

# Package ‘CNORfuzzy’

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**Type** Package

**Title** Addon to CellNOptR: Fuzzy Logic

**Version** 1.4.0

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**Description** This package is an extension to CellNOptR. It contains additional functionality needed to simulate and train a prior knowledge network to experimental data using constrained fuzzy logic (cFL, rather than Boolean logic as is the case in CellNOptR). Additionally, this package will contain functions to use for the compilation of multiple optimization results (either Boolean or cFL).

**License** GPL-2

**Depends** R (>= 2.15.0), CellNOptR (>= 1.4.0), nloptr (>= 0.8.5)

**Suggests** xtable, Rgraphviz, RUnit, BiocGenerics

**LazyLoad** yes

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CNORfuzzy-package	<i>R version of CNOFuzzy, a Constrained Fuzzy Logic Network Optimisation</i>
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**Description**

This package does optimisation of constrained Fuzzy logic networks of signalling pathways based on a previous knowledge network and a set of data collected upon perturbation of some of the nodes in the network.

**Details**

Package:	CNOR
Type:	Package
Version:	1.4.0
Date:	2013-08-28
License:	GPL-2
LazyLoad:	yes
Depends:	R (>= 2.15.0), CellNOptR (>= 1.3.29), nloptr (>= 0.8.5)

**Author(s)**

M.K. Morris  
Maintainer: T. Cokelaer <cokelaer@ebi.ac.uk>

**References**

1. J. Saez-Rodriguez, L. G. Alexopoulos, J. Epperlein, R. Samaga, D. A. Lauffenburger, S. Klant and P. K. Sorger. Discrete logic modeling as a means to link protein signaling networks with functional analysis of mammalian signal transduction, *Molecular Systems Biology*, 5:331, 2009.
2. Morris MK, Saez-Rodriguez J, Clarke DC, Sorger PK, Lauffenburger DA (2011). Training Signaling Pathway Maps to Biochemical Data with Constrained Fuzzy Logic: Quantitative Analysis of Liver Cell Responses to Inflammatory Stimuli. *PLoS Comput Biol.* 7(3): e1001099.

**See Also**

[CellNOptR](#) package.

## Examples

```
# Get data from CellNOptR package
data(CNolistToy,package="CellNOptR")
data(ToyModel,package="CellNOptR")

# Use the default parameters and set Data and Model
paramsList=defaultParametersFuzzy()
paramsList$data<-CNolistToy
paramsList$model<-ToyModel

## Not run:
# Run the simulator
Res = CNORwrapFuzzy(data=CNolistToy, model=ToyModel, paramsList=paramsList)

## End(Not run)
```

---

CNORwrapFuzzy

*CNORfuzzy analysis wrapper*

---

## Description

This function is a wrapper around the whole CNOR Fuzzy analysis. It performs the following steps:

1. Plot the CNolist
2. Checks data to model compatibility
3. Pre-processing steps
4. Prepare for simulation (see [prep4simFuzzy](#))
5. Optimisation using Fuzzy transfer function (see [gaDiscreteT1](#))
6. Refinement and reduction steps (see [getRefinedModel](#) and [reduceFuzzy](#)).

## Usage

```
CNORwrapFuzzy(data, model, paramsList=NULL, verbose=TRUE)
```

## Arguments

data	a CNolist structure (as created by <a href="#">makeCNolist</a> ) that contains the data that you will use (see <a href="#">readMIDAS</a> and <a href="#">readSIF</a> from CellNOptR).
model	the model that you want to optimise
paramsList	Use <a href="#">defaultParametersFuzzy</a> function to create a template. Entries are 3-types: (i) GA algorithm parameters for the optimisation, (ii) Fuzzy parameters for the transfer functions and (iii) internal optimisation parameters within the refinement step. See <a href="#">defaultParametersFuzzy</a> function for details on the parameters.
verbose	

**Details**

If you do not provide a parameter list argument, [defaultParametersFuzzy](#) is called internally to populate the `paramsList` argument.

