

# Package ‘DEGraph’

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**Title** Two-sample tests on a graph

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**Description** DEGraph implements recent hypothesis testing methods which directly assess whether a particular gene network is differentially expressed between two conditions. This is to be contrasted with the more classical two-step approaches which first test individual genes, then test gene sets for enrichment in differentially expressed genes. These recent methods take into account the topology of the network to yield more powerful detection procedures. DEGraph provides methods to easily test all KEGG pathways for differential expression on any gene expression data set and tools to visualize the results.

**License** GPL-3

**LazyLoad** yes

**Imports** graph, KEGGgraph, lattice, mvtnorm, R.methodsS3, RBGL,Rgraphviz, rrcov, NCIgraph

**Suggests** corpcor, fields, graph, KEGGgraph, lattice, marray, RBGL,rrcov, Rgraphviz, NCIgraph

**Depends** R (>= 2.10.0), R.utils

**biocViews** Microarray, Bioinformatics, DifferentialExpression,GraphsAndNetworks

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AN.test	<i>Performs the Adaptive Neyman test of Fan and Lin (1998)</i>
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### Description

Performs the Adaptive Neyman test of Fan and Lin (1998).

### Usage

```
AN.test(X1, X2, candK=1:ncol(X1), na.rm=FALSE)
```

### Arguments

X1	A $n_1 \times p$ <b>matrix</b> , observed data for class 1: $p$ variables, $n_1$ observations.
X2	A $n_2 \times p$ <b>matrix</b> , observed data for class 2: $p$ variables, $n_2$ observations.
candK	A <b>vector</b> , candidate values for the true number of Fourier components.
na.rm	A <b>logical</b> value indicating whether variables with <b>NA</b> in at least one of the $n_1 + n_2$ observations should be discarded before the test is performed.

### Value

A **list** with class "htest" containing the following components:

**statistic** A **numeric** value, the test statistic.

**p.value** A **numeric** value, the corresponding p-value.

**kstar** A **numeric** value, the estimated true number of Fourier components.

### Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

### See Also

[BS.test\(\)](#) [graph.T2.test\(\)](#) [hyper.test\(\)](#)

**Examples**

```

library("KEGGgraph")
## library("NCIgraph")
library("rrcov")

data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
classData <- classLoi2008
rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
gr <- grListKEGG[[1]]
gids <- translateKEGGID2GeneID(nodes(gr))
mm <- match(gids, rownames(exprData))

## Keep genes from the graph that are present in the expression data set
idxs <- which(!is.na(mm))
gr <- subGraph(nodes(gr)[idxs], gr)

idxs <- which(is.na(mm))
if(length(idxs)) {
  print("Gene ID not found in expression data: ")
  str(gids[idxs])
}
dat <- exprData[na.omit(mm), ]
str(dat)

X1 <- t(dat[, classData==0])
X2 <- t(dat[, classData==1])

## DEGraph T2 test
res <- testOneGraph(gr, exprData, classData, verbose=TRUE, prop=0.2)

## T2 test (Hotelling)
rT2 <- T2.test(X1, X2)
str(rT2)

## Adaptive Neyman test
rAN <- AN.test(X1, X2, na.rm=TRUE)
str(rAN)

## Adaptive Neyman test from Fan and Lin (1998)
rAN <- AN.test(X1, X2, na.rm=TRUE)
str(rAN)

## Test from Bai and Saranadasa (1996)
rBS <- BS.test(X1, X2, na.rm=TRUE)
str(rBS)

## Hypergeometric test
pValues <- apply(exprData, 1, FUN=function(x) {
  tt <- t.test(x[classData==0], x[classData==1])
  tt$p.value
})
str(pValues)
names(pValues) <- rownames(exprData)

```

```
rHyper <- hyper.test(pValues, gids, thr=0.01)
str(rHyper)
```

---

annLoi2008

*Annotation data used in the DEGraph package vignette*

---

### Description

This data set gives NCBI, Hugo and alternative gene symbols along with the cytoband and description for the 227 genes used in the DEGraph package vignette. This comes from the 15737 gene, 255 patient dataset of Loi et al. (2008) which was used to study resistance to tamoxifen treatment in hormone-dependent breast cancer.

### Usage

```
annLoi2008
```

### Format

A matrix of 227 lines and 5 columns.

### Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

### Source

Loi et al., *Predicting prognosis using molecular profiling in estrogen receptor-positive breast cancer treated with tamoxifen*. BMC Genomics, 9(1):239, 2008.

