode

Returns

Returns the target Q-value for a neural network training

1.5.3.4 def get_training_set_from_samples (self)

Transform whole set of training samples into training patterns according to the proposed algorithm.

This method updates current training set used for training with the generated one

1.5.3.5 def getQ (self, state, operator)

General method for acquiring the Q-value for current state-action pair.

This method runs a neural network forward in order to get Q-value for current state

Parameters

<i>state</i>	Represents state of environment
<i>operator</i>	Function handle, e.g. we want minimal Q-value in current state for available actions, we use function min()

Returns

A pair, where first value corresponds to the actual Q-value and second is the index of the action having this value

1.5.3.6 def learn (self)

The key method of this class, if target state is reached, this method updates a current Q-function.

Update is realised training a neural network with a training patternset generated from samples collected during previous episodes. It also updates information about the learning progress to the database (Episode no., Number of steps) It delegates recursive control process to the [choose_controller](#)

See also

[choose_controller](#) method

1.5.3.7 def load_net (self, name = 'net')

Loads and update current network weights with the network saved in database.

Parameters

<i>name</i>	Specifies the name of network in the database
-------------	---

1.5.3.8 def load_tasks (self)

Loads a list of all previously learned tasks from a database.

Returns

List of all learned tasks

1.5.3.9 def make_step_task (self, reward = 0)

This methods handles steps and reward counting during performing loaded tasks.

It works in the recursive way. If target area or step limit is not reached, agent make a step and cumulate the reward. The method calls itself until target state or step limit is reached.

Parameters

<i>reward</i>	Represents current cumulative reward
---------------	--------------------------------------

Returns

Reward after end of task performance

1.5.3.10 def maxQ (self, state)

Gets a maximal Q-value in current state for available actions.

Parameters

<i>state</i>	Represents state of environment
--------------	---------------------------------

Returns

maximal Q-value for current state

1.5.3.11 def maxQ_index (self, state)

Gets an index of action with a maximal Q-value in current state.

Parameters

<i>state</i>	Represents state of environment
--------------	---------------------------------

Returns

Index of the action with a maximal Q-value

1.5.3.12 def minQ (self, state)

Gets a minimum Q-value in current state for available actions.

Parameters

<i>state</i>	Represents state of environment
--------------	---------------------------------

Returns

Minimal Q-value for current state

1.5.3.13 def minQ_index (self, state)

Gets an index of action with minimal Q-value in current state.

Parameters

<i>state</i>	Represents state of environment
--------------	---------------------------------

Returns

Index of the action with minimal Q-value

1.5.3.14 def run_task (self, name)

Runs a task saved in database with a specific name.

The learned task is represented by its NN weights configuration which are loaded and replaces current network configuration during the task performance. Original network is restored after then.

Parameters

<i>name</i>	Specifies a name of task saved in database
-------------	--

Returns

Returns cumulative reward after task was performed

1.5.3.15 def sample_to_patterns (self, sample)

This method provides basic transformation from the training sample into training patterns.

Training patterns are generated according to the algorithm in the work, where for action selected in sample pattern with minimal Q-value is generated and for all other actions patterns with maximal Q are generated

Parameters

<i>sample</i>	Training sample in the form of tuple
---------------	--------------------------------------

Returns

List of training patterns

1.5.3.16 def save_net (self, name = 'net')

Saves current network to database.

Parameters

<i>name</i>	Specifies name for the network
-------------	--------------------------------

The documentation for this class was generated from the following file:

- Nfq.py

1.6 PredatorPreyTask Class Reference

Implementation of Task interface for a so called Predator-Prey task.

Inherits [Task](#).

Public Member Functions

- def [__init__](#)
Constructor method.
- def [get_reward](#)
A reward function.
- def [refresh_state](#)
Update current state loading the data from database.

Data Fields

- [database](#)
Handles connection to the Redis database.
- [state](#)
Stores current state.

1.6.1 Detailed Description

Implementation of Task interface for a so called Predator-Prey task.

1.6.2 Member Function Documentation

1.6.2.1 `def get_reward (self, state)`

A reward function.

If agent is closer to target than 0.5m cca 0.15 normalized and rotated less than 30 degrees, its considered to be a target state so the reward is 0. Else reward is equal 0.01

Parameters

<i>state</i>	Current environment state
--------------	---------------------------

Returns

Returns a reward for a give state

1.6.2.2 `def refresh_state (self)`

Update current state loading the data from database.

Returns

Returns current environment state

The documentation for this class was generated from the following file:

- PredatorPreyTask.py

1.7 Task Class Reference

Provides a default interface for Tasks used in NFQ.