**Value**

This function returns an object containing the results that can be used by other functions such as `compileRes`.

**Author(s)**

M.K. Morris

**References**

CNORWrap function from [CellNOptR](#) package

**See Also**

[defaultParametersFuzzy](#), [compileMultiRes](#)

**Examples**

```
# Load some data
data(CNolistToy, package="CellNOptR")
data(ToyModel, package="CellNOptR")
# Get some default parameters to play with, limiting the duration of the GA
# algorithm and optimisation step
paramsList = defaultParametersFuzzy()
paramsList$maxTime = 20
paramsList$optimisation$maxtime = 10
results = CNORwrapFuzzy(CNolistToy, ToyModel, paramsList)
```

---

compileMultiRes

*Compiles results from multiple runs and produces graph for choosing  
Post Refinement Threshold*

---

**Description**

This function takes a list of objects returned by `CNORwrapfuzzy` (run using identical parameters, models, and data) and packages them together so they can be compared with `plotMeanFuzzyFit` and `writeFuzzyNetwork`. Because almost all training of cFL models are underdetermined problems, analyzing multiple runs together is essential.

**Usage**

```
compileMultiRes(allRes, tag=NULL, show=TRUE)
```

**Arguments**

allRes	list of objects returned by the CNORwrapFuzzy function.
tag	If provided, save the results in 3 files. Each file starts with the string "file-name" that is provided. (<tag>_allRes.RData, <tag>_allFinalMSEs.RData and <tag>_allFinalNumParams.RData)
show	plot the MSE and mean number of parameters versus threshold. Can be switch off if show=FALSE

**Author(s)**

M.K. Morris, T. Cokelaer

**Examples**

```
data(ToyModel, package="CellNOptR")
data(CNolistToy, package="CellNOptR")
paramsList = defaultParametersFuzzy(CNolistToy, ToyModel)
N = 10
allRes = list()
## Not run:
  for (i in 1:N){
    Res = CNORwrapFuzzy(CNolistToy, ToyModel, paramsList)
    allRes[[i]] = Res
  }

summary = compileMultiRes(allRes)
summary$allFinalMSEs
summary$allFinalNumParams

# You can save the results in files using the tag argument
compileMultiRes(allRes, "output")

## End(Not run)
```

---

computeScoreFuzzy

*Compute Score of a model compared to the data for a given intString.*

---

**Description**

compute and return score of a model (cut using a bitstring).

**Usage**

```
computeScoreFuzzy(CNOList, model, simList=NULL, indexList=NULL, paramsList,
  intString=NULL, sizeFac=0.0001, NAFac=1)
```

**Arguments**

CNOList	a CNOList on which the score is based (based on valueSignals[[2]], i.e. data at t1)
model	a model list
simList	a list that contains additional fields for the simulator, as created by prep4sim applied to the model above
indexList	a list of indexes of species stimulated/inhibited/signals, as produced by indexfinder applied on the model and CNOList above
paramsList	list of parameters. See <a href="#">defaultParametersFuzzy</a>
intString	a bitstring of the same size as the number of reactions in the model above
sizeFac	the scaling factor for the size term in the objective function, default to 0.0001
NAFac	the scaling factor for the NA term in the objective function, default to 1

**Value**

score            See gaBinaryT1 for details

**Author(s)**

T. Cokelaer

---

defaultParametersFuzzy

*Create a list of default parameters*

---

**Description**

Parameters are required at different levels in the Fuzzy optimisation. This function provides a list with all parameters that are necessary.

**Usage**

```
defaultParametersFuzzy(data=NA, model=NA, nTF=7)
```

**Arguments**

data	the CNOList that contains the data that you will use
model	the model that you want to optimise
nTF	number of discrete values to be used for each transfer function parameter.

