

# Package ‘FEM’

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**Type** Package

**Title** Identification of FunctionalEpigenetic Modules

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**Description** FEM can identify interactome hotspots of differential promoter methylation and differential ex-pression, where an inverse association between promoter methylation and gene expression is assumed.

**License** GPL (>=2)

**Depends** R (>= 2.10), Matrix, igraph, marray, corrplot, impute, limma, org.Hs.eg.db, graph, BiocGenerics

**biocViews**

SystemsBiology,DNAMethylation,NetworkEnrichment,GeneRegulation,DifferentialMethylation,DifferentialExpression,N

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FEM-package	<i>FEM</i>
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## Description

Identifies interactome hotspots of differential promoter methylation and differential expression, where an inverse association between methylation and gene expression is assumed

## Details

Package: FEM  
 Type: Package  
 Version: 1.0  
 Date: 2014-01-22  
 License: GPL >2

## Author(s)

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## References

1 Jiao Y, Widschwendter M, Teschendorff AE. A systems-level integrative framework for genome-wide DNA methylation and gene expression data identifies differential gene expression modules under epigenetic control. *Bioinformatics* 2014, doi: 10.1093/bioinformatics/btu316 (2014-05-02) 2 Jones A, Teschendorff AE, Li Q, Hayward JD, Kannan A, et al. (2013) Role of dna methylation and epigenetic silencing of hand2 in endometrial cancer development. *PLoS Med* 10:e1001551. 3 Reichardt J, Bornholdt S (2006) Statistical mechanics of community detection. *Phys Rev E* 74:016110. doi:10.1103/PhysRevE.74.016110. URL <http://link.aps.org/doi/10.1103/PhysRevE.74.016110>. 4 West J, Beck S, Wang X, Teschendorff AE (2013) An integrative network algorithm identifies age-associated differential methylation interactome hotspots targeting stem-cell differentiation pathways. *Sci Rep* 3:1630.

DoEpiMod

*DoEpiMod***Description**

Identify differential methylation hotspots in the network. Edge weights in the interactome network reflect the combined differential methylation statistics (absolute values) of the genes making up the edge.

**Usage**

```
DoEpiMod(statM.m, adj.m, nseeds = 100, gamma = 0.5, nMC = 1000, sizeR.v = c(1, 100), minsizeOUT = 10, writeOUT = TRUE, nameSTUDY = "test", ew.v)
```

**Arguments**

Arguments:

a matrix of statistics and p-values of differential methylation (one row for each gene promoter) with rownames annotated with entrez gene IDs.

<code>adj.m</code>	adjacency matrix with number of rows and columns equal to length of <code>statM.v</code> and <code>statR.v</code> , ordered in same way and with same gene identifier. The resulting graph is assumed to be connected.
<code>nseeds</code>	number of seeds/modules to search for. This should be a number such that P-values of significance after multiple testing is less than some reasonable FDR threshold, i.e. 0.3.
<code>gamma</code>	tuning parameter of spin-glass algorithm. Default value generally leads to modules in the desired size range (10-100).
<code>nMC</code>	number of Monte Carlo runs for establishing statistical significance of modularity values under randomisation of the molecular profiles on the network.
<code>sizeR.v</code>	desired size range for modules
<code>minsizeOUT</code>	minimum size of modules to report as interesting
<code>writeOUT</code>	a logical to indicate whether to write out tables in text format
<code>nameSTUDY</code>	a name for the study.
<code>ew.v</code>	The adjacency edge weight vector

**Examples**

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
```

DoExpMod

*DoExpMod***Description**

Capture the RNA expression hotspot based on the differential expression statistics in the context of human interactome

**Usage**

