Feedforward Closedloop Learning

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Contents

1	Feed	dforwar	d Closedl	oop Learning library	1
2	Clas	s Index			3
	2.1	Class	List		3
3	Clas	s Docu	mentation	1	5
	3.1	Bandp	ass Class	Reference	5
		3.1.1	Detailed	Description	5
		3.1.2	Member	Function Documentation	6
			3.1.2.1	getOutput()	6
	3.2	Feedfo	rwardClos	sedloopLearning Class Reference	6
		3.2.1	Detailed	Description	7
		3.2.2	Construc	ctor & Destructor Documentation	7
			3.2.2.1	FeedforwardClosedloopLearning() [1/2]	7
			3.2.2.2	FeedforwardClosedloopLearning() [2/2]	8
		3.2.3	Member	Function Documentation	8
			3.2.3.1	doStep() [1/2]	8
			3.2.3.2	doStep() [2/2]	9
			3.2.3.3	getLayer()	9
			3.2.3.4	getLayers()	9
			3.2.3.5	getNumHidLayers()	10
			3.2.3.6	getNumLayers()	10
			3.2.3.7	getOutput()	10
			3.2.3.8	getOutputLayer()	10

ii CONTENTS

		3.2.3.9	initWeights()	11
		3.2.3.10	loadModel()	11
		3.2.3.11	saveModel()	11
		3.2.3.12	seedRandom()	11
		3.2.3.13	setActivationFunction()	12
		3.2.3.14	setBias()	12
		3.2.3.15	setDecay()	12
		3.2.3.16	setLearningRate()	13
		3.2.3.17	setLearningRateDiscountFactor()	13
		3.2.3.18	setMomentum()	13
		3.2.3.19	setUseDerivative()	13
3.3	Layer (Class Refe	erence	14
	3.3.1	Detailed	Description	15
	3.3.2	Construc	etor & Destructor Documentation	16
		3.3.2.1	Layer()	16
	3.3.3	Member	Function Documentation	16
		3.3.3.1	getError()	16
		3.3.3.2	getNeuron()	16
		3.3.3.3	getNinputs()	17
		3.3.3.4	getNneurons()	17
		3.3.3.5	getOutput()	17
		3.3.3.6	getWeightDistanceFromInitialWeights()	18
		3.3.3.7	initWeights()	18
		3.3.3.8	saveWeightMatrix()	18
		3.3.3.9	setActivationFunction()	19
		3.3.3.10	setBias()	19
		3.3.3.11	setConvolution()	19
		3.3.3.12	setDebugInfo()	19
		3.3.3.13	setDecay()	20
		3.3.3.14	setError() [1/2]	20

CONTENTS

		3.3.3.15	setError() [2/2]	20
		3.3.3.16	setErrors()	21
		3.3.3.17	setInput()	21
		3.3.3.18	setInputs()	21
		3.3.3.19	setLearningRate()	21
		3.3.3.20	setMaxDetLayer()	22
		3.3.3.21	setMomentum()	22
		3.3.3.22	setNormaliseWeights()	22
		3.3.3.23	setStep()	22
		3.3.3.24	setUseDerivative()	23
		3.3.3.25	setUseThreads()	23
3.4	Neuro	n Class Re	eference	23
	3.4.1	Detailed	Description	26
	3.4.2	Construc	ctor & Destructor Documentation	26
		3.4.2.1	Neuron()	26
	3.4.3	Member	Function Documentation	26
		3.4.3.1	dActivation()	27
		3.4.3.2	getAverageOfWeightVector()	27
		3.4.3.3	getAvgWeight()	27
		3.4.3.4	getAvgWeightChange() [1/2]	27
		3.4.3.5	getAvgWeightChange() [2/2]	28
		3.4.3.6	getBiasWeight()	28
		3.4.3.7	getDecay()	28
		3.4.3.8	getError()	28
		3.4.3.9	getEuclideanNormOfWeightVector()	29
		3.4.3.10	getFilterOutput()	29
		3.4.3.11	getInfinityNormOfWeightVector()	29
		3.4.3.12	getInput()	29
		3.4.3.13	getMask() [1/2]	30
		3.4.3.14	getMask() [2/2]	30

iv CONTENTS

3.4.3.15	getMaxWeightValue()	30
3.4.3.16	getMinWeightValue()	31
3.4.3.17	getNfilters()	31
3.4.3.18	getNinputs()	31
3.4.3.19	getOutput()	31
3.4.3.20	getSum()	32
3.4.3.21	getSumOfSquaredWeightVector()	32
3.4.3.22	getWeight()	32
3.4.3.23	getWeightDistanceFromInitialWeights()	32
3.4.3.24	initWeights()	33
3.4.3.25	normaliseWeights()	33
3.4.3.26	saveInitialWeights()	33
3.4.3.27	setActivationFunction()	33
3.4.3.28	setBias()	34
3.4.3.29	setBiasWeight()	34
3.4.3.30	setDebugInfo()	34
3.4.3.31	setDecay()	35
3.4.3.32	setError()	35
3.4.3.33	setGeometry()	35
3.4.3.34	setInput()	35
3.4.3.35	setLearningRate()	36
3.4.3.36	setMask() [1/2]	36
3.4.3.37	setMask() [2/2]	36
3.4.3.38	setMomentum()	38
3.4.3.39	setStep()	38
3.4.3.40	setUseDerivative()	38
3.4.3.41	setWeight()	39

Index

41

Chapter 1

Feedforward Closedloop Learning library

Prerequisites

Ubuntu xenial or bionic LTS with swig installed.