### References

Loi et al., *Predicting prognosis using molecular profiling in estrogen receptor-positive breast cancer treated with tamoxifen*. BMC Genomics, 9(1):239, 2008.

### Examples

```
data("Loi2008_DEGraphVignette")

dim(annLoi2008)
head(annLoi2008)
```

---

BS.test	<i>Performs the test of Bai and Saranadasa (1996)</i>
---------	---

---

### Description

Performs the test of Bai and Saranadasa (1996).

### Usage

```
BS.test(X1, X2, na.rm=FALSE)
```

### Arguments

X1	A $n_1 \times p$ <b>matrix</b> , observed data for class 1: $p$ variables, $n_1$ observations.
X2	A $n_2 \times p$ <b>matrix</b> , observed data for class 2: $p$ variables, $n_2$ observations.
na.rm	A <b>logical</b> value indicating whether variables with <b>NA</b> in at least one of the $n_1 + n_2$ observations should be discarded before the test is performed.

### Value

A **list** with class "htest" containing the following components:

**statistic** A **numeric** value, the test statistic.

**p.value** A **numeric** value, the corresponding p-value.

### Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

### See Also

[AN.test\(\)](#) [graph.T2.test\(\)](#) [hyper.test\(\)](#)

### Examples

```
library("KEGGgraph")
## library("NCIgraph")
library("rrcov")

data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
classData <- classLoi2008
rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
gr <- grListKEGG[[1]]
gids <- translateKEGGID2GeneID(nodes(gr))
mm <- match(gids, rownames(exprData))

## Keep genes from the graph that are present in the expression data set
idxs <- which(!is.na(mm))
gr <- subGraph(nodes(gr)[idxs], gr)
```

```

idxs <- which(is.na(mm))
if(length(idxs)) {
  print("Gene ID not found in expression data: ")
  str(gids[idxs])
}
dat <- exprData[na.omit(mm), ]
str(dat)

X1 <- t(dat[, classData==0])
X2 <- t(dat[, classData==1])

## DEGraph T2 test
res <- testOneGraph(gr, exprData, classData, verbose=TRUE, prop=0.2)

## T2 test (Hotelling)
rT2 <- T2.test(X1, X2)
str(rT2)

## Adaptive Neyman test
rAN <- AN.test(X1, X2, na.rm=TRUE)
str(rAN)

## Adaptive Neyman test from Fan and Lin (1998)
rAN <- AN.test(X1, X2, na.rm=TRUE)
str(rAN)

## Test from Bai and Saranadasa (1996)
rBS <- BS.test(X1, X2, na.rm=TRUE)
str(rBS)

## Hypergeometric test
pValues <- apply(exprData, 1, FUN=function(x) {
  tt <- t.test(x[classData==0], x[classData==1])
  tt$p.value
})
str(pValues)
names(pValues) <- rownames(exprData)
rHyper <- hyper.test(pValues, gids, thr=0.01)
str(rHyper)

```

---

classLoi2008

*Tamoxifen treatment resistance status data used in the DEGraph package vignette*


---

## Description

This data set gives resistance status data for the 255 patients used in the DEGraph package vignette. This comes from the 15737 gene, 255 patient dataset of Loi et al. (2008) which was used to study resistance to tamoxifen treatment in hormone-dependent breast cancer.

## Usage

classLoi2008

**Format**

A vector of 255 elements which are either 0 (resistance to treatment) or 1 (sensitivity to treatment).

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**Source**

Loi et al., *Predicting prognosis using molecular profiling in estrogen receptor-positive breast cancer treated with tamoxifen*. BMC Genomics, 9(1):239, 2008.

**References**

Loi et al., *Predicting prognosis using molecular profiling in estrogen receptor-positive breast cancer treated with tamoxifen*. BMC Genomics, 9(1):239, 2008.

**Examples**

```
data("Loi2008_DEGraphVignette")  
  
dim(classLoi2008)  
head(classLoi2008)
```

---

exprLoi2008

*Gene expression data used in the DEGraph package vignette*

---

**Description**

This data set gives gene expression data for a subset of 227 genes used in the DEGraph package vignette. This comes from the 15737 gene, 255 patient dataset of Loi et al. (2008) which was used to study resistance to tamoxifen treatment in hormone-dependent breast cancer.

**Usage**

```
exprLoi2008
```

**Format**

A matrix of 227 lines and 255 columns.

**Details**

The original data set corresponds to data processed by RMA and median-centered as available from the GSE6532 GEO archive: <http://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE6532>.

