# Package 'Perc'

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Type Package

**Title** Using Percolation and Conductance to Find Information Flow Certainty in a Direct Network

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**Description** To find the certainty of dominance interactions with indirect interactions being considered.

**Depends** R (>= 2.14.0)

**License** GPL ( $\geq 2$ )

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Author Kevin Fujii [aut], Jian Jin [aut], Jessica Vandeleest [aut, cre], Aaron Shev [aut], Brianne Beisner [aut], Brenda McCowan [aut, cph], Hsieh Fushing [aut, cph]

Maintainer Jessica Vandeleest <vandelee@ucdavis.edu>

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as.conflictmat convert to a matrix of conf.mat class

## Description

as.conflictmat convert an edgelist or a win-loss raw matrix to a matrix of conf.mat class

## Usage

Index

```
as.conflictmat(Data, weighted = FALSE, swap.order = FALSE)
```

## Arguments

Data	either a dataframe or a matrix, representing raw win-loss interactions using ei-
	ther an edgelist or a matrix. By default, winners are represented by IDs in the
	1st column for an edgelist, and by row IDs for a matrix. Frequency of inter-
	actions for each dyad can be represented either by multiple occurrences of the
	dyad for a 2-column edgelist, or by a third column specifying the frequency of the interaction for a 3-column edgelist.
weighted	If the edgelist is a 3-column edgelist in which weight was specified by frequency, use weighted = TRUE.

#### bradleyTerry

swap.orderIf the winner is placed in the 2nd column for an edgelist or as the column name<br/>for a matrix, specify as TRUE. By default, winners are placed in the first column<br/>of an edgelist or in the row names of a matrix.

#### Details

conf.mat is short for "Conflict Matrix". conf.mat is a class of R objects. It is required to use as.conflictmat to convert your raw edgelist or raw win-loss matrix into a matrix of conf.mat object before using other functions to find (in)direct pathways and computing dominance probabilities.

Note, when using a 3-column edgelist (e.g. a weighted edgelist) to represent raw win-loss interactions, each dyad must be unique. If more than one rows are found with the same initiator and recipient, sum of the frequencies will be taken to represent the frequency of interactions between this unique dyad. A warning message will prompt your attention to the accuracy of your raw data when duplicate dyads were found in a three-column edgelist.

#### Value

a named matrix with the [i, j]th entry equal to the number of times i wins over j.

#### See Also

findIDpaths, countPaths, transitivity, conductance

#### Examples

```
confmatrix <- as.conflictmat(sampleEdgelist, swap.order = FALSE)
confmatrix2 <- as.conflictmat(sampleRawMatrix, swap.order = FALSE)
confmatrix3 <- as.conflictmat(sampleWeightedEdgelist, weighted = TRUE, swap.order = FALSE)</pre>
```

bradleyTerry

Computes the MLE for the BT model using an MM algorithm

#### Description

bradleyTerry Computes the MLE for the BT model using an MM algorithm

#### Usage

```
bradleyTerry(conf.mat, initial = NA, baseline = NA, stop.dif = 0.001)
```

#### Arguments

conf.mat	a matrix of conf.mat class. An N-by-N conflict matrix whose (i, j)th element is the number of times i defeated j.
initial	initial values of dominance indices for the MM algorithm, if not supplied, the 0 vector will be the initial value.

baseline	index for agent to represent baseline dominance index set to 0. If NA, the "sum-
	to-one" parameterization will be used.
stop.dif	numeric value for difference in log likelihood value between iterations. Used as
	the convergence criterion for the algorithm.

## Details

In order to meet Bradley-Terry assumption, each ID in conf.mat should have at least one win AND one loss. bradleyTerry will return an error if no more than one win or loss was found.

@references Shev, A., Hsieh, F., Beisner, B., & McCowan, B. (2012). Using Markov chain Monte Carlo (MCMC) to visualize and test the linearity assumption of the Bradley-Terry class of models. Animal behaviour, 84(6), 1523-1531.