## Details

The list contains 3 types of parameters:

- Fuzzy parameters (e.g, Type1Funs, Type2Funs, RedThresh, DoRefinement)
- GA parameters similar to those used in CellNOptR package (see [gaDiscreteT1](#) or [defaultParametersFuzzy](#))
- optimisation parameters related to the refinement step.
  1. algorithm='NLOPT\_LN\_SBPLX'
  2. xtol\_abs=0.001
  3. maxEval=1000
  4. maxTime=5\*60
- In addition, you can set Model and Data (CNolist).

## Value

params            a list of default parameters.

## Author(s)

T. Cokelaer

## Examples

```
data(ToyModel,package="CellNOptR")
data(CNolistToy,package="CellNOptR")
params = defaultParametersFuzzy(CNolistToy, ToyModel)
```

---

gaDiscreteT1

*Genetic algorithm used to optimise a cFL model*

---

## Description

This function is the genetic algorithm to be used to optimise a cFL model by fitting to data containing one time point.

## Usage

```
gaDiscreteT1(CNolist, model, paramsList, initBstring=NULL, sizeFac=0.0001,
  NAFac=1, popSize=50, pMutation=0.5, maxTime=60, maxGens=500,
  stallGenMax=100, selPress=1.2, elitism=5, relTol=0.1,
  verbose=TRUE,maxSizeHashTable = 1000)
```

**Arguments**

CNOlist	a CNOlist on which the score is based (based on valueSignals[[2]], i.e. data at t1)
model	a Model list
paramsList	CellNOptR software parameters (this functions uses transfer functions to choose from)
initBstring	an initial bitstring to be tested, should be of the same size as the number of reactions in the model above.
sizeFac	the scaling factor for the size term in the objective function, default to 0.0001
NAFac	the scaling factor for the NA term in the objective function, default to 1.
popSize	the population size for the genetic algorithm, default set to 50
pMutation	the mutation probability for the genetic algorithm, default set to 0.5
maxTime	the maximum optimisation time in seconds, default set to 60
maxGens	the maximum number of generations in the genetic algorithm, default set to 500.
stallGenMax	the maximum number of stall generations in the genetic algorithm, default to 100.
selPress	the selective pressure in the genetic algorithm, default set to 1.2.
elitism	the number of best individuals that are propagated to the next generation in the genetic algorithm, default set to 5.
relTol	the relative tolerance for the best bitstring reported by the genetic algorithm, i.e.how different from the best solution can solutions be to be reported as well, default set to 0.1.
verbose	logical (default to TRUE) do you want the statistics of each generation to be printed on the screen?
maxSizeHashTable	a hash table is use to store bitstring and related score. This allows the GA to be very efficient is the case of small models. The size of the hash table is 5000 by default, which may be too large for large models

**Details**

The GA procedure is implemented based on the gaBinaryT1 in CellNOptR (see those man pages for a basic description). Necessary extensions to optimize a string of numbers rather than zero and one have been made. Additionally, since the scoring function is defined inside the function, it has also been altered for this function.

The parameters are similar to those used in CellNOptR and the returned list contains similar results as well.

**Value**

This function returns a list with elements:

bString	The best bitstring
---------	--------------------



**results**            A matrix with columns "Generation", "Best\_score", "Best\_bitString", "Stall\_Generation",  
                       "Avg\_Score\_Gen", "Best\_score\_Gen", "Best\_bit\_Gen", "Iter\_time".  
**stringsTol**        The bitstrings whose scores are within the tolerance  
**stringsTolScores**  
                       The scores of the above-mentioned strings

**Author(s)**

M. Morris based on gaBinaryT1 function by C. Terfve (CellNOptR package)

**See Also**

[prep4simFuzzy](#), [simFuzzyT1](#)

**Examples**

```

data(CNOlistToy, package="CellNOptR")
data(ToyModel, package="CellNOptR")

#pre-process model
model <- preprocessing(CNOlistToy, ToyModel, verbose=FALSE)

#set parameters
paramsList <- defaultParametersFuzzy(CNOlistToy, ToyModel)

# the GA algorithm
ToyT1opt<-gaDiscreteT1(
  CNOlist=CNOlistToy,
  model=model,
  paramsList=paramsList,
  maxTime=3,
  verbose=FALSE)