These data were summarized from the probe set level to the gene level as follows. The expression level of a gene was defined as the expression level of the probe set with largest alignment score among all probe sets mapping to this gene according to the annotation in GSE6532. When the largest alignment score was achieved by several probe sets, the median expression level of those probe sets was taken.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**Source**

Loi et al., *Predicting prognosis using molecular profiling in estrogen receptor-positive breast cancer treated with tamoxifen*. BMC Genomics, 9(1):239, 2008.

**References**

Loi et al., *Predicting prognosis using molecular profiling in estrogen receptor-positive breast cancer treated with tamoxifen*. BMC Genomics, 9(1):239, 2008.

**Examples**

```
data("Loi2008_DEGraphVignette")  
  
dim(exprLoi2008)  
head(exprLoi2008)
```

---

getConnectedComponentList

*Given a graph, returns a list of its connected components (which are also graph objects), ordered by decreasing number of nodes*

---

**Description**

Given a graph, returns a list of its connected components (which are also graph objects), ordered by decreasing number of nodes.

**Usage**

```
getConnectedComponentList(graph, verbose=FALSE)
```

**Arguments**

graph	A <a href="#">graph</a> object.
verbose	If <a href="#">TRUE</a> , extra information is output.

**Value**

A [list](#) containing a [graph](#) object for each connected component of the input graph, ordered by decreasing number of nodes

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[connectedComp](#).



**Examples**

```

data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
graph <- grListKEGG[[1]]
pname <- attr(graph, "label")
cat(verbose, "Pathway name: ", pname)

sgraph <- getSignedGraph(graph, verbose=TRUE)
print(sgraph)

graphList <- getConnectedComponentList(graph, verbose=TRUE)
print(graphList)

```

---

getKEGGPathways	<i>Builds a graph for each of the KEGG pathways</i>
-----------------	---

---

**Description**

Builds a graph for each of the KEGG pathways.

**Usage**

```
getKEGGPathways(path=NULL, rootPath="networkData/ftp.genome.jp/pub/kegg/xml/kgml", organism="hsa")
```

**Arguments**

path	A <a href="#">character</a> value, the local <code>_full_</code> path of KGML data.
rootPath	A <a href="#">character</a> value, the local <code>_root_</code> path of KGML data.
organism	A <a href="#">character</a> value specifying the organism whose pathways should be considered. Defaults to "hsa" (Homo Sapiens).
metaTag	A <a href="#">character</a> value, specifying the type of pathways to be considered ("metabolic" or "non-metabolic"). Defaults to "non-metabolic".
pattern	An optional <a href="#">character</a> value specifying a file name pattern to look for.
verbose	If <code>TRUE</code> , extra information is output.

**Details**

If 'path' is supplied, KGML files in this directory are loaded. Otherwise, KGML files are assumed to be in `<rootPath>/<metaTag>/"organisms"/<organism>`, which mirrors the structure of the KEGG KGML file repository.

**Value**

A [list](#) containing a [graph](#) object for each KEGG pathway with at least one edge.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[parseKGMLEGGpathway2Graph](#)

**Examples**

```
library("Rgraphviz")
library("KEGGgraph")

## example of KGMLEGG files
path <- system.file("extdata", package="KEGGgraph")
grList <- getKEGGPathways(path=path, verbose=TRUE)
print(grList)

graph <- grList[[1]]
plotKEGGgraph(graph)

## Not run:
## Download all human KGMLEGG pathways locally
pathname <- system.file("downloadScripts", "downloadKeggXmlFiles.R", package="DEGraph")
source(pathname)

## Load some of them
grList <- getKEGGPathways(pattern="040", verbose=TRUE)
print(grList)

graph <- grList[[1]]
plotKEGGgraph(graph)

## End(Not run)
```

---

getSignedGraph	<i>Given a graph, builds a signed version of the adjacency matrix taking into account the type of interaction (e.g., activation or inhibition)</i>
----------------	--

---

**Description**

Given a graph, builds a signed version of the adjacency matrix taking into account the type of interaction (e.g., activation or inhibition).

**Usage**

```
getSignedGraph(graph, positiveInteractionLabels=c("activation", "expression"), negativeInteracti
```

**Arguments**

graph	A <a href="#">graph</a> object.
positiveInteractionLabels	A <a href="#">character vector</a> specifying which interaction labels correspond to positive interactions. Defaults to 'c("activation", "expression")'.
negativeInteractionLabels	A <a href="#">character vector</a> specifying which interaction labels correspond to negative interactions. Defaults to 'c("inhibition", "repression")'.
verbose	If <a href="#">TRUE</a> , extra information is output.