Inherited by [PredatorPreyTask](#).

Public Member Functions

- def [get_reward](#)
Reward function.
- def [refresh_state](#)
Method for updating environment state.

1.7.1 Detailed Description

Provides a default interface for Tasks used in NFQ.

1.7.2 Member Function Documentation

1.7.2.1 `def get_reward (self, state)`

Reward function.

This method has to be implemented

1.7.2.2 `def refresh_state (self)`

Method for updating environment state.

This method has to be implemented

The documentation for this class was generated from the following file:

- Task.py

1.8 WSHandler Class Reference

Handles websocket communication with web app.

Inherits WebSocketHandler.

Public Member Functions

- def [open](#)
Handles all new connections.
- def [on_message](#)
Handles various type of messages received over WS.
- def [on_close](#)
Handles close of WS connection from client.

1.8.1 Detailed Description

Handles websocket communication with web app.

1.8.2 Member Function Documentation

1.8.2.1 `def on_message (self, json_message)`

Handles various type of messages received over WS.

It distinct 3 main commands:

- Performing an action.
- Saving current task.
- Running loaded task.

It also responds with corresponding data

Parameters

<code>json_message</code>	Data received in WS request (like action number)
---------------------------	--

1.8.2.2 `def open (self)`

Handles all new connections.

Initializes a new NFQ instance for each new WS connection

The documentation for this class was generated from the following file:

- server.py

2 File Documentation

2.1 `_rprop.c` File Reference

File containing python wrapper for a C MLP with RPROP.

```
#include <Python.h>
#include <numpy/arrayobject.h>
#include "rprop.c"
```

Functions

- static PyObject * `rprop_learn2` (PyObject *self, PyObject *args)
Function wrapping a learning process of a neural network.
- static PyObject * `rprop_run2` (PyObject *self, PyObject *args)
Function wrapping a function that runs a neural network forward.
- static PyObject * `rprop_init` (PyObject *self, PyObject *args)
Function wrapping a initialization of a network.
- PyMODINIT_FUNC `init_rprop` (void)
Initializes python wrapping functions.

Variables

- static PyMethodDef `module_methods` []

2.1.1 Detailed Description

File containing python wrapper for a C MLP with RPROP.

Author

Jan Gamec

Date

24 May 2015 This file serves as a wrapper for functionality in [rprop.c](#) . After building this script, it can be imported as a standalone python module. The module can be build by following command: `python setup.py build_ext -inplace`

The setup.py file **is required** to be in the same directory as this script!. In order to change configuration of network, please see documentation for [rprop.c](#) file.

See also

[rprop.c](#)

2.1.2 Function Documentation

2.1.2.1 `static PyObject * rprop_init (PyObject * self, PyObject * args) [static]`

Function wrapping a initialization of a network.

Function in python has no input arguments. It just creates new network with random weights initialization and return this weights as a numpy array.

Parameters

<i>self</i>	Object pointer
<i>args</i>	Holds all arguments that can be passed to function in python

Returns

A numpy array holding new weights of the created network

2.1.2.2 `static PyObject * rprop_learn2 (PyObject * self, PyObject * args) [static]`

Function wrapping a learning process of a neural network.

Function in python accepts following arguments:

- **num_of_epochs** Number of training epochs
- **patternSet** A numpy array of training patterns
- **weights** A numpy array of neural network weights

Parameters

<i>self</i>	Object pointer
<i>args</i>	Holds all arguments that can be passed to function in python

Returns

A numpy array holding new weights

2.1.2.3 static PyObject * rprop_run2 (PyObject * self, PyObject * args) [static]

Function wrapping a function that runs a neural network forward.

It runs network forward and return values on output neurons. Function in python accepts following arguments:

- **pattern** A numpy array representing one input pattern
- **weights** A numpy array of neural network weights

Parameters

<i>self</i>	Object pointer
<i>args</i>	Holds all arguments that can be passed to function in python

Returns

An Q-value on the output neuron with double precision

2.1.3 Variable Documentation

2.1.3.1 PyMethodDef module_methods[] [static]

Initial value:

```
= {
  {"learn", rprop_learn2, METH_VARARGS, learn_docstring},
  {"run", rprop_run2, METH_VARARGS, run_docstring},
  {"init", rprop_init, METH_VARARGS, init_docstring},
  {NULL, NULL, 0, NULL}
}
```

Definition of all functions available after the build.

2.2 app.js File Reference

Javascript application for visualisation of NFQ algorithm.