```
DoExpMod(statR.m, adj.m, nseeds = 100, gamma = 0.5, nMC = 1000, sizeR.v = c(1, 100), minsizeOUT = 10, writeOUT = TRUE, nameSTUDY = " ", ew.v = 1)
```

**Arguments**

Arguments:

a matrix of statistics and p-values of differential mRNA expression (same dimension as statM.m and ordered in same way) with rownames annotated with entrez gene IDs.

<code>adj.m</code>	adjacency matrix with number of rows and columns equal to length of statM.v and statR.v, ordered in same way and with same gene identifier. The resulting graph is assumed to be connected.
<code>nseeds</code>	number of seeds/modules to search for. This should be a number such that P-values of significance after multiple testing is less than some reasonable FDR threshold, i.e. 0.3.
<code>gamma</code>	tuning parameter of spin-glass algorithm. Default value generally leads to modules in the desired size range (10-100).
<code>nMC</code>	number of Monte Carlo runs for establishing statistical significance of modularity values under randomisation of the molecular profiles on the network.
<code>sizeR.v</code>	desired size range for modules
<code>minsizeOUT</code>	minimum size of modules to report as interesting
<code>writeOUT</code>	a logical to indicate whether to write out tables in text format
<code>nameSTUDY</code>	a name for the study.
<code>ew.v</code>	The adjacency edge weight vector

DoFEMbi

*DoFEMbi***Description**

DoFEMbi identifies interactome hotspots of differential promoter methylation and differential expression, where an inverse association between methylation and gene expression is assumed.

**Usage**

```
DoFEMbi(statM.m, statR.m, adj.m, nseeds = 100, gamma = 0.5, nMC = 1000, sizeR.v = c(1,100), minsizeOUT =
```

**Arguments**

	Arguments
	a matrix of statistics and p-values of differential methylation (one row for each gene promoter) with rownames annotated with entrez gene IDs.
<code>statR.m</code>	a matrix of statistics and p-values of differential mRNA expression (same dimension as <code>statM.m</code> and ordered in same way) with rownames annotated with entrez gene IDs.
<code>adj.m</code>	adjacency matrix with number of rows and columns equal to length of <code>statM.v</code> and <code>statR.v</code> , ordered in same way and with same gene identifier. The resulting graph is assumed to be connected.
<code>nseeds</code>	number of seeds/modules to search for. This should be a number such that P-values of significance after multiple testing is less than some reasonable FDR threshold, i.e. 0.3.
<code>gamma</code>	tuning parameter of spin-glass algorithm. Default value generally leads to modules in the desired size range (10-100).
<code>nMC</code>	number of Monte Carlo runs for establishing statistical significance of modularity values under randomisation of the molecular profiles on the network.
<code>sizeR.v</code>	desired size range for modules
<code>minsizeOUT</code>	minimum size of modules to report as interesting
<code>writeOUT</code>	a logical to indicate whether to write out tables in text format
<code>nameSTUDY</code>	a name for the study.
<code>ew.v</code>	The adjacency edge weight vector

**Examples**

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.
data(toydata);
DoFEMbi(toydata$statM, toydata$statR, toydata$adjacency, nseeds=1, gamma=0.5, nMC=1000, sizeR.v=c(1,100), minsizeOUT=
```

---

DoIntEpi450k

*DoIntEpi450k*


---

### Description

Generate differential methylation statistics using 450K methylation matrix.

### Usage

```
DoIntEpi450k(dnaM.m, phenoM.v, adj.m)
```

### Arguments

Arguments:

normalised DNA methylation 450k data matrix, with rownames annotated to 450k probe IDs.

phenoM.v

phenotype vector corresponding to dnaM.m

adj.m

adjacency matrix of a network of relations (e.g. PPI network) with rownames/colnames annotated to NCBI Entrez gene IDs. Note: The PPI network can be derived from the Pathway Commons resource *Cerami2011* and follows the procedure described in *West2013*. The PIN used in previous papers is available at <http://sourceforge.net/projects/funepi>. The PPI network consists of 8434 genes annotated to NCBI Entrez identifiers, and is sparse containing 303600 documented interactions (edges). If the user wishes they can use a different PPI network or generate statR and statM using different method.