Shev, A., Fujii, K., Hsieh, F., & McCowan, B. (2014). Systemic Testing on Bradley-Terry Model against Nonlinear Ranking Hierarchy. PloS one, 9(12), e115367.

#### Value

A list of length 3.

domInds	a vector of length N consiting of the MLE values of the dominance indices. Lower values represent lower ranks.
probMat	an N-by-N numeric matrix of win-loss probabilities estimated by the BT model.
logLik	the model fit.

#### Examples

bt.test

Systemic test for the assumptions of the Bradley-Terry model

#### Description

bt.test Systemic test for the assumptions of the Bradley-Terry model, transitivity and monotonic win-loss relationship. That is, if A > B and B > C then A > C and Pr(AbeatsC) > Pr(BbeatsC).

#### Usage

```
bt.test(conf.mat, baseline = 1, maxLength = 2, reps = 1000)
```

## bt.test

#### Arguments

conf.mat	an N-by-N matrix. The matrix should be a conflict matrix with element i,j representing the number of times i has beaten j.
baseline	an integer between 1 and N inclusive identifying the agent with dominance index equal to zero.
maxLength	an integer indicating maximum path length used in conductance
reps	an integer indicating number of conflict matrices simulated to estimate the sam- pling distribution under the BT model.

#### Details

The value of the test statistic should be within the estimated sampling distribution of the test statistics under the BT model. The p-value of the test indicates the probability of statistics in the estimated sampling distribution is larger than the test statistic. It is not appropriate to use Bradley-Terry model if value of the test statistic is higher than the estimated sampling distribution of the test statistics.

#### Value

A list of 3 elements.

stat	value of the test statistic
dist	estimated sampling distribution of the test statistics under the BT model.
p.val	p-value of the test

#### References

Shev, A., Fujii, K., Hsieh, F., & McCowan, B. (2014). Systemic Testing on Bradley-Terry Model against Nonlinear Ranking Hierarchy. PloS one, 9(12), e115367.

#### Examples

conductance

#### Description

conductance compute win-loss probabilities for all possible pairs based upon the combined information from directed wins/losses and indirect win/loss pathways from the network.

#### Usage

conductance(conf, maxLength, alpha = NULL, beta = 1, strict = FALSE)

#### Arguments

conf	a matrix of conf.mat class. An N-by-N conflict matrix whose (i,j)th element is the number of times i defeated j.
maxLength	an integer greater than 1 and less than 7, indicating the maximum length of paths to identify.
alpha	a positive integer that reflects the influence of an observed win/loss interaction on an underlying win-loss probability. It is used in the calculation of the poste- rior distribution for the win-loss probability of i over j: $Beta(\alpha c_{i,j} + \beta, c_{i,j} + \beta)$ . In the absence of expertise to accurately estimate alpha, it is estimated from the data.
beta	a positive numeric value that, like alpha, reflects the influence of an observed win/loss interaction on an underlying win-loss probability. Both $\alpha$ and $\beta$ are chosen such that $((\alpha + \beta)/(\alpha + 2\beta))^2$ is equal to the order-1 transitivity of the observed network. Therefore, $\beta$ is commonly set to 1.
strict	a logical vector of length 1. It is used in transitivity definition for alpha esti- mation. It should be set to TRUE when a transitive triangle is defined as all pathways in the triangle go to the same direction; it should be set to FALSE when a transitive triangle is defined as PRIMARY pathways in the triangle go to the same direction. Strict = FALSE by default.

#### Details

This function performs two major steps. First, repeated random walks through the empirical network identify all possible directed win-loss pathways between each pair of nodes in the network. Second, the information from both direct wins/losses and pathways of win/loss interactions are combined into an estimate of the underlying probability of i over j, for all ij pairs.

#### Value

a list of two elements.

imputed.conf An N-by-N conflict matrix whose (i, j)th element is the 'effective' number of wins of i over j.

#### countPaths

p.hat	An N-by-N numeric matrix whose (i, j)th element is the estimated win-loss
	probability. Three functions (valueConverter, individualDomProb, and dyadicLongConverter)
	are provided to convert win-loss probability into other formats that are easier for
	further analysis of win-loss probability.