```

---

getRefinedModel            *Refinement of Parameters of cFL model*

---

**Description**

Performs refinement of cFL model parameters

**Usage**

```
getRefinedModel(res, CNOlist, cutModel, cutSimList, refParams)
```

**Arguments**

res	Optimum returned by <a href="#">gaDiscreteT1</a>
CNOlist	a CNOlist on which the score is based (based on valueSignals[[2]], i.e. data at T1)
cutModel	Model (with unnecessary edges cut in <a href="#">reduceFuzzy</a> or <a href="#">interpretDiscreteGA</a> )
cutSimList	Fields for simulation based on cutModel (again, cut with <a href="#">reduceFuzzy</a> or <a href="#">interpretDiscreteGA</a> )
refParams	parameter list object as returned by <a href="#">defaultParametersFuzzy</a> .

**Details**

After the discreteGA chooses transfer functions from a discrete set of transfer functions and removing interactions inconsistent with the data, this function 'refines' the parameters by using optim to go to the local minimum of error to data

**Value**

refModel	A refined model
finalSet	Set of final fuzzy parameter
MSE	The MSE value

**Author(s)**

M.K. Morris

**See Also**

[gaDiscreteT1](#), [reduceFuzzy](#), [interpretDiscreteGA](#)

---

interpretDiscreteGA    *Interpreter of output of discrete genetic algorithm*

---

**Description**

This function takes the integer string output by the discrete genetic algorithm for training a cFL model and generates the corresponding model based on the Fuzzy parameters.

**Usage**

```
interpretDiscreteGA(model, paramsList, intString, bitString=NULL)
```

**Arguments**

model	PKN trained (same model input as to gaDiscrete).
paramsList	List containing parameters (see defaultParametersFuzzy). Only the fuzzy parameters are used.
intString	Integer string resulting from gaDiscrete (in bString field of gaDiscreteT1 output).
bitString	(optional) if you want to cut additional interactions from the model. Used in reduceFuzzy function.

**Details**

After the discreteGA chooses transfer functions from a discrete set of transfer functions and removing interactions inconsistent with the data, this function interprets the output and returns an actual model using these transfer functions as well as a model from which logical redundancy was cut.

**Value**

model	The selected initial model based on the provided bitstring.
simList	The corresponding data related to Model field
bitString	The bitstring corresponding to the Model field
cutModel	Same as Model but redundant reactions are also removed.
cutSimList	The corresponding data related to cutModel field
cutBitString	The corresponding bitstring related to cutModel field.

**Author(s)**

M.K. Morris

**See Also**

[gaDiscreteT1](#)

**Examples**

```

data(ToyModel, package="CellNOptR")
data(CNolistToy, package="CellNOptR")
paramsList = defaultParametersFuzzy()
## Not run:

# preprocessing (see CNORwrapFuzzy or gaDiscreteT1)
T1opt = gaDiscreteT1(...) # see CNORwrapFuzzy or gaDiscreteT1 for details
interpretDiscreteGA(ToyModel, paramsList, T1opt$bString)

## End(Not run)

```

---

plotMeanFuzzyFit	<i>Simulates models returned from multiple cFL runs and plots mean fit to data</i>
------------------	--

---

### Description

Uses post refinement threshold (selection threshold) to choose reduced refined model resulting from each run. Simulates model and plots result and fit to data

### Usage

```
plotMeanFuzzyFit(postRefThresh, allFinalMSEs, allRes, plotPDF=FALSE, tag=NULL,
show=TRUE, plotParams=list(cex=0.8, cmap_scale=1))
```

### Arguments

postRefThresh	Post refinement threshold (selection threshold) chosen from plot produced by compileMultiRes.
allFinalMSEs	matrix containing MSEs produced by compileMultiRes
allRes	list containing results of several <a href="#">CNORwrapFuzzy</a> runs
plotPDF	TRUE or FALSE depending on if a PDF file should be saved
tag	String to include in filename of PDF plot
show	If the plot should be displayed
plotParams	a list of option related to the PDF and plotting outputs. (1) cex is the font size of the header. (2) cmap_scale below 1 allows to put more emphasizes on low errors (default 1 means all colors have the same weight). See plotOptimResultsPan from CellNOptR for other fields.

