Package 'NTW'

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Type Package

Title Predict gene network using an Ordinary Differential Equation
(ODE) based method

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Description
This package predicts the gene-gene interaction network and identifies the direct transcrip-
tional targets of the perturbation using an ODE (Ordinary Differential Equation) based method.

License GPL-2

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Contents

NTW-package   *Gene interaction network and perturbation targets predictions*

Description

This package includes the functions for estimating the gene-gene interaction network (a matrix, named *A*, with genes as rows and columns) and the associated transcriptional targets of the perturbations (a matrix, named *P*, with genes as rows and perturbations as columns). These estimations are computed with the NTW algorithm, a gene network inference algorithm based on ODE (ordinary differential equation) method, see *reference*. In this package, the whole *A* matrix and *P* matrix are estimated row by row with the function *AP.estimation.Srow*, and built together with the function *NTW*. *AP.estimation.Srow* can be used independently so that estimation of each row can be performed in parallel, improving computation time. For solving the steady state ODE equations, 3 regression methods are supplied: *geo*, *sse* and *ml*, see details in the the corresponding function help pages. In addition, in order to accelerate the estimation of matrix *A*, an option is available to make use of some prior information such as gene association (output from other gene netwrok inference algorithms, or from literature) in *NTW*. The regression methods used in forward or backward mode makes 6 possibilities available for estimating a single row of *A* matrix. The main functions in this package are listed below,

- *NTW*, to estimate the whole matrix *A* and *P* (if P is unknown).
- *AP.estimation.Srow*, to estimate one single row in *A* and *P* .
- *A.estimation.Srow*, to estimate one single row in *A* with *P* known.
- *backward* and *forward*, to estimate one single row of matrix *A* with different patterns of using prior gene association information.
- *method.geo*, *method.sse* and *method.ml*, to estimate one single row of matrix *A* with different regression methods.
- *comb.matrix*, sub-function to create all the combinations for regressor locations.
- *P.preestimation*, pre-estimate *P* matrix according to the gene expression data.

Details

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Author(s)

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References

Applied method for the inference of gene networks: the bifidobacterium case. to be submitted

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A.estimation.Srow	*Estimation of a single row in matrix A with the perturbation targets matrix P known*

Description

Estimating a single row of gene interaction matrix *A* when the perturbation targets matrix P is given. The single row in *A* is then regressed according to the equation AX=P with one of the three regression methods, *geo*, *sse* and *ml* .

Usage

```
A.estimation.Srow(r, cMM.corrected, pred.net, X, P.known, topD, restK, cFlag, sup.drop, noiseLevel)
```

Arguments

r	A number indicating the row of *A* to be estimated.
cMM.corrected	A flag to indicate whether a prior network is applied.
pred.net	A matrix with the same dimensions of *A* for prior network, which should be specified if cMM.corrected is 1, default is NULL.
X	Gene expression data, a matrix with genes as rows and perturbations as columns.
P.known	A known P matrix with the same dimensions of *X*.
topD	A parameter in NTW algorithm for keeping the top *topD* combinations of non-zero regressors of row *r* in *A*, see *vignette* for details.
restK	A vector (length equals to *nrow(A)*) with each element to indicate the number of non-zero regressors in the corresponding row of *A*.
cFlag	A flag to tell the regression methods, "geo" for geometric mean method, "sse" for sum of square method and "ml" for maximum likelihood method.
sup.drop	An indication to identify the pattern for using the prior gene association information. *1* for "forward" pattern and *-1* for "backward" pattern, see *vignette* for details.
noiseLevel	Only used in "ml" method, to indicate the noise level in each perturbed experiment.

