

Package ‘AMOUNTAIN’

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Type Package

Title Active modules for multilayer weighted gene co-expression networks: a continuous optimization approach

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Description

A pure data-driven gene network, weighted gene co-expression network (WGCN) could be constructed only from expression profile. Different layers in such networks may represent different time points, multiple conditions or various species. AMOUNTAIN aims to search active modules in multi-layer WGCN using a continuous optimization approach.

License GPL (>= 2)

Depends R (>= 3.3.0)

Imports stats

RoxygenNote 5.0.1

SystemRequirements gsl

biocViews GeneExpression, Microarray, DifferentialExpression, Network

Suggests BiocStyle, qgraph, knitr, rmarkdown

VignetteBuilder knitr

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R topics documented:

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 CGPFixSS

Module Identification

Description

Call C version of moduleIdentificationGPFixSS

Usage

CGPFixSS(W, z, x0, a = 0.5, lambda = 1, maxiter = 50)

Arguments

| | |
|---------|---|
| W | edge score matrix of the network, n x n matrix |
| z | node score vector of the network, n-length vector |
| x0 | initial solution, n-length vector |
| a | parameter in elastic net the same as in EuclideanProjectionENNORM |
| lambda | parameter in objective, coefficient of node score part |
| maxiter | maximal iteration of whole procedure |

Value

a list containing function objective vector and the solution

Author(s)

Dong Li, <dx1466@cs.bham.ac.uk>

References

AMOUNTAIN

See Also

[moduleIdentificationGPFixSS](#)

Examples

```

n = 100
k = 20
theta = 0.5
pp <- networkSimulation(n,k,theta)
moduleid <- pp[[3]]
## use default parameters here
x <- CGPFixSS(pp[[1]],pp[[2]],rep(1/n,n))
predictedid<-which(x[[2]]!=0)
recall <- length(intersect(predictedid,moduleid))/length(moduleid)
precise <- length(intersect(predictedid,moduleid))/length(predictedid)
Fscore <- (2*precise*recall/(precise+recall))

```

CGPFixSSMultiLayer *Module Identification for multi-layer network*

Description

Call C version of moduleIdentificationGPFixSSMultilayer

Usage

```
CGPFixSSMultiLayer(W, listzs, x0, a = 0.5, lambda = 1, maxiter = 50)
```

Arguments

| | |
|---------|---|
| W | edge score matrix of the network, n x n matrix |
| listzs | a list of node score vectors, each layer has a n-length vector |
| x0 | initial solution, n-length vector |
| a | parameter in elastic net the same as in EuclideanProjectionENNORM |
| lambda | parameter in objective, coefficient of node score of other layers |
| maxiter | maximal iteration of whole procedure |

Value

a list containing solution for network 1 and network 2

Author(s)

Dong Li, <dx1466@cs.bham.ac.uk>

References

AMOUNTAIN

See Also

[moduleIdentificationGPFixSSMultilayer](#)

Examples

```

n = 100
k = 20
L = 5
theta = 0.5
cpl <- multilayernetworkSimulation(n,k,theta,L)
listz <- list()
for (i in 1:L){
  listz[[i]] <- cpl[[i+2]]
}
moduleid <- cpl[[2]]
## use default parameters here
x <- CGPFixSSMultiLayer(cpl[[1]],listz,rep(1/n,n))
predictedid <- which(x[[2]]!=0)
recall <- length(intersect(predictedid,moduleid))/length(moduleid)
precise <- length(intersect(predictedid,moduleid))/length(predictedid)
Fscore <- (2*precise*recall/(precise+recall))

```

CGPFixSSTwolayer

*Module Identification for two-layer network***Description**

Call C version of moduleIdentificationGPFixSSTwolayer

Usage

```

CGPFixSSTwolayer(W1, z1, x0, W2, z2, y0, interlayerA, lambda1 = 1,
  lambda2 = 1, lambda3 = 1, maxiter = 100, a1 = 0.5, a2 = 0.5)