### Value

This function does not have any output, it just plots and saves results if applicable.

### Author(s)

M.K. Morris

### Examples

```
data(ToyModel, package="CellNOptR")
data(CNolistToy, package="CellNOptR")
paramsList = defaultParametersFuzzy(CNolistToy, ToyModel)
N = 10
allRes = list()

## Not run:
for (i in 1:N){
```

```

    Res = CNORwrapFuzzy(CNOListToy, ToyModel, paramsList)
    allRes[[i]] = Res
  }

  summary = compileMultiRes(allRes)
  plotMeanFuzzyFit(0.1, summary$allFinalMSEs, allRes)

## End(Not run)

```

---

```
prep4simFuzzy
```

---

*Prepare a model for simulation*

---

### Description

Adds to the model some fields that are used by the simulation engine and calls prep4sim function from CellNOptR package

### Usage

```
prep4simFuzzy(model, paramsList, verbose=TRUE)
```

### Arguments

model	A model, as output by readSIF, normally pre-processed but that is not a requirement of this function.
paramsList	A parameters list that must contain at least the CNOList parameter in the <i>Data</i> field (param = list(data=cnolist)) and possibly optional arguments related to the fuzzy logic (see <a href="#">defaultParametersFuzzy</a> )
verbose	a verbose option set to TRUE by default.

### Details

This adds fields that are necessary for the simulation engine for both Boolean and constrained Fuzzy logic simulation.

### Value

In addition to the fields returned by the prep4sim function of CellNOptR, this function appends the following fields:

finalCube	stores, for each reac(row) the location of its inputs (col)
ixNeg	stores, for each reac(row) and each input (col) whether it is a negative input
ignoreCube	logical matrix of the same size as the 2 above, that tells whether the particular cell is filled or not
maxIx	row vector that stores, for each reac, the location of its output
modelName	stores the name of the model from which these fields were derived

**Author(s)**

C. Terfve, modified by M.K. Morris and T. Cokelaer

**See Also**

[simFuzzyT1](#)

**Examples**

```
data(ToyModel, package="CellNOptR")
data(CNOlistToy, package="CellNOptR")
params <- defaultParametersFuzzy()
params$data = CNOlistToy
fields4sim <- prep4simFuzzy(ToyModel, params)
```

---

reduceFuzzy

*Remove unnecessary interactions from cFL model*

---

**Description**

Determine if interactions in cFL model are necessary to fit the data

**Usage**

```
reduceFuzzy(firstCutOff, CNOlist, model, res, params )
```

**Arguments**

firstCutOff	Threshold for removing or replacing an edge. If the score doesn't get any worse than this, it's removed or replaced
CNOlist	a CNOlist on which the score is based (based on valueSignals[[2]], i.e. data at t1)
model	Model input into <a href="#">gaDiscreteT1</a> (uncut)
res	Optimum returned by <a href="#">gaDiscrete</a>
params	parameters (as generated from <a href="#">defaultParametersFuzzy</a> (only Fuzzy parameters required))

**Details**

After [gaDiscrete](#) removes interactions that are inconsistent with the data, this function asks if they are necessary to fit the data. For all interactions, it asks if they can be removed without making the score worse by a value of the firstCutOff. For AND interactions, it asks if they can be replaced with an OR gate.