How to compile / install?

From source (C++ and Python)

```
cmake .
make
sudo make install
sudo ./setup.py install
```

From PyPi (Python only)

https://pypi.org/project/feedforward_closedloop_learning/

Tests

These are in $tests_c$ and $tests_py$ to demonstrate both the C++ API and the python API.

Demos

The following demos are in a separate repository:

- · A classic line follower demo and
- · our vizdoom demo where our FCL agent fights against another automated agent

Class reference

Run doxygen to generate the reference documentation for all classes:

make docs

This will be written to the docs subdirectory in HTML, RTF and LaTeX.

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```
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```

Chapter 2

Class Index

2.1 Class List

Here are the classes, structs, unions and interfaces with brief descriptions:

Bandpas	SS	
	Creates memory traces at specified length	Ę
Feedforv	wardClosedloopLearning	
	Main class of Feedforward Closed Loop Learning	6
Layer		
	Layer which contains the neurons of one layer	14
Neuron		
	Neuron which calculates the output and performs learning Every input has also an optional filter-	
	bank which allows creating memory traces	23

4 Class Index

Chapter 3

Class Documentation

3.1 Bandpass Class Reference

Creates memory traces at specified length.

```
#include <bandpass.h>
```

Public Member Functions

· Bandpass ()

Constructor.

• double filter (double v)

Filter

• void calcPolesZeros (double f, double r)

Calculates the coefficients The frequency is the normalized frequency in the range [0..0.5].

void setParameters (double frequency, double Qfactor)

sets the filter parameters

• void impulse (char *name)

Generates an acsii file with the impulse response of the filter.

• void calcNorm (double f)

Normalises the output with f.

• void transfer (char *name)

Generates an ASCII file with the transfer function.

double getOutput ()

Gets the output of the filter.

• void reset ()

Sets the output to zero again.

3.1.1 Detailed Description

Creates memory traces at specified length.

It's a 2nd order IIR filter.

3.1.2 Member Function Documentation

3.1.2.1 getOutput()

```
double Bandpass::getOutput ( ) [inline]
```

Gets the output of the filter.

Same as the return value of the function "filter()".

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

- · bandpass.h
- · bandpass.cpp

3.2 FeedforwardClosedloopLearning Class Reference

Main class of Feedforward Closed Loop Learning.

```
#include <fcl.h>
```

Public Member Functions

FeedforwardClosedloopLearning (int num_of_inputs, int *num_of_hidden_neurons_per_layer_array, int _
 —
 num_hid_layers, int num_outputs)

Constructor: FCL without any filters.

• FeedforwardClosedloopLearning (int num_of_inputs, int *num_of_hidden_neurons_per_layer_array, int _ ← num_hid_layers, int num_outputs, int num_filtersInput, int num_filtersHidden, double _minT, double _maxT)

Constructor: FCL with filters for both the input and hidden layers.

~FeedforwardClosedloopLearning ()

Destructor De-allocated any memory.

• void doStep (double *input, double *error)

Performs the simulation step.

void doStep (double *input, int n1, double *error, int n2)

Python wrapper function.

double getOutput (int index)

Gets the output from one of the output neurons.

void setLearningRate (double learningRate)

Sets globally the learning rate.

void setLearningRateDiscountFactor (double learningRateDiscountFactor)

Sets how the learnign rate increases or decreases from layer to layer.

void setDecay (double decay)

Sets a typical weight decay scaled with the learning rate.

void setMomentum (double momentum)

Sets the global momentum for all layers.

void setActivationFunction (Neuron::ActivationFunction _activationFunction)

Sets the activation function of the Neuron.

void initWeights (double max=0.001, int initBias=1, Neuron::WeightInitMethod weightInitMethod=Neuron::

 MAX_OUTPUT_RANDOM)

Inits the weights in all layers.

void seedRandom (int s)

Seeds the random number generator.

void setBias (double _bias)

Sets globally the bias.

• int getNumHidLayers ()

Returns the number of hidden layers.

• int getNumLayers ()

Gets the total number of layers.

Layer * getLayer (int i)

Gets a pointer to a layer.

Layer * getOutputLayer ()

Gets the output layer.

Layer ** getLayers ()

Returns all Layers.

void setUseDerivative (int useIt)

Sets if the learning should be the derivative of the error in each neuron.

• bool saveModel (const char *name)

Saves the whole network.

bool loadModel (const char *name)

Loads the while network.

3.2.1 Detailed Description

Main class of Feedforward Closed Loop Learning.

Create an instance of this class to do the learning. It will create the whole network with an input layer, hidden layers and an output layer. Learning is done iterative by first setting the input values and errors and then calling doStep().

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3.2.2 Constructor & Destructor Documentation

3.2.2.1 FeedforwardClosedloopLearning() [1/2]

```
FeedforwardClosedloopLearning::FeedforwardClosedloopLearning (
    int num_of_inputs,
    int * num_of_hidden_neurons_per_layer_array,
    int _num_hid_layers,
    int num_outputs )
```

Constructor: FCL without any filters.