**Value**

This function returns a squared matrix whose (i,j) entry is:

**0** if edges i and j are not connected

**1** if edges i and j are connected by a positive interaction

**-1** if edges i and j are connected by a negative interaction.

By construction, the absolute value of this matrix is the adjacency matrix of the graph. Edges which cannot be interpreted as corresponding to a positive or a negative interaction are marked as not connected.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**Examples**

```
data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
graph <- grListKEGG[[1]]
pname <- attr(graph, "label")
cat(verbose, "Pathway name: ", pname)

sgraph <- getSignedGraph(graph, verbose=TRUE)
print(sgraph)

graphList <- getConnectedComponentList(graph, verbose=TRUE)
print(graphList)
```

---

graph.T2.test	<i>Performs the Hotelling T2 test in Fourier space</i>
---------------	--

---

**Description**

Performs the Hotelling T2 test in Fourier space.

**Usage**

```
graph.T2.test(X1, X2, G=NULL, lFA=NULL, ..., k=ncol(X1))
```

**Arguments**

X1	A $n_1 \times p$ <b>numeric matrix</b> , observed data for class 1: p variables, $n_1$ observations.
X2	A $n_2 \times p$ <b>numeric matrix</b> , observed data for class 2: p variables, $n_2$ observations.
G	An object of class <b>graphAM</b> or <b>graphNEL</b> , the graph to be used in the two-sample test.

lfA            A list returned by `laplacianFromA()`, containing the Laplacian eigen vectors and eigen values

...            Further arguments to be passed to `laplacianFromA()`.

k              A `numeric` value, number of Fourier components retained for the test.

**Value**

A `list` with class "htest", as returned by `T2.test`.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[T2.test](#) [graphAM](#)

**Examples**

```
library("rrcov")

## Some parameters
n1 <- n2 <- 20
nnodes <- nedges <- 20
k <- 3
ncp <- 0.5
sigma <- diag(nnodes)/sqrt(nnodes)

## Build graph, decompose laplacian
G <- randomWAMGraph(nnodes=nnodes,nedges=nedges)
A <- G@adjMat
lfA <- laplacianFromA(A,ltype="unnormalized")
U <- lfA$U
l <- lfA$l

## Build two samples with smooth mean shift
X <- twoSampleFromGraph(n1,n2,shiftM2=ncp,sigma,U=k)

## Do hypothesis testing
t <- T2.test(X$X1,X$X2) # Raw T-square
print(t$p.value)
tu <- graph.T2.test(X$X1,X$X2,lfA=lfA,k=k) # Filtered T-squares
print(tu$p.value)
```

---

grListKEGG

*KEGG networks used in the DEGraph package vignette*

---

**Description**

This data set gives KEGGgraph objects for two KEGG non-metabolic pathways ("Natural killer cell mediated cytotoxicity" and "Insulin signaling pathway").

**Usage**

```
grListKEGG
```

**Format**

A list of two elements.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**Examples**

```
library("Rgraphviz")
data("Loi2008_DEGraphVignette")

grListKEGG
plot(grListKEGG[[1]])
```

---

hyper.test	<i>Performs an hypergeometric test of enrichment of a set of hypotheses in significant elements</i>
------------	---

---

**Description**

Performs an hypergeometric test of enrichment of a set of hypotheses in significant elements.

**Usage**

```
hyper.test(p.values, testSet, thr=0.001, universe=length(p.values), verbose=FALSE)
```

**Arguments**

p.values	A named <b>numeric</b> vector giving the p-values of all tested elements.
testSet	A <b>character</b> vector giving the ids of the elements in the tested set. Elements of 'testSet' must have a match in 'names(p.values)'.
thr	A <b>numeric</b> value between 0 and 1 giving the threshold on p-values at which an element is declared to be significant.
universe	An <b>integer</b> value giving the number of elements in the considered universe. Defaults to 'length(p.values)'.
verbose	If <b>TRUE</b> , extra information is output.