#### References

Fushing H, McAssey M, Beisner BA, McCowan B. 2011. Ranking network of a captive rhesus macaque society: a sophisticated corporative kingdom. PLoS ONE 6(3):e17817.

#### See Also

as.conflictmat, findIDpaths, transitivity, simRankOrder

#### Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find win-loss probability matrix
perm2 <- conductance(confmatrix, 2, strict = FALSE)
perm2$imputed.conf
perm2$p.hat
```

countPaths

count paths between all pairs

#### Description

countPaths Identifies the number of paths of length less than or equal to maxLength between all pairs

#### Usage

countPaths(conf, maxLength = 2)

#### Arguments

conf	a matrix of conf.mat class. An N-by-N conflict matrix whose (i, j)th element
	is the number of times i defeated j.
maxLength	a positive numeric integer indicating the maximum length of paths to identify

#### Value

A list in which elements are number of paths between all pairs of a given length.

## See Also

as.conflictmat, findIDpaths, transitivity, conductance

#### Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find number of paths of length 3 or less
npaths <- countPaths(confmatrix, 3)</pre>
```

dyadicLongConverter dyadic long format converter

## Description

dyadicLongConverter convert win-loss probability matrix into long format for each dyad

#### Usage

```
dyadicLongConverter(matrix)
```

## Arguments

matrix the win-loss matrix which is the second output from conductance.

#### Details

values on the diagonal of the matrix are not included in the converted long-format data.

## Value

a dataframe of dyadic level win-loss probability and ranking certainty.

#### See Also

conductance, valueConverter, individualDomProb

#### Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find win-loss probability matrix
perm2 <- conductance(confmatrix, 2)
perm2$imputed.conf
perm2$p.hat
dl <- dyadicLongConverter(perm2$p.hat)</pre>
```

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## Description

findAllPaths Identifies all paths length less than or equal to maxLength between all pairs of competitors

#### Usage

```
findAllPaths(conf, maxLength = 2)
```

## Arguments

conf	a matrix of conf.mat class. An N-by-N conflict matrix whose (i, j)th element
	is the number of times i defeated j.
maxLength	a positive numeric integer indicating the maximum length of paths to identify

## Value

A list of two elements.

direct pathways

direct pathways found in original matrix

indirect pathways

a list of all paths from length 2 to the given length

## See Also

countPaths findIDpaths transitivity

## Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find all paths of legnth 3
allp.3 <- findAllPaths(confmatrix, 3)</pre>
```

findIDpaths

## Description

findIDpaths identifies all unique win-loss pathways of order (len - 1) beginning at selected ID

## Usage

findIDpaths(conf, ID, len = 2)

#### Arguments

conf	a matrix of conf.mat class. An N-by-N conflict matrix whose (i,j)th element is the number of times i defeated j.
ID	a numeric or character vector of length 1. It specifys the subject at the beginning of each pathway.
len	a positive integer of length 1 greater than 2. the length of the win-loss paths to be identified $(len = order + 1)$

## Value

return all win-loss paths of length(len) beginning at ID

#### See Also

as.conflictmat, findAllPaths, countPaths

## Examples

```
confmatrix <- as.conflictmat(sampleEdgelist)
path38891 <- findIDpaths(confmatrix, ID = "Kuai", len = 2)</pre>
```

## Description

Associate each costs with its corresponding simulated annealing runs

#### Usage

getAllCosts(costs\_all, num)

## getAllRankOrder

## Arguments

costs_all	costs of all simAnnealing runs. It is the first element of the output from getSimOutput.
num	number of simulated annealing runs

#### Value

a data.frame of all costs.

getAllRankOrder assign IDs to all best rank orders

## Description

assign IDs to all best rank orders

## Usage

getAllRankOrder(ID\_index, allRankOrder)

## Arguments

ID_index	it depends on the inputed data from simRankOrder. It takes the colnames of data as ID, and index this ID by its position in the colname.
allRankOrder	all rank orders found in all simulated annealing runs. It is the third output from getSimOutput.