**Value**

redModel  
redSimList  
bitString  
intString  
MSE

**Author(s)**

M.K. Morris

**See Also**

[gaDiscreteT1](#)

---

simFuzzyT1

*Simulation of a cFL model*

---

**Description**

This is the simulator, inspired from CNOfuzzySimEngv23 in the Matlab CellNOpt, to be used on one time point simulations

**Usage**

```
simFuzzyT1(CNOlist, model, simList)
```

**Arguments**

CNOlist	a CNOlist
model	a Model that only contains the reactions to be evaluated
simList	a SimList as created by prep4simFuzzy, that has also already been cut to contain only the reactions to be evaluated

**Details**

I'm not sure if this applies to the one I wrote, which was based on I think an older version by Camille maybe? Differences from the BoolSimEngMKM simulator include: the valueInhibitors has not been previously flipped; the function outputs the values across all conditions for all species in the model, instead of only for the signal species. This is because then the output of this function can be used as initial values for the version of the simulator that works on time point 2 (not implemented in this version).

If you would like to compute the output of a model that contains some of the gates in the model but not all, we suggest that you use the function SimulateT1 and specify in the bStringT1 argument which gates you want to be included. Indeed, SimulateT1 is a wrapper around simulatorT1 that takes care of cutting the model for you before simulating it.

**Value**

This function outputs a single matrix of format similar to valueSignals in the CNOList but that contains an output for each species in the model. This matrix is the simulated equivalent of valueSignals at time 1, if you consider only the columns given by indexSignals.

**Author(s)**

M.K. Morris based on function by C. Terfve from [CellNOptR](#) package.

**See Also**

SimulateT1 from CellNOptR

**Examples**

```
#This computes the output of the full model, which is normally not done on a stand alone basis, but if you have a model
data(CNOListToy,package="CellNOptR")
data(ToyModel,package="CellNOptR")

paramsList <- defaultParametersFuzzy(data=CNOListToy, model=ToyModel)

indicesToy<-indexFinder(CNOListToy,ToyModel,verbose=TRUE)
ToyFields4Sim<-prep4simFuzzy(ToyModel,paramsList)

Sim<-simFuzzyT1(
  CNOList=CNOListToy,
  model=ToyModel,
  simList=ToyFields4Sim)
```

---

writeFuzzyNetwork	<i>Depict the network results of training a cFL model to data in multiple runs.</i>
-------------------	---

---

**Description**

Fuzzy network results output.

**Usage**

```
writeFuzzyNetwork(postRefThresh, allFinalMSEs, allRes, tag=NULL,verbose=FALSE)
```

**Arguments**

postRefThresh	Post refinement threshold (selection threshold) chosen from plot produced by compileMultiRes
allFinalMSEs	matrix containing MSEs produced by compileMultiRes
allRes	list containing all results produced by compileMultiRes
tag	String to include in filename of pdf plot
verbose	If extra warnings should be displayed



**Details**

The weights of the edges are computed as the mean across models using post refinement threshold (selection threshold) to choose reduced refined model resulting from each run.

As with writeNetwork, this function maps back the edges weights from the optimised (expanded and compressed) model to the original model. The mapping back only works if the path has length 2 at most (i.e. you have node1-comp1-comp2-node2, where comp refer to nodes that have been compressed).

**Value**

This function does not have any output, it just writes a SIF file, an edge attribute file, and a node attribute file

**Note**

The mapback of this function is still an open question, even in the Matlab version. Future developments will include more robust versions of the mapping back algorithm, probably as a separate mapback function.

**Author(s)**

M.K. Morris based on code by C. Terfve

**See Also**

writeNetwork

**Examples**

```

data(ToyModel, package="CellNOptR")
data(CNolistToy, package="CellNOptR")
paramsList = defaultParametersFuzzy(CNolistToy, ToyModel)
N = 10
allRes = list()
## Not run:
for (i in 1:N){
  Res = CNORwrapFuzzy(CNolistToy, ToyModel, paramsList)
  allRes[[i]] = Res
}

summary = compileMultiRes(allRes)
summary$allFinalMSEs
summary$allFinalNumParams

writeFuzzyNetwork(postRefThresh, summary$allFinalMSEs, allRes)

## End(Not run)

```

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