**Value**

A **list** with class "htest" containing the following components:

**statistic** A **numeric** value, the test statistic.

**p.value** A **numeric** value, the corresponding p-value.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[AN.test\(\)](#) [BS.test\(\)](#) [graph.T2.test\(\)](#)

**Examples**

```
library("KEGGgraph")
## library("NCIgraph")
library("rrcov")

data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
classData <- classLoi2008
rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
gr <- grListKEGG[[1]]
gids <- translateKEGGID2GeneID(nodes(gr))
mm <- match(gids, rownames(exprData))

## Keep genes from the graph that are present in the expression data set
idxs <- which(!is.na(mm))
gr <- subGraph(nodes(gr)[idxs], gr)

idxs <- which(is.na(mm))
if(length(idxs)) {
  print("Gene ID not found in expression data: ")
  str(gids[idxs])
}
dat <- exprData[na.omit(mm), ]
str(dat)

X1 <- t(dat[, classData==0])
X2 <- t(dat[, classData==1])

## DEGraph T2 test
res <- testOneGraph(gr, exprData, classData, verbose=TRUE, prop=0.2)

## T2 test (Hotelling)
rT2 <- T2.test(X1, X2)
str(rT2)

## Adaptive Neyman test
rAN <- AN.test(X1, X2, na.rm=TRUE)
str(rAN)

## Adaptive Neyman test from Fan and Lin (1998)
rAN <- AN.test(X1, X2, na.rm=TRUE)
str(rAN)

## Test from Bai and Saranadasa (1996)
rBS <- BS.test(X1, X2, na.rm=TRUE)
str(rBS)
```

```
## Hypergeometric test
pValues <- apply(exprData, 1, FUN=function(x) {
  tt <- t.test(x[classData==0], x[classData==1])
  tt$p.value
})
str(pValues)
names(pValues) <- rownames(exprData)
rHyper <- hyper.test(pValues, gids, thr=0.01)
str(rHyper)
```

---

laplacianFromA

*Calculates the Laplacian associated to an adjacency matrix*


---

### Description

Calculates the Laplacian associated to an adjacency matrix.

### Usage

```
laplacianFromA(A, k=1, ltype=c("meanInfluence", "normalized", "unnormalized", "totalInfluence"))
```

### Arguments

A	The adjacency matrix of the graph.
k	...
ltype	A <a href="#">character</a> value specifying the type of Laplacian to be calculated. Defaults to meanInfluence.

### Value

A [list](#) containing the following components:

**U** Eigenvectors of the graph Laplacian.

**I** Eigenvalues of the graph Laplacian

**kIdx** Multiplicity of '0' as eigenvalue.

### Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

### Examples

```
library("KEGGgraph")
library("rrcov")

## Create a random graph
graph <- randomWAMGraph(nnodes=5, nedges=7, verbose=TRUE)
plot(graph)

## Retrieve its adjacency matrix
A <- graph@adjMat
```

```

## write it to KGML file
grPathname <- "randomWAMGraph.xml"
writeAdjacencyMatrix2KGML(A, pathname=grPathname, verbose=TRUE, overwrite=TRUE)

## read it from file
gr <- parseKGML2Graph(grPathname)

## Two examples of Laplacians from the same graph
lapMI <- laplacianFromA(A, ltype="meanInfluence")
print(lapMI)

lapN <- laplacianFromA(A, ltype="normalized")
print(lapN)

U <- lapN$U
p <- nrow(A)
sigma <- diag(p)/sqrt(p)

X <- twoSampleFromGraph(100, 120, shiftM2=1, sigma, U=U, k=3)

## T2
t <- T2.test(X$X1,X$X2)
str(t)

tu <- graph.T2.test(X$X1, X$X2, lfA=lapMI, k=3)
str(tu)

```

---

plotValuedGraph

*Plots a graph with nodes colored according to a quantitative variable*


---

### Description

Plots a graph with nodes colored according to a quantitative variable.

### Usage

```
plotValuedGraph(graph, values=NULL, nodeLabels=nodes(graph), qMax=0.95, colorPalette=heat.colors)
```

### Arguments

graph	A <a href="#">graph</a> object.
values	A named <a href="#">vector</a> of <a href="#">numeric</a> values according to which the graph nodes should be colored.
nodeLabels	A <a href="#">character vector</a> of the same length and in the same order as 'nodes(graph)': node labels to be displayed. Defaults to 'nodes(graph)'.
qMax	A <a href="#">numeric</a> value, fraction of the data to be truncated in order to avoid outliers.
colorPalette	A <a href="#">character</a> vector, the set of colors to be used.
adjustColorRange	A <a href="#">logical</a> value. If <a href="#">TRUE</a> , the color range is adjusted to the range of values of nodes actually present in the graph. Defaults to <a href="#">FALSE</a> , i.e. the color range spans range(values) regardless of which nodes are present in the graph.



symmetrizeArrows	A <b>logical</b> value. If <b>TRUE</b> , arrow tails are drawn as the corresponding arrow heads. Defaults to <b>FALSE</b> .
height	A <b>numeric</b> value, the (common) size of nodes.
lwd	A <b>numeric</b> value, the (common) width of edges.
cex	A <b>numeric</b> value, the relative size of the text for gene names.
...	Further arguments to be passed to 'edgeRenderInfo' and 'nodeRenderInfo'.
verbose	If <b>TRUE</b> , extra information is output.