Parameters

num_of_inputs	Number of inputs in the input layer
num_of_hidden_neurons_per_layer_array	Number of neurons in each layer
_num_hid_layers	Number of hidden layer (needs to match with array above)
num_outputs	Number of output in the output layer

3.2.2.2 FeedforwardClosedloopLearning() [2/2]

```
FeedforwardClosedloopLearning::FeedforwardClosedloopLearning (
    int num_of_inputs,
    int * num_of_hidden_neurons_per_layer_array,
    int _num_hid_layers,
    int num_outputs,
    int num_filtersInput,
    int num_filtersHidden,
    double _minT,
    double _maxT )
```

Constructor: FCL with filters for both the input and hidden layers.

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Parameters

num_of_inputs	Number of inputs in the input layer
num_of_hidden_neurons_per_layer_array	Number of neurons in each layer
_num_hid_layers	Number of hidden layer (needs to match with array above)
num_outputs	Bumber of output in the output layer
num_filtersInput	Number of filters at the input layer, 0 = no filterbank
num_filtersHidden	Number of filters in the hiddel layers (usually zero)
_minT	Minimum/first temporal duration of the 1st filter
_maxT	Maximum/last temporal duration of the last filter

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3.2.3 Member Function Documentation

Performs the simulation step.

Parameters

input	Array with the input values
error	Array of the error signals

```
3.2.3.2 doStep() [2/2]
```

Python wrapper function.

Not public.

3.2.3.3 getLayer()

```
\label{layer*} \begin{tabular}{ll} Layer* FeedforwardClosedloopLearning::getLayer ( \\ & int i) & [inline] \end{tabular}
```

Gets a pointer to a layer.

Parameters

```
i Index of the layer.
```

Returns

A pointer to a layer class.

3.2.3.4 getLayers()

```
Layer** FeedforwardClosedloopLearning::getLayers ( ) [inline]
```

Returns all Layers.

Returns

Returns a two dimensional array of all layers.

3.2.3.5 getNumHidLayers()

```
int FeedforwardClosedloopLearning::getNumHidLayers ( ) [inline]
```

Returns the number of hidden layers.

Returns

Integer value of how many hidden layers exist (total number is +1).

3.2.3.6 getNumLayers()

```
int FeedforwardClosedloopLearning::getNumLayers ( ) [inline]
```

Gets the total number of layers.

Returns

The total number of all layers.

3.2.3.7 getOutput()

Gets the output from one of the output neurons.

Parameters

index	The index number of the output neuron.

Returns

The output value of the output neuron.

3.2.3.8 getOutputLayer()

```
Layer* FeedforwardClosedloopLearning::getOutputLayer ( ) [inline]
```

Gets the output layer.

Returns

A pointer to the output layer which is also a Layer class.

3.2.3.9 initWeights()

Inits the weights in all layers.

Parameters

max	Maximum value of the weights.
initBias	If the bias also should be initialised.
weightInitMethod	See Neuron::WeightInitMethod for the options.

3.2.3.10 loadModel()

Loads the while network.

Parameters

```
name filename
```

3.2.3.11 saveModel()

Saves the whole network.

Parameters

```
name filename
```

3.2.3.12 seedRandom()

```
\label{local_condition} \mbox{void FeedforwardClosedloopLearning::seedRandom (} \\ \mbox{int } s \mbox{ ) } \mbox{ [inline]}
```

Seeds the random number generator.

Parameters

s An arbitratry number.

3.2.3.13 setActivationFunction()

Sets the activation function of the Neuron.

Parameters

_activationFunction | See Neuron::ActivationFunction for the different options.

3.2.3.14 setBias()

```
void FeedforwardClosedloopLearning::setBias ( \mbox{double $\_bias$} \ )
```

Sets globally the bias.

Parameters

_bias	Sets globally the bias input to all neurons.
-------	--

3.2.3.15 setDecay()

```
void FeedforwardClosedloopLearning::setDecay ( \label{eq:decay} \mbox{double } \textit{decay} \mbox{ )}
```

Sets a typical weight decay scaled with the learning rate.

Parameters

decay	The larger the faster the decay.

3.2.3.16 setLearningRate()

Sets globally the learning rate.

Parameters

learningRate	Sets the learning rate for all layers and neurons.
--------------	--

3.2.3.17 setLearningRateDiscountFactor()

Sets how the learnign rate increases or decreases from layer to layer.

Parameters

_learningRateDiscountFactor	A factor of >1 means higher learning rate in deeper layers.
-----------------------------	---

3.2.3.18 setMomentum()

Sets the global momentum for all layers.

Parameters

momentum	Defines the intertia of the weight change over time.
momentum	Defines the intertia of the weight change over time.

3.2.3.19 setUseDerivative()

```
void FeedforwardClosedloopLearning::setUseDerivative ( int \ useIt \ )
```

Sets if the learning should be the derivative of the error in each neuron.