### Examples

```
##---- Should be DIRECTLY executable !! ----
##-- ==> Define data, use random,
##--or do help(data=index) for the standard data sets.

## The function is currently defined as
```

---

DoIntExp

*DoIntExp*


---

### Description

generate the statR, adjacency, annotation matrix for the DoExpMod.

### Usage

```
DoIntExp(exp.m, phenoR.v, adj.m)
```

**Arguments**

Arguments:

normalized gene expression data matrix with rownames annotated to NCBI Entrez gene IDs. If the mapped Entrez gene IDs are not unique, we use the average value of the same Entrez gene ID as the expression value.

phenoR.v

phenotype vector corresponding to dnaM.m

adj.m

adjacency matrix of a network of relations (e.g. PPI network) with rownames/colnames annotated to NCBI Entrez gene IDs. Note: The PPI network can be derived from the Pathway Commons resource *Cerami2011* and follows the procedure described in *West2013*. The PIN used in previous papers is available at <http://sourceforge.net/projects/funepi>. The PPI network consists of 8434 genes annotated to NCBI Entrez identifiers, and is sparse containing 303600 documented interactions (edges). If the user wishes they can use a different PPI network or generate statR and statM using different method.

DoIntFEM450k

*DoIntFEM450k***Description**

generate the statM, statR, adjacency for the DoFEMbi.

**Usage**

DoIntFEM450k(dnaM.m, exp.m, phenoM.v, phenoR.v, adj.m)

**Arguments**

Arguments:

normalised DNA methylation 450k data matrix, with rownames annotated to 450k probe IDs.

dnaMmm

normalized gene expression data matrix with rownames annotated to NCBI Entrez gene IDs. If the mapped Entrez gene IDs are not unique, we use the average value of the same Entrez gene ID as the expression value.

phenoM.v

phenotype vector corresponding to dnaM.m

phenoR.v

phenotype vector corresponding to dnaM.m

adj.m

adjacency matrix of a network of relations (e.g. PPI network) with rownames/colnames annotated to NCBI Entrez gene IDs. Note: The PPI network can be derived from the Pathway Commons resource *Cerami2011* and follows the procedure described in *West2013*. The PIN used in previous papers is available at <http://sourceforge.net/projects/funepi>. The PPI network consists of 8434 genes annotated to NCBI Entrez identifiers, and is sparse containing 303600 documented interactions (edges). If the user wishes they can use a different PPI network or generate statR and statM using different method.

---

DoLimma                    *generate t value and p value using lmFit in Limma, this fuction is used by DoIntFEM450k*

---

**Description**

generate t value and p value using lmFit in Limma

**Usage**

DoLimma(data.m, pheno.v)

**Arguments**

data.m

pheno.v

**Examples**

```
##---- Should be DIRECTLY executable !! ----  
##-- ==> Define data, use random,  
##--or do help(data=index) for the standard data sets.  
  
## The function is currently defined as
```

---

Entrez.GeneSybo.list    *EntrezID and the GeneSymbol mapping list data*

---

**Description**

EntrezID and the GeneSymbol mapping list data from package org.Hs.eg.db

**Usage**

data(Entrez.GeneSybo.list)