Value

A.row	A vector of estimated row *r* in *A*.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang,Yuanhua Liu, Christine Nardini

Examples

```
##single row estimation without prior gene association information, regression is done by "sse"##
data(sos.data)
X<-sos.data
X<-as.matrix(X)
P.known<-matrix(round(runif(nrow(X)*ncol(X), min=0, max=1)), nrow(X), ncol(X))
restK=rep(ncol(X)-1, nrow(X))
topD = round(0.6*nrow(X))
topK = round(0.5*nrow(X))
result<-A.estimation.Srow(r=1,cMM.corrected = 0, pred.net= NULL,X,P.known, topD, restK,
            cFlag="sse",sup.drop = -1, noiseLevel=0.1)
result$A.row

##single row estimation with prior gene association information, regression is done by "geo"###
pred.net<-matrix(round(runif(nrow(X)*nrow(X), min=0, max=1)), nrow(X), ncol(X))
result<-A.estimation.Srow(r=1,cMM.corrected = 1, pred.net,X,P.known,topD, restK,
            cFlag="geo",sup.drop = -1, noiseLevel=0.1)
result$A.row
```

AP.estimation.Srow	*Estimation of a single row in gene interaction matrix A and perturbation targets matrix P*

Description

Estimating a single row of gene interaction matrix *A* and identifying the perturbations which target the corresponding gene of the row. For perturbation identifications, multiple perturbations are considered for one target (gene). Combinations of perturbations are first assumed fixed. The single row in *A* are then regressed according to equation AX=P with one of the three regression methods, *geo* ,*sse* and *ml*. All these combinations will finally be optimized according to the difference between the predicted *X* with the estimated *A* and *P* and the experimental values.

Usage

```
AP.estimation.Srow(r, cMM.corrected, pred.net, X, IX, topD, restK, cFlag, sup.drop, numP, noiseLevel)
```

Arguments

r	A number indicating the row of *A* and *P* to be estimated.
cMM.corrected	A flag to indicate whether a prior network is applied.
pred.net	A matrix with the same dimensions of *A* for the prior network, which should be specified if cMM.corrected is 1, default is NULL.
X	Gene expression data, a matrix with genes as rows and perturbations as columns.

IX	The pre-estimated P matrix according to the gene expression data X, with the same dimensions of X or P.
topD	A parameter in NTW algorithm for keeping the top topD combinations of non-zero regressors of row r in A, see *vignette* for details.
restK	A vector (length equals to *nrow(A)*) with each element to indicate the number of non-zero regressors in the corresponding row of A.
cFlag	A flag to identify the regression methods, "geo" for geometric mean method, "sse" for sum of square method and "ml" for maximum likelihood method.
sup.drop	A flag to show the pattern for using the prior gene association information. *1* for "forward" pattern and *-1* for "backward" pattern.
numP	A number set to limit the possibilities that one gene will be targeted by perturbations. That is at most *numP* perturbations can directly perturb one gene.
noiseLevel	Only used in "ml" method, to indicate the noise level in each perturbed experiment.

Value

A.row	Estimation of the row r in A.
P.index	A vector to show which perturbations target the gene corresponding to row r.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang,Yuanhua Liu, Christine Nardini

Examples

```
##single row estimation without prior gene association information, regression is done by "sse"##
data(sos.data)
X<-sos.data
X<-as.matrix(X)
IX<-P.preestimation(X, topK= round(2*nrow(X)))
restK=rep(ncol(X)-1, nrow(X))
topD = round(0.6*nrow(X))
topK = round(0.5*nrow(X))
numP = round(0.25*nrow(X))
result<-AP.estimation.Srow(r=1,cMM.corrected = 0, pred.net= NULL,X, IX,topD, restK,
                cFlag="sse",sup.drop = -1, numP, noiseLevel=0.1)
result$A.row
result$P.index

###single row estimation with prior gene association information, regression is done by "geo"###
pred.net<-matrix(round(runif(nrow(X)*nrow(X), min=0, max=1)), nrow(X), ncol(X))
result<-AP.estimation.Srow(r=1,cMM.corrected = 1, pred.net,X, IX,topD, restK,
            cFlag="geo",sup.drop = -1, numP, noiseLevel=0.1)
result$A.row
result$P.index
```

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comb.matrix   *Create all combinations of vectors*

Description

Create all combinations of vectors especially for matrices.