Parameters

use⇔	If one the derivative of the error signal is used for learning.
It	

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

- · fcl.h
- · fcl.cpp

3.3 Layer Class Reference

Layer which contains the neurons of one layer.

```
#include <layer.h>
```

Public Types

enum WeightNormalisation {
 WEIGHT_NORM_NONE = 0, WEIGHT_NORM_LAYER_EUCLEDIAN = 1, WEIGHT_NORM_NEURON_←
 EUCLEDIAN = 2, WEIGHT_NORM_LAYER_MANHATTAN = 3,
 WEIGHT_NORM_NEURON_MANHATTAN = 4, WEIGHT_NORM_LAYER_INFINITY = 5, WEIGHT_NO←
 RM NEURON INFINITY = 6 }

Weight normalisation constants Defines if weights are normalised layer-wide or for every neuron separately.

Public Member Functions

- Layer (int _nNeurons, int _nInputs, int _nFilters=0, double _minT=0, double _maxT=0)
 Constructor.
- ~Layer ()

Destructor Frees all memory.

• void calcOutputs ()

Calculates the output values in all neurons.

void doLearning ()

Adjusts the weights.

void setError (double _error)

Sets the global error for all neurons.

void setError (int i, double _error)

sets the error individually

void setErrors (double *_errors)

Sets all errors from an input array.

• double getError (int i)

Retrieves the error.

void setBias (double _bias)

Sets the global bias for all neurons.

void setUseDerivative (int useIt)

Sets if we use the derivative.

void setInput (int inputIndex, double input)

Set the input value of one input.

void setInputs (double *_inputs)

Sets all inputs from an input array.

void setLearningRate (double _learningRate)

Sets the learning rate of all neurons.

void setActivationFunction (Neuron::ActivationFunction _activationFunction)

Set the activation function.

void setMomentum (double _momentum)

Set the momentum of all neurons in this layer.

void setDecay (double _decay)

Sets the weight decay scaled by the learning rate.

void initWeights (double _max=1, int initBiasWeight=1, Neuron::WeightInitMethod weightInitMethod=Neuron ← ::MAX OUTPUT RANDOM)

Inits the weights.

• double getOutput (int index)

Gets the outpuut of one neuron.

Neuron * getNeuron (int index)

Gets a pointer to one neuron.

• int getNneurons ()

Gets the number of neurons.

int getNinputs ()

Number of inputs.

void setConvolution (int width, int height)

Defines a 2D geometry for the input layer of widthxheight.

void setMaxDetLayer (int _m)

Maxium detection layer.

void setNormaliseWeights (WeightNormalisation normaliseWeights)

Normalise the weights.

void setDebugInfo (int layerIndex)

Sets the layer index within the whole network.

void setStep (long int step)

Sets the simulation step in the layer for debug purposes.

· double getWeightDistanceFromInitialWeights ()

Get weight distance from the start of the simulation.

void doNormaliseWeights ()

Performs the weight normalisation.

void setUseThreads (int _useThreads)

Sets if threads should be used.

int saveWeightMatrix (char *filename)

Save weight matrix for documentation and debugging.

3.3.1 Detailed Description

Layer which contains the neurons of one layer.

It performs all computations possible in a layer. In particular it calls all neurons in separate threads and triggers the computations there. These functions are all called from the parent class.

3.3.2 Constructor & Destructor Documentation

3.3.2.1 Layer()

```
Layer::Layer (
    int _nNeurons,
    int _nInputs,
    int _nFilters = 0,
    double _minT = 0,
    double _maxT = 0 )
```

Constructor.

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Parameters

_nNeurons	Number of neurons in the layer.
_nInputs	Number of inputs to the Layer.
_nFilters	Number of lowpass filters at each input.
_minT	Minimum time of the lowpass filter.
_maxT	Maximum time of the lowpass filter.

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3.3.3 Member Function Documentation

3.3.3.1 getError()

```
\label{eq:control_double_layer::getError} \mbox{ (} \\ \mbox{ int } i \mbox{ )}
```

Retrieves the error.

Parameters

```
i Index of the neuron
```

3.3.3.2 getNeuron()

Gets a pointer to one neuron.

Parameters

index	The index number of the neuron.
-------	---------------------------------

Returns

A pointer to a Layer class.

3.3.3.3 getNinputs()

```
int Layer::getNinputs ( ) [inline]
```

Number of inputs.

Returns

The number of inputs

3.3.3.4 getNneurons()

```
int Layer::getNneurons ( ) [inline]
```

Gets the number of neurons.

Returns

The number of neurons.

3.3.3.5 getOutput()

```
double Layer::getOutput (
          int index ) [inline]
```

Gets the outpuut of one neuron.

Parameters

index	The index number of the neuron.	
II IUUUA		

Returns

Retuns the double valye of the output.

3.3.3.6 getWeightDistanceFromInitialWeights()

```
double Layer::getWeightDistanceFromInitialWeights ( )
```

Get weight distance from the start of the simulation.

Returns

The distance from the initial (random) weight setup.

3.3.3.7 initWeights()

Inits the weights.

Parameters

_max	Maximum value if using random init.
initBiasWeight	if one also the bias weight is initialised.
weightInitMethod	The methid employed to init the weights.

3.3.3.8 saveWeightMatrix()

Save weight matrix for documentation and debugging.

Parameters

filename	The filename it should be saved to.

3.3.3.9 setActivationFunction()

```
\begin{tabular}{ll} \begin{tabular}{ll} void $Layer::setActivationFunction ( \\ & Neuron::ActivationFunction $\_activationFunction \end{tabular} )
```

Set the activation function.