## Value

a data.frame of all costs.

getBestRankOrder assign IDs to the best rank order

## Description

assign IDs to the best rank order

## Usage

getBestRankOrder(ID\_index, bestRankOrder)

## Arguments

ID_index	it depends on the inputed data from simRankOrder. It takes the colnames of data as ID, and index this ID by its position in the colname.
bestRankOrder	the best rank order found in all simulated annealing runs. It is the second output from getSimOutput.

## Value

a data.frame of all costs.

get SimOutput get useful outputs from simulated annealing processes

## Description

get useful outputs from simulated annealing processes

## Usage

getSimOutput(simAnnealList, num)

## Arguments

simAnnealList	the output from simAnnealing process
num	number of simulated annealing runs

#### Value

a list of three elements

costs_all	costs of all simulated annealing runs.
bestRankOrder	best rank order found in all simulated annealing processes
allRankOrder	a dataframe, all best rank orders found in each simulated annealing processes

individualDomProb *individual-level probability converter* 

## Description

individualDomProb convert win-loss probability matrix into long format for each dyad

#### Usage

```
individualDomProb(matrix)
```

#### Arguments

matrix the win-loss matrix which is the second output from conductance.

## Value

a dataframe. Averaging probability of win-loss relationship with all other individuals.

## See Also

conductance, valueConverter, dyadicLongConverter

#### Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find win-loss probability matrix
perm2 <- conductance(confmatrix, 2)
perm2$imputed.conf
perm2$p.hat
individualLevelOutput <- individualDomProb(perm2$p.hat)</pre>
```

Perc

Perc.

#### Description

A package to measure information flow (e.g. dominance) through a network

plotConfmat

## Description

plotConfmat generate heat map for a matrix or a win-loss probability matrix

#### Usage

```
plotConfmat(conf.mat, ordering = NA, labels = FALSE, ...)
```

## Arguments

conf.mat	an N-by-N matrix. Either a conflict matrix or a win-loss probability matrix (the second element from conductance output)
ordering	a reordering of the rows/columns, specified by a permutation of 1:N
labels	if TRUE, displaying the agent names as specified in the rownames() of conf.mat() on the heatmap
	Further argument may be supplied and processed by lattice::levelplot.

## Value

A heatmap

## See Also

as.conflictmat, conductance

## Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find win-loss probability matrix
perm2 <- conductance(confmatrix, 2)
# plotting
plotConfmat(perm2$p.hat)
```

plotProbDiagnosis

## Description

Diagnosis Plot plotProbDiagnosis generate heat map for dominance probability matrix

## Usage

```
plotProbDiagnosis(prob.mat, cutoff = 0.75, ...)
```

## Arguments

prob.mat	dominance probability matrix
cutoff	a numeric value between 0.5 to 1. A value that is equal or greater than the cutoff is considered of high certainty.
	Further argument may be supplied and processed by levelplot.

## See Also

plotConfmat

sampleEdgelist sampleEdgelist. social interactions among 11 monkeys

## Description

sampleEdgelist. social interactions among 11 monkeys

## Usage

sampleEdgelist

#### Format

A data frame of edgelist with 174 rows and 2 variables: Iname, Rname

Iname winner, animal ID

Rname loser, animal ID ...

McCowan Lab sample data.

sampleRawMatrix

## Description

sampleRawMatrix. dominance interactions between 39 monkeys

#### Usage

sampleRawMatrix

#### Format

A 39 x 39 matrix representing number of times that a row wins over a column McCowan Lab sample data.

sampleWeightedEdgelist

sampleWeightedEdgelist. dominance interactions among 29 monkeys

## Description

sampleWeightedEdgelist. dominance interactions among 29 monkeys

#### Usage

sampleWeightedEdgelist

#### Format

A data frame of edgelist with 181 rows and 3 variables: Initiator1, Recipient1, Freq

Initiator1 winner, monkey name

Recipient1 loser, monkey name

Freq Frequency, count of interaction ...