Usage

```
comb.matrix(x, y)
```

Arguments

x   A vector.

y   A vector.

Value

A matrix with nrow(x)*nrow(y) rows and ncol(x)+ncol(y) columns.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang, Yuanhua Liu, Christine Nardini

Examples

```
###A matrix with only one row is obtained####
x<-c(1,2,3)
y<-c(4,5)
comb.matrix(x,y)
###A matrix with 2 rows and 4 columns is obtained####
x<-matrix(x,1,)
y<-matrix(y,,1)
comb.matrix(x,y)
```

---

methods.regression   *Regression methods to estimate a single row in A with fixed perturbations*

Description

Regression methods to estimate a single row in a gene interaction network (*A*) with perturbations (*P*) fixed. These methods differ at the regression criterions: the objective function of *geo* is the geometric mean, sum of square for *sse* and maximum likelihood for *ml*, see *vignette* for the details.

Usage

```
method.geo(index.vars, X, pert)
method.sse(index.vars, X, pert)
method.ml(index.vars, X, pert, noiseLevel)
```

Arguments

`index.vars`	A vector to select the rows in *X* on which regression will be used. It sets a group of combination of rows in *X*.
`X`	Gene expression data, a matrix with genes as rows and perturbations as columns.
`pert`	A vector of row *r* in *P*.
`noiseLevel`	Indicate the noise level in each perturbed experiment.

Value

`sol`	A vector of regression result
`error`	The result of the objective function.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang,Yuanhua Liu, Christine Nardini

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NTW	*Estimation of gene interaction matrix A and perturbation targets matrix P*

Description

This function is used to estimate the whole gene interaction matrix *A* and the perturbation targets matrix *P*, row-wise, using the NTW algorithm (see *reference*), based on ODE method. In this method, the linearized ODE can solved using 3 regression methods: *geo*, *sse* and *ml*. In order to save computation time, and improve results, NTW offers the opportunity to input gene association information output from other algorithms or from the literature. The non-null regressors in the gene association network will help fix the regressors to be estimated in the final matrix *A*. Two ways are supplied to use the non-zero information, namely *forward* and *backward* approaches. In the "backward" pattern, only the non-zero positions in the prior gene association network will be used as regressors in *A*. While in the "forward" pattern, both these non-zero positions and some other possible positions (depending on *restK*) in *A* are used as regressors.

Usage

```
NTW(X, restK, topD, topK = NULL, P.known = NULL, cFlag, pred.net = NULL, sup.drop = -1, numP = NULL, noise
```

Arguments

X	Gene expression data, a matrix with genes as rows and perturbations as columns.
restK	A vector (length equals to nrow(A)) with each element to indicate the number of non-zero regressors in the corresponding row of *A*.
topD	A parameter in NTW algorithm for keeping the top *topD* combinations of non-zero regressors of a single row in *A*, see *vignette* for details.
topK	The number of possible targets of the perturbations, used for pre-estimate the perturbation targets matrix *P* .
P.known	A known P matrix with the same dimensions of *X*.
cFlag	A flag to tell the regression methods, "geo" for geometric mean method, "sse" for sum of square method and "ml" for maximum likelihood method.
pred.net	A matrix with the same dimensions of *A* for the prior gene association information. Default is NULL.
sup.drop	An indication to show the pattern for using the prior gene association information. *1* for "forward" pattern and *-1* for "backward" pattern.
numP	A number set to limit the possibilities that one gene will be targeted by perturbations. That is at most *numP* perturbations can directly perturb one gene.
noiseLevel	Only used in *ml* method, to indicate the noise level in each perturbed experiment.