Parameters

The activation function. See: Neuron::ActivationFunction	_activationFunction
--	---------------------

3.3.3.10 setBias()

Sets the global bias for all neurons.

Parameters

_bias	The bias for all neurons
-------	--------------------------

3.3.3.11 setConvolution()

Defines a 2D geometry for the input layer of widthxheight.

Parameters

width	The width of the convolutional window.
height	The height of the convolution window.

3.3.3.12 setDebugInfo()

Sets the layer index within the whole network.

Parameters

layerIndex The layer index in the whole network.
--

3.3.3.13 setDecay()

Sets the weight decay scaled by the learning rate.

Parameters

_decay	The decay rate of the weights
--------	-------------------------------

3.3.3.14 setError() [1/2]

Sets the global error for all neurons.

Parameters

_error	Sets the error in the whole layer
--------	-----------------------------------

3.3.3.15 setError() [2/2]

sets the error individually

Parameters

i	Index of the neuron
error	The error to be set

3.3.3.16 setErrors()

Sets all errors from an input array.

Parameters

_errors	is an array of errors
---------	-----------------------

3.3.3.17 setInput()

Set the input value of one input.

Parameters

inputIndex	The index number of the input.	
input	The value of the input	

3.3.3.18 setInputs()

Sets all inputs from an input array.

Parameters

```
_inputs array of all inputs
```

3.3.3.19 setLearningRate()

Sets the learning rate of all neurons.

Parameters

_learningRate	The learning rate
---------------	-------------------

3.3.3.20 setMaxDetLayer()

Maxium detection layer.

Experimental. This hasn't been implemented.

3.3.3.21 setMomentum()

Set the momentum of all neurons in this layer.

Parameters

_momentum	The momentum for all neurons in this layer.
-----------	---

3.3.3.22 setNormaliseWeights()

Normalise the weights.

Parameters

_normaliseWeights	Metod of normalisation.

3.3.3.23 setStep()

Sets the simulation step in the layer for debug purposes.

Parameters

step	Step number.
------	--------------

3.3.3.24 setUseDerivative()

Sets if we use the derivative.

Parameters

use⇔	If set to one the derivative of the error it taken
It	

3.3.3.25 setUseThreads()

Sets if threads should be used.

Parameters

```
_useThreads | 0 = no Threads, 1 = Threads
```

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

- · layer.h
- · layer.cpp

3.4 Neuron Class Reference

Neuron which calculates the output and performs learning Every input has also an optional filterbank which allows creating memory traces.

```
#include <neuron.h>
```

Public Types

enum WeightInitMethod { MAX_OUTPUT_RANDOM = 0, MAX_WEIGHT_RANDOM = 1, MAX_OUTPUT ←
 _CONST = 2, CONST_WEIGHTS = 3 }

Constants how to init the weights in the neuron.

enum ActivationFunction {

```
\label{eq:linear} \mbox{LINEAR} = 0, \mbox{TANH} = 1, \mbox{RELU} = 2, \mbox{REMAXLU} = 3, \\ \mbox{TANHLIMIT} = 4 \mbox{} \}
```

Activation functions on offer LINEAR: linear unit, TANH: tangens hyperbolicus, RELU: linear rectifier, REMAXLU: as RELU but limits to one.

Public Member Functions

Neuron (int _nInputs, int _nFilters=0, double _minT=0, double _maxT=0)

Constructor.

∼Neuron ()

Destructor Tidies up any memory allocations.

void calcOutput ()

Calculate the output of the neuron This runs the filters, activation functions, sum it all up.

void doLearning ()

Performs the learning Performs ICO learning in the neuron: pre * error.

void doMaxDet ()

Detects max of an input Switches the highest weight to 1 and the others to 0.

void initWeights (double _max=1, int initBias=1, WeightInitMethod _wm=MAX_OUTPUT_RANDOM)

Inits the weights in the neuron.

• void setActivationFunction (ActivationFunction _activationFunction)

Sets the activation function.

• double dActivation ()

Returns the output of the neuron fed through the derivative of the activation.

• double getMinWeightValue ()

Minimum weight value.

double getMaxWeightValue ()

Maximum weight value.

· double getWeightDistanceFromInitialWeights ()

Weight development.

• double getOutput ()

Gets the output of the neuron.

• double getSum ()

Gets the weighted sum of all inputs pre-activation function.

double getFilterOutput (int _index, int _filter=0)

Gets the output of one filter at the input.

• double getWeight (int _index, int _filter=0)

Gets one weight.

void setWeight (int _index, double _weight, int _filter=0)

Sets one weight.

void setError (double _error)

Sets the error in the neuron If the derivative is activated then the derivative of the error is calculated.

double getError ()

Gets the error as set by setError.

• void setInput (int index, double value)

Sets one input.

double getInput (int _index)

Get the value at one input.

double getBiasWeight ()

Gets the bias weight.

void setBiasWeight (double _biasweight)

Sets the bias weight.

void setBias (double _bias)

Sets the bias input value.

void setLearningRate (double _learningrate)

Sets the learning rate.

void setMomentum (double momentum)

Sets the momentum.

void setDecay (double _decay)

Sets the weight decay over time.

double getDecay ()

Gets the weight decay over time.

void setUseDerivative (int _useDerivative)

Switches on/off if the derivative of the error is used for learning.