Functions

- function `connectRobot ()`
Initializes new websocket connection to server.
- function `serverResponse (response)`
Parses received message object from websocket connection.
- function `showIntro (msg)`
Displays a introduction page.
- function `showControls ()`
Displays a NFQ controls and state information.
- function `saveTask ()`
Request saving current task progress to the database.
- function `loadTasks (tasks)`
Creates a table of all available tasks from DB.
- function `runTask (task)`
Requests a server to perform a task on a robot.
- function `doAction (action_num)`
Order a robot to do selected action.
- function `enableAllButtons ()`

- function `disableAllButtons` ()
Enables all buttons on page.
- function `updateState` (distance, angle)
Disables all buttons on the page to block request until the current action is finished.
- function `updateState` (distance, angle)
Updates current state information with a new, received over Websocket.

2.2.1 Detailed Description

Javascript application for visualisation of NFQ algorithm.

Author

Jan Gamec

Date

24 May 2015

This application is served as a webpage when running the server application.

2.2.2 Function Documentation

2.2.2.1 function `connectRobot` ()

Initializes new websocket connection to server.

Establishes a connection to robot through opening a new websocket connection to server. In addition it binds corresponding callbacks for websocket events. When a new message is received, function `serverResponse` is called, with a received object.

2.2.2.2 function `disableAllButtons` ()

Disables all buttons on the page to block request until the current action is finished.

2.2.2.3 function `doAction` (*action_num*)

Order a robot to do selected action.

Handles click events on each movement arrows in order to move the "real" robot.

Parameters

<i>action_num</i>	Number of action from action set
-------------------	----------------------------------

2.2.2.4 function `enableAllButtons` ()

Enables all buttons on page.

2.2.2.5 function `loadTasks` (*tasks*)

Creates a table of all available tasks from DB.

Parameters

<i>tasks</i>	List of task names from database
--------------	----------------------------------

2.2.2.6 function `runTask` (*task*)

Requests a server to perform a task on a robot.

Parameters

<i>task</i>	Name of the task to be performed
-------------	----------------------------------

2.2.2.7 function saveTask ()

Request saving current task progress to the database.

Takes a name from corresponding input box, requests a server to save the task in DB.

2.2.2.8 function serverResponse (*response*)

Parses received message object from websocket connection.

This function handles basically 4 types of responses and reactions to them:

- Confirmation about succesful connection to robot - display a control UI.
- Warning about connection error - warns about an error.
- State update - refreshes the UI.
- Result of the performed task - displays final cumulative reward after completion of the task.

Parameters

<i>response</i>	A message object received over websocket
-----------------	--

2.2.2.9 function showControls ()

Displays a NFQ controls and state information.

2.2.2.10 function showIntro (*msg*)

Displays a introduction page.

Parameters

<i>msg</i>	If any warning is received, display it
------------	--

2.2.2.11 function updateState (*distance*, *angle*)

Updates current state information with a new, received over Websocket.

Parameters

<i>distance</i>	New distance state
<i>angle</i>	New angle state

2.3 rprop.c File Reference

File containing implementation of MLP with RPROP learning.

```
#include <math.h>
#include <stdlib.h>
#include <stdio.h>
#include <sys/timeb.h>
```

Data Structures

- struct `ann_t`
Struct representing a neural network.

Macros

- #define `Nin` 5
- #define `Nh1` 10
- #define `Nh2` 10
- #define `Nou` 1

Functions

- int `sign` (double x)
Returns the sign of given double.
- void `shuffle` (double **array, int n)
Shuffles the given 2D array.
- void `ann_initRprop` (`ann_t` *ann)
Rprop variables initialization. Current weights gradient is set to 0 and update value to 0.1.
- void `ann_resetDelta` (`ann_t` *ann)
Resets all delta values on neurons.
- void `ann_rndinit` (`ann_t` *ann, double min, double max)
Randomly initializes weights matrix within given interval.
- void `ann_init` (`ann_t` *ann, double **weights)
Initializes a network from a given weights matrix.
- static void `layer_run` (`blk_t`(ann))
Calculates an output on one layer using output from previous.
- void `MLP2_run` (`ann_t` *ann)
Simple runs of network in a forward direction Calculate output running whole network forward.
- void `calculate_gradients` (`blk_t`(ann), int out)
Calculate weights gradients between 2 layers.
- double * `rprop_run` (`ann_t` *ann, double *pattern)
Runs a network in a forward direction with a given input pattern Calculate output running whole network forward.
- void `rprop_update` (`blk_t`(ann))
Implementation of RPROP learning algorithm according to paper Update rules and equations are described in work. This function updates weights between 2 layers.
- void `rprop_learning_step` (`ann_t` *ann, int num_of_patterns, double **patternSet)
RPROP learning step. Implementation of RPROP algorithm according to paper. This method makes one forward run through network calculating learning variables and updating weights after then.
- void `test_net` (`ann_t` *ann, int num_of_patterns, double **patternSet)
Tests a network for an error against training set.
- void `rprop_learn` (`ann_t` *ann, int num_of_epochs, int num_of_patterns, double **patternSet)
Manages a learning process Repeats learning procedure for the given number of epochs and shuffles the training set. It tests the network after then.