Value

est.A	Estimated gene interaction matrix *A*, with genes as rows and columns.
est.P	Estimated perturbation targets matrix *P*, with genes as rows and perturbations as columns.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang,Yuanhua Liu, Christine Nardini

References

Applied method for the inference of gene networks: the bifidobacterium case. to be submitted

Examples

```
##NTW testing without prior gene association information, regression is done by "sse"##
data(sos.data)
X<-sos.data
X<-as.matrix(X)
restK=rep(ncol(X)-1, nrow(X))
topD = round(0.6*nrow(X))
topK = round(0.5*nrow(X))
numP = round(0.25*nrow(X))
result<-NTW(X, restK, topD, topK, P.known=NULL, cFlag="sse",
            pred.net = NULL, sup.drop = -1,numP, noiseLevel=0.1)
result$est.A
result$est.P
```

```
##NTW testing with prior gene association information, regression is done by "geo"##
pred.net<-matrix(round(runif(nrow(X)*nrow(X), min=0, max=1)), nrow(X), nrow(X))
result<-NTW(X, restK, topD, topK, P.known=NULL, cFlag="geo",
            pred.net, sup.drop = -1,numP, noiseLevel=0.1)
result$est.A
result$est.P
```

P.preestimation | *Pre-estimation of the transcriptional pertubation targets matrix P*

Description

Pre-estimate the potential transcriptional perturbation targets matrix *P* according to gene expression data *X* . Those genes with the changes in top topK will be assumed as possible targets of the perturbations.

Usage

```
P.preestimation(X, topK)
```

Arguments

X   Gene expression data, a matrix with rows as genes and columns as experiments.

topK   The number of possible targets of the perturbations.

Value

A matrix with the same structure of *X* or *P*.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang, Yuanhua Liu, Christine Nardini

Examples

```
data(sos.data)
X<-sos.data
X<-as.matrix(X)
IX<-P.preestimation(X, topK= round(0.6*nrow(X)))
IX
```

---

patterns.priorA   *Approaches to use a priori known gene association information for a*
                                   single row estimation in matrix A

Description

Given some information of the gene interaction network, for example the estimated gene associa-
tion matrix *pred.net* by other algorithms or from literature, NTW can use this prior information to
enhance acurracy. NTW offers two approaches to infer the gene network, i.e. *forward* and *back-
ward*, on the base of *pred.net*. The former computes further edges than the ones in *pred.net*, while
the latter prunes edges.

Usage

```
backward(r, X, pert, topD, restk, cFlag, TA, noiseLevel)
forward(r, X, pert, topD, restk, cFlag, TA, noiseLevel)
```

Arguments

r	A number to indicate the row of *A* to be estimated when row *r* of P is fixed.
X	Gene expression data, a matrix with genes as rows and perturbations as columns.
pert	Row *r* in *P*.
topD	A parameter in NTW algorithm for keeping the top *topD* combinations of non-zero regressors of row *r* in *A*, see *vignette* for details.
restk	The number of non-zero regressors for the estimation of row *r* in *A*.
cFlag	A flag to identify the regression methods, "geo" for geometric mean method, "sse" for sum of square method and "ml" for maximum likelihood method.
TA	A vector including the indexes of non-zero elements in row *r* of the network containing a priori information, *pred.net*.
noiseLevel	Only used in "ml" method, to indicate the noise level in each perturbed experiment.

Value

A.row	A vector of estimated row *r* in *A*.
CrtValue	The minimum value from the objective function.

Author(s)

Wei Xiao, Yin Jin, Darong Lai, Xinyi Yang,Yuanhua Liu, Christine Nardini

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sos.data   *SOS pathway perturbation data*

Description

RT-PCR data with 9 genes in SOS pathway of *Escherichia coli* perturbed. These 9 perturbed genes are observed in the RT-PCR experiments.

Usage

```
data(sos.data)
```

Format

sos.data is a data frame containing 9 rows for observed genes and 9 columns for perturbations.

References

T.S. Gardner, D.di Bernardo, D. Lorenz, and J.J. Collins. Inferring genetic networks and identifying compound mode of action via expression profiling. Science, 301(5629): 102-105, 2003.

Examples

```
data(sos.data)
sos.data
```

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