McCowan Lab sample data.

simRankOrder

## Description

simRankOrder find the rank order for the win-loss relationship

#### Usage

```
simRankOrder(data, num = 10, alpha = NULL, kmax = 1000)
```

## Arguments

data	a matrix. the win-loss probability matrix which is the second element of the output from conductance
num	number of SimAnnealing (default is set at 10)
alpha	a positive integer that reflects the influence of an observed win/loss interaction on an underlying win-loss probability. It is used in the calculation of the poste- rior distribution for the win-loss probability of i over j: $Beta(\alpha c_{i,j} + \beta, c_{i,j} + \beta)$ . In the absence of expertise to accurately estimate alpha, it is estimated from the data.
kmax	an integer between 2 to 1000, indicating the number of simulations in each SimAnnealing.

## Value

a list of two dataframes.

BestSimulatedRankOrder a dataframe representing the best simulated rank order. Costs the cost of each simulated annealing run AllSimulatedRankOrder

a dataframe representing all simulated rank orders.

#### References

Fushing, H., McAssey, M. P., Beisner, B., & McCowan, B. (2011). Ranking network of a captive rhesus macaque society: a sophisticated corporative kingdom. PLoS One, 6(3), e17817-e17817.

## See Also

conductance transitivity

#### Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find dominance probability matrix
perm2 <- conductance(confmatrix, maxLength = 2)
## Not run:
# Note: It takes a while to run the simRankOrder example.
s.rank <- simRankOrder(perm2$p.hat, num = 10, kmax = 1000)
s.rank$BestSimulatedRankOrder
s.rank$Costs
s.rank$AllSimulatedRankOrder
```

## End(Not run)

transitivity

#### calculate transitivity measurements for a matrix

#### Description

transitivity calculate transitivity measurements for a matrix

#### Usage

```
transitivity(conf, strict = FALSE)
```

#### Arguments

conf	an N-by-N conflict matrix whose (i,j)th element is the number of times i defeated j
strict	a logical vector of length 1 (TRUE or FALSE). It is used in transitivity definition for alpha estimation. It should be set to TRUE when a transitive triangle is defined as all pathways in the triangle go to the same direction; it should be set to FALSE when a transitive triangle is defined as PRIMARY pathways in the triangle go to the same direction. Strict = FALSE by default.

#### Details

transitivity is calculated as the proportion transitive triangles in the total of transitive and intransitive triangles. transitivity is used to estimate alpha, which is used in turn in imputing information from indirect pathways as to what degree we can trust information from indirect pathways. Greater transitivity is associated with assigning higher weight to information from indirect pathways.

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#### valueConverter

## Value

A list of four elements.

transitive	The number of transitive triangles.
intransitive	The number of intransitive triangles.
transitivity	transitivity, the proportion of transitive triangles.
alpha	The value of alpha corresponding to this value of transitivity.

#### See Also

countPaths, findIDpaths, conductance

## Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# transitivity calculation
conftrans <- transitivity(confmatrix, strict = FALSE)
conftrans$transitive
conftrans$intransitive
conftrans$transitivy
conftrans$transitivity
conftrans$alpha
```

valueConverter win-loss probability matrix value converter

#### Description

valueConverter converts or transforms all values (which range from 0.0 to 1.0) in the win-loss probability matrix into 0.5 - 1.0

## Usage

```
valueConverter(matrix)
```

#### Arguments

matrix the win-loss matrix which is the second output from conductance.

## Value

a matrix of win-loss probability ranging from 0.5 - 1.0.

#### See Also

conductance, individualDomProb, dyadicLongConverter

valueConverter

## Examples

```
# convert an edgelist to conflict matrix
confmatrix <- as.conflictmat(sampleEdgelist)
# find win-loss probability matrix
perm2 <- conductance(confmatrix, 2)
perm2$imputed.conf
perm2$p.hat
convertedValue <- valueConverter(perm2$p.hat)</pre>
```

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