```

Arguments

| | |
|-------------|---|
| W1 | edge score matrix of the network 1, $n_1 \times n_1$ matrix |
| z1 | node score vector of the network 1, n_1 -length vector |
| x0 | initial solution of network 1, n_1 -length vector |
| W2 | edge score matrix of the network 2, $n_2 \times n_2$ matrix |
| z2 | node score vector of the network 2, n_2 -length vector |
| y0 | initial solution of network 2, n_2 -length vector |
| interlayerA | inter-layer links weight, $n_1 \times n_2$ matrix |
| lambda1 | parameter in objective, coefficient of node score of network 1 |
| lambda2 | parameter in objective, coefficient of node score of network 2 |
| lambda3 | parameter in objective, coefficient of inter-layer links part |
| maxiter | maximal iteration of whole procedure |
| a1 | parameter in elastic net the same as in EuclideanProjectionENNORM |
| a2 | parameter in elastic net the same as in EuclideanProjectionENNORM |

Value

a list containing solution for network 1 and network 2 and objective

Author(s)

Dong Li, <dx1466@cs.bham.ac.uk>

References

AMOUNTAIN

See Also

[moduleIdentificationGPFixSSTwoLayer](#)

Examples

```
n1=100
k1=20
theta1 = 0.5
n2=80
k2=10
theta2 = 0.5
ppresult <- twolayernetSimulation(n1,k1,theta1,n2,k2,theta2)
A <- ppresult[[3]]
pp <- ppresult[[1]]
moduleid <- pp[[3]]
netid <- 1:n1
restp<- netid[-moduleid]
pp2 <- ppresult[[2]]
moduleid2 <- pp2[[3]]
## use default parameters here
modres=CGPFixSSTwoLayer(pp[[1]],pp[[2]],rep(1/n1,n1),
pp2[[1]],pp2[[2]],rep(1/n2,n2),A)
predictedid<-which(modres[[1]]!=0)
recall = length(intersect(predictedid,moduleid))/length(moduleid)
precise = length(intersect(predictedid,moduleid))/length(predictedid)
F1 = 2*precise*recall/(precise+recall)
predictedid2<-which(modres[[2]]!=0)
recall2 = length(intersect(predictedid2,moduleid2))/length(moduleid2)
precise2 = length(intersect(predictedid2,moduleid2))/length(predictedid2)
F2 = 2*precise2*recall2/(precise2+recall2)
```

EuclideanProjectionENNORM

Euclidean projection on elastic net

Description

Piecewise root finding algorithm for Euclidean projection on elastic net

Usage

```
EuclideanProjectionENNORM(y, t, alpha = 0.5)
```

Arguments

| | |
|-------|--|
| y | constant vector |
| t | radius of elastic net ball |
| alpha | parameter in elastic net: $\alpha x_1 + (1-\alpha)x_2^2=t$ |

Value

a list containing network adjacency matrix, node score and module membership

Author(s)

Dong Li, <dxl466@cs.bham.ac.uk>

References

Gong, Pinghua, Kun Gai, and Changshui Zhang. "Efficient euclidean projections via piecewise root finding and its application in gradient projection." *Neurocomputing* 74.17 (2011): 2754-2766.

Examples

```
y=rnorm(100)
x=EuclideanProjectionENNORM(y,1,0.5)
sparistyx = sum(x==0)/100
```

moduleIdentificationGPFixSS
Module Identification

Description

Algorithm for Module Identification on single network

Usage

```
moduleIdentificationGPFixSS(W, z, x0, a = 0.5, lambda = 1, maxiter = 1000)
```

Arguments

| | |
|---------|---|
| W | edge score matrix of the network, n x n matrix |
| z | node score vector of the network, n-length vector |
| x0 | initial solution, n-length vector |
| a | parameter in elastic net the same as in EuclideanProjectionENNORM |
| lambda | parameter in objective, coefficient of node score part |
| maxiter | maximal iteration of whole procedure |

Value

a list containing function objective vector and the solution

Author(s)

Dong Li, <dxl466@cs.bham.ac.uk>

References

AMOUNTAIN

See Also

[EuclideanProjectionENNORM](#)