**Value**

A **list** containing the following components:

**graph** The 'graph' object as plotted.

**breaks** The break points in the supplied values (can be used for plotting a legend).

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[plotKEGGgraph](#) [plot\(\)](#)

**Examples**

```
library("Rgraphviz")
library("KEGGgraph")
## library("NCIgraph")

data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
classData <- classLoi2008
annData <- annLoi2008

rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
graph <- grListKEGG[[1]]
pname <- attr(graph, "label")
print(pname)

## DEGraph T2 test
resList <- testOneGraph(graph, exprData, classData, verbose=TRUE, prop=0.2)

## Largest connected component
res <- resList[[1]]
gr <- res$graph

## individual t statistics
shift <- apply(exprData, 1, FUN=function(x) {
  tt <- t.test(x[classData==0], x[classData==1])
  tt$statistic
})
```

```

names(shift) <- translateGeneID2KEGGID(names(shift))

## color palette
if (require(marray)) {
  pal <- maPalette(low="red", high="green", mid="black", k=100)
} else {
  pal <- heat.colors(100)
}

## plot results
dn <- getDisplayName(gr, shortLabel=TRUE)
mm <- match(translateKEGGID2GeneID(nodes(gr)), rownames(annData))
dn <- annData[mm, "NCBI.gene.symbol"]

pvg <- plotValuedGraph(gr, values=shift, nodeLabels=dn, qMax=0.95, colorPalette=pal, height=40, lwd=1, verbose=FALSE,
  title(pname))

txt1 <- sprintf("p(T2)=%s", signif(res$p.value[1], 2))
txt2 <- sprintf("p(T2F[%s])=%s", res$k, signif(res$p.value[2]))
txt <- paste(txt1, txt2, sep="\n")
stext(side=3, pos=1, txt)
if (require(fields)) {
  image.plot(legend.only=TRUE, xlim=range(pvg$breaks), col=pal, legend.shrink=0.3, legend.width=0.8, legend.x=1, legend.y=1)
}

```

---

randomWAMGraph

*Generates a random graph*


---

## Description

Generates a random graph.

## Usage

```
randomWAMGraph(nnodes=5, nedges=nnodes, verbose=FALSE)
```

## Arguments

nnodes	A <a href="#">numeric</a> value, the desired number of nodes.
nedges	A <a href="#">numeric</a> value, the desired number of edges.
verbose	If <a href="#">TRUE</a> , extra information is output.

## Value

An object of class [graphAM](#).

## Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

## See Also

[graphAM](#).

**Examples**

```

library("KEGGgraph")
library("rrcov")

## Create a random graph
graph <- randomWAMGraph(nnodes=5, nedges=7, verbose=TRUE)
plot(graph)

## Retrieve its adjacency matrix
A <- graph@adjMat

## write it to KGML file
grPathname <- "randomWAMGraph.xml"
writeAdjacencyMatrix2KGML(A, pathname=grPathname, verbose=TRUE, overwrite=TRUE)

## read it from file
gr <- parseKGML2Graph(grPathname)

## Two examples of Laplacians from the same graph
lapMI <- laplacianFromA(A, ltype="meanInfluence")
print(lapMI)

lapN <- laplacianFromA(A, ltype="normalized")
print(lapN)

U <- lapN$U
p <- nrow(A)
sigma <- diag(p)/sqrt(p)

X <- twoSampleFromGraph(100, 120, shiftM2=1, sigma, U=U, k=3)

## T2
t <- T2.test(X$X1,X$X2)
str(t)

tu <- graph.T2.test(X$X1, X$X2, lfA=lapMI, k=3)
str(tu)

```

---

testOneConnectedComponent

*Applies a series of two-sample tests to a connected graph using various statistics*

---

**Description**

Applies a series of two-sample tests to a connected graph using various statistics.

**Usage**

```
testOneConnectedComponent(graph, data, classes, ..., prop=0.2, verbose=FALSE)
```

**Arguments**

graph	A <a href="#">graph</a> object.
data	A <a href="#">'numeric matrix'</a> (size: number 'p' of genes x number 'n' of samples) of gene expression.
classes	A <a href="#">character vector</a> (length: 'n') of class assignments.
...	Further arguments to be passed to <a href="#">laplacianFromA()</a> .
prop	A <a href="#">numeric</a> value, percentage of components retained for Fourier and PCA.
verbose	If <a href="#">TRUE</a> , extra information is output.