• int getNinputs ()

Get the number of inputs to the neuron.

• int getNfilters ()

Get the number of filters per input.

double getAvgWeight (int _input)

Get the average weight at one input.

double getAvgWeightChange (int _input)

Gets the weight change at one input.

double getAvgWeightChange ()

Gets the overall weight change.

void setGeometry (int _width, int _height)

Tells the layer that it's been a 2D array originally to be a convolutional layer.

void setMask (int x, int y, unsigned char c)

Boundary safe manipulation of the convolution mask.

void setMask (unsigned char c)

Init the whole mask with a single value.

unsigned char getMask (int x, int y)

Boundary safe return of the mask in (x,y) coordinates.

unsigned char getMask (int index)

Boundary safe return of the mask in flat form.

• double getSumOfSquaredWeightVector ()

Calculates the sum of the squared weight vector values.

• double getEuclideanNormOfWeightVector ()

Calculates the Eucledian length of the weight vector.

double getManhattanNormOfWeightVector ()

Calculates the Manhattan length of the weight vector/return Manhattan length of the weight vector.

double getInfinityNormOfWeightVector ()

Calculates the Infinity norm of the vector.

double getAverageOfWeightVector ()

Calculates the average of the weight values.

void normaliseWeights (double norm)

Normalises the weights with a divisor.

• void saveInitialWeights ()

Save the initial weights.

void setDebugInfo (int _layerIndex, int _neuronIndex)

Sets debug info populated from Layer.

void setStep (long int _step)

Sets the simulation step for debugging and logging.

Static Public Member Functions

```
    static void * calcOutputThread (void *object)
```

Wrapper for thread callback for output calc.

static void * doLearningThread (void *object)

Wrapper for thread callback for learning.

static void * doMaxDetThread (void *object)

Wrapper for thread callback for maxdet.

3.4.1 Detailed Description

Neuron which calculates the output and performs learning Every input has also an optional filterbank which allows creating memory traces.

3.4.2 Constructor & Destructor Documentation

3.4.2.1 Neuron()

```
Neuron::Neuron (
    int _nInputs,
    int _nFilters = 0,
    double _minT = 0,
    double _maxT = 0 )
```

Constructor.

Parameters

_nInputs	Number of inputs to the Neuron
_nFilters	Number of lowpass filters per input (filterbank) 0=no filters
_minT	Minimum duration in time steps of the filter
_maxT	Maximum duration of the filter

3.4.3 Member Function Documentation

3.4 Neuron Class Reference 27

3.4.3.1 dActivation()

```
double Neuron::dActivation ( )
```

Returns the output of the neuron fed through the derivative of the activation.

Returns

Result

3.4.3.2 getAverageOfWeightVector()

```
double Neuron::getAverageOfWeightVector ( )
```

Calculates the average of the weight values.

Returns

average of the weight values.

3.4.3.3 getAvgWeight()

Get the average weight at one input.

Returns

The average weight over all filter weights if applicable.

3.4.3.4 getAvgWeightChange() [1/2]

Gets the weight change at one input.

Parameters

Returns

The weight change.

```
3.4.3.5 getAvgWeightChange() [2/2]
double Neuron::getAvgWeightChange ( )
```

Gets the overall weight change.

Returns

The weight change

3.4.3.6 getBiasWeight()

```
double Neuron::getBiasWeight ( ) [inline]
```

Gets the bias weight.

Returns

Bias weight value

3.4.3.7 getDecay()

```
double Neuron::getDecay ( ) [inline]
```

Gets the weight decay over time.

Returns

The weight decay value. The larger the faster the weight decay.

3.4.3.8 getError()

```
double Neuron::getError ( ) [inline]
```

Gets the error as set by setError.

Returns

The error value stored in the neuron

3.4 Neuron Class Reference

3.4.3.9 getEuclideanNormOfWeightVector()

```
double Neuron::getEuclideanNormOfWeightVector ( ) [inline]
```

Calculates the Eucledian length of the weight vector.

Returns

Eucledian length of the weight vector.

3.4.3.10 getFilterOutput()

Gets the output of one filter at the input.

Parameters

_index	The input index
_filter	The index of a filter within a filterbank (zero if no used)

Returns

The output value of one filter

3.4.3.11 getInfinityNormOfWeightVector()

```
double Neuron::getInfinityNormOfWeightVector ( )
```

Calculates the Infinity norm of the vector.

/return Infinity norm of the vector.

3.4.3.12 getInput()

Get the value at one input.

Parameters

_index	Index of the input
--------	--------------------

Returns

Returns the input value

```
3.4.3.13 getMask() [1/2] unsigned char Neuron::getMask ( int x,
```

int y)

Boundary safe return of the mask in (x,y) coordinates.

Parameters

	Sets the mask value at coordinate x (0 width).
У	Sets the mask value at coordinate y (0 height).

Returns

The mask at x,y: 0 = ignore underlying value, 1 = process underlying value.

Boundary safe return of the mask in flat form.

Parameters

```
index Mask index.
```

Returns

The mask at the index: 0 = ignore underlying value, 1 = process underlying value.

3.4.3.15 getMaxWeightValue()

```
double Neuron::getMaxWeightValue ( )
```

Maximum weight value.