Examples

```
n = 100
k = 20
theta = 0.5
pp <- networkSimulation(n,k,theta)
moduleid <- pp[[3]]
## use default parameters here
x <- moduleIdentificationGPFixSS(pp[[1]],pp[[2]],rep(1/n,n))
predictedid<-which(x[[2]]!=0)
recall <- length(intersect(predictedid,moduleid))/length(moduleid)
precise <- length(intersect(predictedid,moduleid))/length(predictedid)
Fscore <- (2*precise*recall/(precise+recall))
```

moduleIdentificationGPFixSSMultilayer

Module Identification for multi-layer network

Description

Algorithm for Module Identification on multi-layer network sharing the same set of genes

Usage

```
moduleIdentificationGPFixSSMultilayer(W, listz, x0, a = 0.5, lambda = 1,
  maxiter = 1000)
```

Arguments

| | |
|---------|---|
| W | edge score matrix of the network, n x n matrix |
| listz | a list of node score vectors, each layer has a n-length vector |
| x0 | initial solution, n-length vector |
| a | parameter in elastic net the same as in EuclideanProjectionENNORM |
| lambda | parameter in objective, coefficient of node score of other layers |
| maxiter | maximal iteration of whole procedure |

Value

a list containing objective values and solution

Author(s)

Dong Li, <dxl466@cs.bham.ac.uk>

References

AMOUNTAIN

See Also

[moduleIdentificationGPFixSSMultilayer](#)

Examples

```
n = 100
k = 20
L = 5
theta = 0.5
cpl <- multilayernetworkSimulation(n,k,theta,L)
listz <- list()
for (i in 1:L){
  listz[[i]] <- cpl[[i+2]]
}
moduleid <- cpl[[2]]
## use default parameters here
x <- moduleIdentificationGPFixSSMultilayer(cpl[[1]],listz,rep(1/n,n))
predictedid <- which(x[[2]]!=0)
recall <- length(intersect(predictedid,moduleid))/length(moduleid)
precise <- length(intersect(predictedid,moduleid))/length(predictedid)
Fscore <- (2*precise*recall)/(precise+recall)
```

moduleIdentificationGPFixSSTwolayer

Module Identification for two-layer network

Description

Algorithm for Module Identification on two-layer network

Usage

```
moduleIdentificationGPFixSSTwolayer(W1, z1, x0, W2, z2, y0, A, lambda1 = 1,
  lambda2 = 1, lambda3 = 1, maxiter = 1000, a1 = 0.5, a2 = 0.5)
```

Arguments

| | |
|----|---|
| W1 | edge score matrix of the network 1, $n_1 \times n_1$ matrix |
| z1 | node score vector of the network 1, n_1 -length vector |
| x0 | initial solution of network 1, n_1 -length vector |
| W2 | edge score matrix of the network 2, $n_2 \times n_2$ matrix |
| z2 | node score vector of the network 2, n_2 -length vector |
| y0 | initial solution of network 2, n_2 -length vector |

| | |
|---------|---|
| A | inter-layer links weight, $n_1 \times n_2$ matrix |
| lambda1 | parameter in objective, coefficient of node score of network 1 |
| lambda2 | parameter in objective, coefficient of node score of network 2 |
| lambda3 | parameter in objective, coefficient of inter-layer links part |
| maxiter | maximal iteration of whole procedure |
| a1 | parameter in elastic net the same as in EuclideanProjectionENNORM |
| a2 | parameter in elastic net the same as in EuclideanProjectionENNORM |

Value

a list containing solution for network 1 and network 2 and objective

Author(s)

Dong Li, <dx1466@cs.bham.ac.uk>

References

AMOUNTAIN

See Also

[EuclideanProjectionENNORM](#)

Examples

```
n1=100
k1=20
theta1 = 0.5
n2=80
k2=10
theta2 = 0.5
ppresult <- twolayernetSimulation(n1,k1,theta1,n2,k2,theta2)
A <- ppresult[[3]]
pp <- ppresult[[1]]
moduleid <- pp[[3]]
netid <- 1:n1
restp<- netid[-moduleid]
pp2 <- ppresult[[2]]
moduleid2 <- pp2[[3]]
## use default parameters here
modres=moduleIdentificationGPFixSSTwolayer(pp[[1]],pp[[2]],rep(1/n1,n1),
pp2[[1]],pp2[[2]],rep(1/n2,n2),A)
predictedid<-which(modres[[1]]!=0)
recall = length(intersect(predictedid,moduleid))/length(moduleid)
precise = length(intersect(predictedid,moduleid))/length(predictedid)
F1 = 2*precise*recall/(precise+recall)
predictedid2<-which(modres[[2]]!=0)
recall2 = length(intersect(predictedid2,moduleid2))/length(moduleid2)
precise2 = length(intersect(predictedid2,moduleid2))/length(predictedid2)
F2 = 2*precise2*recall2/(precise2+recall2)
```

multilayernetworkSimulation

Illustration of multi-layer weighted network simulation

Description

Simulate a multi-layer weighted network with each layer sharing the same set of nodes but different nodes scores