**Details**

This function performs the test, assuming that all genes in the graph are represented in the expression data set, in order not to have to modify the graph topology.

Interaction signs are used if available in the graph ('getSignedGraph' is not called here, in order not to have to modify the graph topology.).

The graph given as input has to have only one connex component. It can be retrieved from the output of [getConnectedComponentList\(\)](#).

**Value**

A structured [list](#) containing the p-values of the tests, the [graph](#) object of the connected component and the number of retained Fourier dimensions.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[testOneGraph\(\)](#) [getConnectedComponentList\(\)](#)

**Examples**

```
library("rrcov")

## Some parameters
n1 <- n2 <- 20
nnodes <- nedges <- 20
k <- 3
ncp <- 0.5
sigma <- diag(nnodes)/sqrt(nnodes)

## Build graph, decompose laplacian
G <- randomWAMGraph(nnodes=nnodes,nedges=nedges)
A <- G@adjMat
lfA <- laplacianFromA(A,ltype="unnormalized")
U <- lfA$U
l <- lfA$l

## Build two samples with smooth mean shift
X <- twoSampleFromGraph(n1,n2,shiftM2=ncp,sigma,U=U,k=k)
```

```
## Do hypothesis testing
t <- T2.test(X$X1,X$X2) # Raw T-square
print(t$p.value)
tu <- graph.T2.test(X$X1,X$X2,lfA=lfA,k=k) # Filtered T-squares
print(tu$p.value)
```

---

testOneGraph	<i>Applies a serie of two-sample tests to each connected component of a graph using various statistics</i>
--------------	--

---

### Description

Applies a serie of two-sample tests to each connected component of a graph using various statistics.

### Usage

```
testOneGraph(graph, data, classes, useInteractionSigns=TRUE, ..., verbose=FALSE)
```

### Arguments

graph	A <a href="#">graph</a> object.
data	A 'matrix' (size: number 'p' of genes x number 'n' of samples) of gene expression.
classes	A 'vector' (length: 'n') of class assignments.
useInteractionSigns	A <a href="#">logical</a> value indicating whether the sign of interaction should be taken into account.
...	Further arguments to be passed to <code>testOneConnectedComponent</code> .
verbose	If <a href="#">TRUE</a> , extra information is output.

### Value

A structured [list](#) containing the p-values of the tests, the [graph](#) object of the connected component and the number of retained Fourier dimensions.

### Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

### See Also

[testOneConnectedComponent\(\)](#)

**Examples**

```

library("Rgraphviz")
library("KEGGgraph")
## library("NCIgraph")

data("Loi2008_DEGraphVignette")
exprData <- exprLoi2008
classData <- classLoi2008
annData <- annLoi2008

rn <- rownames(exprData)

## Retrieve expression levels data for genes from one KEGG pathway
graph <- grListKEGG[[1]]
pname <- attr(graph, "label")
print(pname)

## DEGraph T2 test
resList <- testOneGraph(graph, exprData, classData, verbose=TRUE, prop=0.2)

## Largest connected component
res <- resList[[1]]
gr <- res$graph

## individual t statistics
shift <- apply(exprData, 1, FUN=function(x) {
  tt <- t.test(x[classData==0], x[classData==1])
  tt$statistic
})
names(shift) <- translateGeneID2KEGGID(names(shift))

## color palette
if (require(marray)) {
  pal <- maPalette(low="red", high="green", mid="black", k=100)
} else {
  pal <- heat.colors(100)
}

## plot results
dn <- getDisplayName(gr, shortLabel=TRUE)
mm <- match(translateKEGGID2GeneID(nodes(gr)), rownames(annData))
dn <- annData[mm, "NCBI.gene.symbol"]

pvg <- plotValuedGraph(gr, values=shift, nodeLabels=dn, qMax=0.95, colorPalette=pal, height=40, lwd=1, vert
title(pname)

txt1 <- sprintf("p(T2)=%s", signif(res$p.value[1], 2))
txt2 <- sprintf("p(T2F[%s])=%s", res$k, signif(res$p.value[2]))
txt <- paste(txt1, txt2, sep="\n")
stext(side=3, pos=1, txt)
if (require(fields)) {
  image.plot(legend.only=TRUE, xlim=range(pvg$breaks), col=pal, legend.shrink=0.3, legend.width=0.8, legen
}

```

---

twoSampleFromGraph	<i>Given a basis (typically the eigenvectors of a graph Laplacian), builds two multivariate normal samples with mean shift located in the first elements of the basis</i>
--------------------	---

---

### Description

Given a basis (typically the eigenvectors of a graph Laplacian), builds two multivariate normal samples with mean shift located in the first elements of the basis.