Returns

The maximum weight value in this neuron

3.4.3.16 getMinWeightValue()

```
double Neuron::getMinWeightValue ( )
```

Minimum weight value.

Returns

The minimum weight value in this neuron

3.4.3.17 getNfilters()

```
int Neuron::getNfilters ( ) [inline]
```

Get the number of filters per input.

Returns

The number of filters attached to each input.

3.4.3.18 getNinputs()

```
int Neuron::getNinputs ( ) [inline]
```

Get the number of inputs to the neuron.

Returns

The numer of inputs

3.4.3.19 getOutput()

```
double Neuron::getOutput ( ) [inline]
```

Gets the output of the neuron.

Returns

The overall output of the neuron after the activation function

3.4.3.20 getSum()

```
double Neuron::getSum ( ) [inline]
```

Gets the weighted sum of all inputs pre-activation function.

Returns

Weighted sum (linear)

3.4.3.21 getSumOfSquaredWeightVector()

```
double Neuron::getSumOfSquaredWeightVector ( )
```

Calculates the sum of the squared weight vector values.

Returns

The squared weight vector values.

3.4.3.22 getWeight()

```
double Neuron::getWeight (
          int _index,
          int _filter = 0 ) [inline]
```

Gets one weight.

Parameters

	_index	The input index	
_filter The index of a filter within a filterbank (zero if no use		The index of a filter within a filterbank (zero if no used)	

Returns

The weight value at one input and one filter

3.4.3.23 getWeightDistanceFromInitialWeights()

```
double Neuron::getWeightDistanceFromInitialWeights ( )
```

Weight development.

Returns

Returns the Euclidean distance of the weights from their starting position

3.4.3.24 initWeights()

Inits the weights in the neuron.

Parameters

_max	Maximum value of the weights.	
initBias	s If one also the bias weight is initialised.	
_wm Method how to init the weights as defined by WeightInitMet		

3.4.3.25 normaliseWeights()

Normalises the weights with a divisor.

Parameters

norm Divisor which normalises the weights.	
--	--

3.4.3.26 savelnitialWeights()

```
void Neuron::saveInitialWeights ( )
```

Save the initial weights.

This saves the initial weights for later comparisons. For internal use.

3.4.3.27 setActivationFunction()

Sets the activation function.

Parameters

_activationFunction	Sets the activiation function according to ActivationFunction.]
---------------------	--	---

3.4.3.28 setBias()

Sets the bias input value.

Parameters

3.4.3.29 setBiasWeight()

Sets the bias weight.

Parameters

biasweight	Bias value.

3.4.3.30 setDebugInfo()

Sets debug info populated from Layer.

Parameters

_layerIndex	The layer the neuron is in.	
_neuronIndex	The index of the neuron in the layer.	

3.4.3.31 setDecay()

Sets the weight decay over time.

Parameters

_deca	y	The larger the faster the weight decay.
-------	---	---

3.4.3.32 setError()

Sets the error in the neuron If the derivative is activated then the derivative of the error is calculated.

Parameters

_error	Sets the error of the neuron.
--------	-------------------------------

3.4.3.33 setGeometry()

Tells the layer that it's been a 2D array originally to be a convolutional layer.

_width * _height == nInputs. Otherwise an exception is triggered. The geometry entered here is then used in the mask operations so that every neuron is able to process a subset of the input space, for example an image and thus becomes a localised receptive field.

Parameters

_width	The width of the layer
_height	of the layer

3.4.3.34 setInput()

```
void Neuron::setInput (
```

```
int _index,
double _value ) [inline]
```

Sets one input.

Parameters

_index	Index of the input.
_value	of the input.

3.4.3.35 setLearningRate()

Sets the learning rate.

Parameters

_learningrate	The learning rate
---------------	-------------------

3.4.3.36 setMask() [1/2]

Boundary safe manipulation of the convolution mask.

Sets the convolution mask using the geometry defined by setGeometry.

Parameters

X	Sets the mask value at coordinate x (0 width).
У	Sets the mask value at coordinate y (0 height).
С	Sets the mask: 0 = ignore underlying value, 1 = process underlying value.

3.4.3.37 setMask() [2/2]

Parameters

c Sets the mask for the whole array. 0 = ignore the entire input, 1 = process every input.

3.4.3.38 setMomentum()

Sets the momentum.

Sets the inertia of the learning.

Parameters

	The same and same and same
momentum	The new momentum

3.4.3.39 setStep()

Sets the simulation step for debugging and logging.

Parameters

_step | Current simulation step.

3.4.3.40 setUseDerivative()

Switches on/off if the derivative of the error is used for learning.

Parameters

_useDerivative | If one the derivative of the error is used for learning (ICO learning).

3.4.3.41 setWeight()

```
void Neuron::setWeight (
          int _index,
           double _weight,
          int _filter = 0 ) [inline]
```

Sets one weight.