Usage

```
multilayernetworkSimulation(n, k, theta, L)
```

Arguments

| | |
|-------|--|
| n | number of nodes in each layer of the network |
| k | number of nodes in the conserved module |
| theta | module node score follow the uniform distribution in range [theta,1] |
| L | number of layers |

Value

a list containing all the layers, each as result object of [networkSimulation](#)

Author(s)

Dong Li, <dxl466@cs.bham.ac.uk>

See Also

[networkSimulation](#)

Examples

```
n = 100
k = 20
theta = 0.5
L = 5
cp1 <- multilayernetworkSimulation(n,k,theta,L)
## No proper way to visualize it yet
```

networkSimulation *Illustration of weighted network simulation*

Description

Simulate a single weighted network

Usage

```
networkSimulation(n, k, theta)
```

Arguments

| | |
|-------|--|
| n | number of nodes in the network |
| k | number of nodes in the module, $n < k$ |
| theta | module node score follow the uniform distribution in range $[\text{theta}, 1]$ |

Value

a list containing network adjacency matrix, node score and module membership

Author(s)

Dong Li, <dxl466@cs.bham.ac.uk>

Examples

```
pp <- networkSimulation(100,20,0.5)
moduleid <- pp[[3]]
netid <- 1:100
restp<- netid[-moduleid]
groupdesign=list(moduleid,restp)
names(groupdesign)=c('module', 'background')
## Not run: library(qgraph)
pg<-qgraph(pp[[1]],groups=groupdesign,legend=TRUE)
## End(Not run)
```

twolayernetworkSimulation *Illustration of two-layer weighted network simulation*

Description

Simulate a two-layer weighted network

Usage

```
twolayernetworkSimulation(n1, k1, theta1, n2, k2, theta2)
```

Arguments

| | |
|--------|--|
| n1 | number of nodes in the network1 |
| k1 | number of nodes in the module1, $n1 < k1$ |
| theta1 | module1 node score follow the uniform distribution in range $[\text{theta1}, 1]$ |
| n2 | number of nodes in the network2 |
| k2 | number of nodes in the module2, $n2 < k2$ |
| theta2 | module2 node score follow the uniform distribution in range $[\text{theta2}, 1]$ |

Value

a list containing network1, network2 and a inter-layer links matrix

Author(s)

Dong Li, <dx1466@cs.bham.ac.uk>

See Also

[networkSimulation](#)

Examples

```
n1=100
k1=20
theta1 = 0.5
n2=80
k2=10
theta2 = 0.5
ppresult <- twolayernetworkSimulation(n1,k1,theta1,n2,k2,theta2)
A <- ppresult[[3]]
pp <- ppresult[[1]]
moduleid <- pp[[3]]
netid <- 1:n1
restp<- netid[-moduleid]
pp2 <- ppresult[[2]]
moduleid2 <- pp2[[3]]
netid2 <- 1:n2
restp2<- netid2[-moduleid2]
## labelling the groups
groupdesign=list(moduleid,restp,(moduleid2+n1),(restp2+n1))
names(groupdesign)=c('module1','background1','module2','background2')
twolayernet<-matrix(0,nrow=(n1+n2),ncol=(n1+n2))
twolayernet[1:n1,1:n1]<-pp[[1]]
twolayernet[(n1+1):(n1+n2),(n1+1):(n1+n2)]<-pp2[[1]]
twolayernet[1:n1,(n1+1):(n1+n2)] = A
twolayernet[(n1+1):(n1+n2),1:n1] = t(A)
## Not run: library(qgraph)
g<-qgraph(twolayernet,groups=groupdesign,legend=TRUE)
## End(Not run)
```

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