2.3.1 Detailed Description

File containing implementation of MLP with RPROP learning.

Author

Jan Gamec

Date

24 May 2015 This module contain functions for initialization, running and training Multilayer Perceptron with RPROP learning algorithm. This file cannot be run independently, but is used as a library for python wrapper. File can be compiled: `gcc -Wall -std=gnu99 -O3 -ffast-math -funroll-loops -s -o rprop_standalone rprop.c -lm`

2.3.2 Macro Definition Documentation

2.3.2.1 #define Nh1 10

Defines number of neurons in first hidden layer. This needs to be changed according to task.

2.3.2.2 #define Nh2 10

Defines number of neurons in second hidden layer. This needs to be changed according to task.

2.3.2.3 #define Nin 5

Defines number of input neurons. This needs to be changed according to task.

2.3.2.4 #define Nou 1

Defines number of output neurons. This needs to be changed according to task.

2.3.3 Function Documentation

2.3.3.1 void ann_init (*ann_t* * *ann*, double ** *weights*)

Initializes a network from a give weights matrix.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
	<i>weights</i>	Initializatioon weights matrix

2.3.3.2 void ann_initRprop (*ann_t* * *ann*)

Rprop variables initialization. Current weights gradient is set to 0 and udpate value to 0.1.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
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2.3.3.3 void ann_resetDelta (*ann_t* * *ann*)

Resets all delta values on neurons.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
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2.3.3.4 void ann_rndinit (ann_t * ann, double min, double max)

Randomly initializes weights matrix with given interval.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
	<i>min</i>	Bottom weight bound
	<i>max</i>	Upper weight bound

2.3.3.5 void calculate_gradients (blk_t(ann), int out)

Calculate weights gradients between 2 layers.

Parameters

<i>blk_t(ann)</i>	Macro representing separated 2 layers
<i>out</i>	Signalizes whether the layer is hidden or output/input

2.3.3.6 static void layer_run (blk_t(ann)) [static]

Calculates an output on one layer using output from previous.

Parameters

<i>in, out</i>	<i>blk_t(ann)</i>	Macro separating 2 layers from ann structure
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2.3.3.7 void MLP2_run (ann_t * ann)

Simple runs of network in a forward direction Calculate output running whole network forward.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
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2.3.3.8 void rprop_learn (ann_t * ann, int num_of_epochs, int num_of_patterns, double ** patternSet)

Manages a learning process Repeats learning procedure for the given number of epochs and shuffles the training set. It tests the network after then.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
	<i>num_of_epochs</i>	Number of training epochs
	<i>num_of_patterns</i>	Number of training patterns
	<i>patternSet</i>	Training set represented by a 2D array

2.3.3.9 void rprop_learning_step (ann_t * ann, int num_of_patterns, double ** patternSet)

RPROP learning step. Implementation of RPROP algorithm according to paper. This method makes one forward run through network calculating learning variables and updating weights after then.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
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2.3.3.10 `double* rprop_run (ann_t * ann, double * pattern)`

Runs a network in a forward direction with a given input pattern Calculate output running whole network forward.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
	<i>pattern</i>	Training pattern

Returns

Vector of values on the output neurons

2.3.3.11 `void rprop_update (blk_t(ann))`

Implementation of RPROP learning algorithm according to paper Update rules and equations are described in work. This function updates weights between 2 layers.

Parameters

<i>blk_t(ann)</i>	Macro separating 2 following layers
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2.3.3.12 `void shuffle (double ** array, int n)`

Shuffles the given 2D array.

Parameters

<i>in, out</i>	<i>array</i>	Array to be shuffled
	<i>n</i>	length of an array

2.3.3.13 `int sign (double x)`

Returns the sign of given double.

Parameters

<i>x</i>	Double precision number
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2.3.3.14 `void test_net (ann_t * ann, int num_of_patterns, double ** patternSet)`

Tests a network for an error against training set.

Parameters

<i>in, out</i>	<i>ann</i>	Neural network structure
	<i>num_of_pattern</i>	Number of pattern in training set
	<i>patternSet</i>	Training set represented by 2D array