Parameters

_index	The input index
_weight	The weight value
_filter	The index of a filter within a filterbank (zero if no used)

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

- neuron.h
- neuron.cpp

Index

Bandpass, 5	getLayer
getOutput, 6	FeedforwardClosedloopLearning, 9
	getLayers
dActivation	FeedforwardClosedloopLearning, 9
Neuron, 26	getMask
doStep	Neuron, 30
FeedforwardClosedloopLearning, 8, 9	getMaxWeightValue
	Neuron, 30
FeedforwardClosedloopLearning, 6	getMinWeightValue
doStep, 8, 9	Neuron, 30
FeedforwardClosedloopLearning, 7, 8	getNeuron
getLayer, 9	Layer, 16
getLayers, 9	getNfilters
getNumHidLayers, 9	Neuron, 31
getNumLayers, 10	getNinputs
getOutput, 10	Layer, 17
getOutputLayer, 10	Neuron, 31
initWeights, 10	getNneurons
loadModel, 11	Layer, 17
saveModel, 11	getNumHidLayers
seedRandom, 11	FeedforwardClosedloopLearning, 9
setActivationFunction, 12	getNumLayers
setBias, 12	FeedforwardClosedloopLearning, 10
setDecay, 12	getOutput
setLearningRate, 12	Bandpass, 6
setLearningRateDiscountFactor, 13	FeedforwardClosedloopLearning, 10
setMomentum, 13	Layer, 17
setUseDerivative, 13	Neuron, 31
	getOutputLayer
getAverageOfWeightVector	FeedforwardClosedloopLearning, 10
Neuron, 27	getSum
getAvgWeight	Neuron, 31
Neuron, 27	getSumOfSquaredWeightVector
getAvgWeightChange	Neuron, 32
Neuron, 27, 28	getWeight
getBiasWeight	Neuron, 32
Neuron, 28	getWeightDistanceFromInitialWeights
getDecay	Layer, 18
Neuron, 28	Neuron, 32
getError	
Layer, 16	initWeights
Neuron, 28	FeedforwardClosedloopLearning, 10
getEuclideanNormOfWeightVector	Layer, 18
Neuron, 28	Neuron, 33
getFilterOutput	
Neuron, 29	Layer, 14
getInfinityNormOfWeightVector	getError, 16
Neuron, 29	getNeuron, 16
getInput	getNinputs, 17
Neuron, 29	getNneurons, 17

42 INDEX

getOutput, 17	setMask, 36
getWeightDistanceFromInitialWeights, 18	setMomentum, 38
initWeights, 18	setStep, 38
Layer, 16	setUseDerivative, 38
saveWeightMatrix, 18	setWeight, 38
setActivationFunction, 18	normaliseWeights
setBias, 19	Neuron, 33
setConvolution, 19	Neuron, 30
	saveInitialWeights
setDebugInfo, 19	Neuron, 33
setDecay, 20	saveModel
setError, 20	FeedforwardClosedloopLearning, 11
setErrors, 20	, , , , , , , , , , , , , , , , , , , ,
setInput, 21	saveWeightMatrix
setInputs, 21	Layer, 18
setLearningRate, 21	seedRandom
setMaxDetLayer, 22	FeedforwardClosedloopLearning, 11
setMomentum, 22	setActivationFunction
setNormaliseWeights, 22	FeedforwardClosedloopLearning, 12
setStep, 22	Layer, 18
setUseDerivative, 23	Neuron, 33
setUseThreads, 23	setBias
oadModel	FeedforwardClosedloopLearning, 12
FeedforwardClosedloopLearning, 11	Layer, 19
r eedioiwardolosedloopLearning, Tr	Neuron, 34
Neuron, 23	setBiasWeight
dActivation, 26	Neuron, 34
getAverageOfWeightVector, 27	setConvolution
getAvgWeight, 27	Layer, 19
getAvgWeightChange, 27, 28	setDebugInfo
	_
getBiasWeight, 28	Layer, 19
getDecay, 28	Neuron, 34
getError, 28	setDecay
getEuclideanNormOfWeightVector, 28	FeedforwardClosedloopLearning, 12
getFilterOutput, 29	Layer, 20
getInfinityNormOfWeightVector, 29	Neuron, 34
getInput, 29	setError
getMask, 30	Layer, 20
getMaxWeightValue, 30	Neuron, 35
getMinWeightValue, 30	setErrors
getNfilters, 31	Layer, 20
getNinputs, 31	setGeometry
getOutput, 31	Neuron, 35
getSum, 31	setInput
getSumOfSquaredWeightVector, 32	Layer, 21
getWeight, 32	Neuron, 35
getWeightDistanceFromInitialWeights, 32	setInputs
initWeights, 33	Layer, 21
Neuron, 26	setLearningRate
normaliseWeights, 33	FeedforwardClosedloopLearning, 12
saveInitialWeights, 33	Layer, 21
setActivationFunction, 33	Neuron, 36
setBias, 34	setLearningRateDiscountFactor
setBiasWeight, 34	FeedforwardClosedloopLearning, 13
setDebugInfo, 34	setMask
setDecay, 34	Neuron, 36
setError, 35	setMaxDetLayer
setGeometry, 35	Layer, 22
setInput, 35	setMomentum
setLearningRate, 36	FeedforwardClosedloopLearning, 13

INDEX 43

```
Layer, 22
Neuron, 38
setNormaliseWeights
Layer, 22
setStep
Layer, 22
Neuron, 38
setUseDerivative
FeedforwardClosedloopLearning, 13
Layer, 23
Neuron, 38
setUseThreads
Layer, 23
setWeight
Neuron, 38
```