### Usage

```
twoSampleFromGraph(n1=20, n2=n1, shiftM2=0, sigma, U, k=ceiling(ncol(U)/3))
```

### Arguments

n1	An <b>integer</b> value specifying the number of points in the first sample.
n2	An <b>integer</b> value specifying the number of points in the second sample.
shiftM2	A <b>numeric</b> value giving the desired squared Mahalanobis norm of the mean shift between the two samples.
sigma	A matrix giving the covariance structure of each sample.
U	A matrix giving the desired basis.
k	An <b>integer</b> value giving the number of basis elements in which the mean shift must be located.

### Value

A **list** with named elements:

**X1** The first sample in the original basis (before transformation by U).

**X2** The second sample in the original basis (before transformation by U).

**X1** The first sample in the specified basis (after transformation by U).

**X2** The second sample in the specified basis (after transformation by U).

**mu1** The population mean of F1

**mu2** The population mean of F2

**diff** mu1 - mu2

### Author(s)

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**Examples**

```

library("KEGGgraph")
library("rrcov")

## Create a random graph
graph <- randomWAMGraph(nnodes=5, nedges=7, verbose=TRUE)
plot(graph)

## Retrieve its adjacency matrix
A <- graph@adjMat

## write it to KGML file
grPathname <- "randomWAMGraph.xml"
writeAdjacencyMatrix2KGML(A, pathname=grPathname, verbose=TRUE, overwrite=TRUE)

## read it from file
gr <- parseKGML2Graph(grPathname)

## Two examples of Laplacians from the same graph
lapMI <- laplacianFromA(A, ltype="meanInfluence")
print(lapMI)

lapN <- laplacianFromA(A, ltype="normalized")
print(lapN)

U <- lapN$U
p <- nrow(A)
sigma <- diag(p)/sqrt(p)

X <- twoSampleFromGraph(100, 120, shiftM2=1, sigma, U=U, k=3)

## T2
t <- T2.test(X$X1, X$X2)
str(t)

tu <- graph.T2.test(X$X1, X$X2, lFA=lapMI, k=3)
str(tu)

```

---

```
writeAdjacencyMatrix2KGML
```

*Writes an adjacency matrix into an XML file*

---

**Description**

Writes an adjacency matrix into an XML file.

**Usage**

```
writeAdjacencyMatrix2KGML(mat, pathname, nodePrefix="n", overwrite=FALSE, ..., verbose=FALSE)
```

**Arguments**

`mat` A [matrix](#), interpreted of the adjacency matrix of a graph.



pathname	The full path name of the XML file to be written.
nodePrefix	A <a href="#">character</a> value giving the prefix to which the node index in 'mat' will be appended.
overwrite	If <a href="#">TRUE</a> and file already exists, overwrite it.
...	Further arguments to be passed to plotKEGGgraph.
verbose	If <a href="#">TRUE</a> , extra information is output.

**Value**

None.

**Author(s)**

Laurent Jacob, Pierre Neuvial and Sandrine Dudoit

**See Also**

[parseKGML2Graph](#)

**Examples**

```
library("KEGGgraph")
library("rrcov")

## Create a random graph
graph <- randomWAMGraph(nnodes=5, nedges=7, verbose=TRUE)
plot(graph)

## Retrieve its adjacency matrix
A <- graph@adjMat

## write it to KGML file
grPathname <- "randomWAMGraph.xml"
writeAdjacencyMatrix2KGML(A, pathname=grPathname, verbose=TRUE, overwrite=TRUE)

## read it from file
gr <- parseKGML2Graph(grPathname)

## Two examples of Laplacians from the same graph
lapMI <- laplacianFromA(A, ltype="meanInfluence")
print(lapMI)

lapN <- laplacianFromA(A, ltype="normalized")
print(lapN)

U <- lapN$U
p <- nrow(A)
sigma <- diag(p)/sqrt(p)

X <- twoSampleFromGraph(100, 120, shiftM2=1, sigma, U=U, k=3)

## T2
t <- T2.test(X$X1,X$X2)
str(t)
```

```
tu <- graph.T2.test(X$X1, X$X2, lFA=lapMI, k=3)
str(tu)
```

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