**Format**

The format is: List of 46265 \$ 1 : chr "A1BG" \$ 10 : chr "NAT2" \$ 100 : chr "ADA" \$ 1000 : chr "CDH2" \$ 10000 : chr "AKT3" \$ 100008586: chr "GAGE12F" \$ 100008587: chr "RNA5-8S5" \$ 100008588: chr "RNA18S5" \$ 100008589: chr "RNA28S5" \$ 100009601: chr "TRNAY1" \$ 100009602: chr "TRNAY2" \$ 100009603: chr "TRNAA2" \$ 100009604: chr "TRNAA3" \$ 100009605: chr "TRNAF1" \$ 100009606: chr "TRNAF2" \$ 100009607: chr "TRNAH5" \$ 100009613: chr "ANO1-AS2" \$ 100009667: chr "POU5F1P5" \$ 100009668: chr "POU5F1P6" \$ 100009669: chr "POU5F1P7" \$ 100009670: chr "POU5F1P8" \$ 100009675: chr "MRT4" \$ 100009676: chr "ZBTB11-AS1" \$ 10001 : chr "MED6" \$ 10002 : chr "NR2E3" \$ 10003 : chr "NAALAD2" \$ 100033391: chr "VN2R2P" \$ 100033392: chr "VN2R3P" \$ 100033393: chr "VN2R4P" \$ 100033394: chr "VN2R5P" \$ 100033395: chr "VN2R6P" \$ 100033396: chr "VN2R7P" \$ 100033398: chr "VN2R10P" \$ 100033399: chr "VN2R11P" \$ 100033400: chr "VN2R12P" \$ 100033401: chr "VN2R13P" \$ 100033402: chr "VN2R14P" \$ 100033403: chr "VN2R15P" \$ 100033404: chr "VN2R16P" \$ 100033406: chr "VN2R18P" \$ 100033407: chr "VN2R19P" \$ 100033408: chr "VN2R20P" \$ 100033409: chr "OTX2P1" \$ 100033410: chr "SATB1P1" \$ 100033411: chr "DUXB" \$ 100033413: chr "SNORD116-1" \$ 100033414: chr "SNORD116-2" \$ 100033415: chr "SNORD116-3" \$ 100033416: chr "SNORD116-4" \$ 100033417: chr "SNORD116-5" \$ 100033418: chr "SNORD116-6" \$ 100033419: chr "SNORD116-7" \$ 100033420: chr "SNORD116-8" \$ 100033421: chr "SNORD116-9" \$ 100033422: chr "SNORD116-10" \$ 100033423: chr "SNORD116-11" \$ 100033424: chr "SNORD116-12" \$ 100033425: chr "SNORD116-13" \$ 100033426: chr "SNORD116-14" \$ 100033427: chr "SNORD116-15" \$ 100033428: chr "SNORD116-16" \$ 100033429: chr "SNORD116-17" \$ 100033430: chr "SNORD116-18" \$ 100033431: chr "SNORD116-20" \$ 100033432: chr "SNORD116-21" \$ 100033433: chr "SNORD116-22" \$ 100033434: chr "SNORD116-23" \$ 100033435: chr "SNORD116-24" \$ 100033436: chr "SNORD116-25" \$ 100033437: chr "SNORD115-2" \$ 100033438: chr "SNORD116-26" \$ 100033439: chr "SNORD116-27" \$ 100033440: chr "SNORD115-3" \$ 100033441: chr "SNORD115-4" \$ 100033442: chr "SNORD115-5" \$ 100033443: chr "SNORD115-6" \$ 100033444: chr "SNORD115-7" \$ 100033445: chr "SNORD115-8" \$ 100033446: chr "SNORD115-9" \$ 100033447: chr "SNORD115-10" \$ 100033448: chr "SNORD115-11" \$ 100033449: chr "SNORD115-12" \$ 100033450: chr "SNORD115-13" \$ 100033451: chr "SNORD115-14" \$ 100033453: chr "SNORD115-15" \$ 100033454: chr "SNORD115-16" \$ 100033455: chr "SNORD115-17" \$ 100033456: chr "SNORD115-18" \$ 100033458: chr "SNORD115-19" \$ 100033460: chr "SNORD115-20" \$ 100033603: chr "SNORD115-21" \$ 100033799: chr "SNORD115-22" \$ 100033800: chr "SNORD115-23" \$ 100033801: chr "SNORD115-25" \$ 100033802: chr "SNORD115-26" \$ 100033803: chr "SNORD115-29" \$ 100033804: chr "SNORD115-30" \$ 100033805: chr "SNORD115-31" \$ 100033806: chr "SNORD115-32" [list output truncated]

**Examples**

```
data(Entrez.GeneSybo.list)
## maybe str(Entrez.GeneSybo.list) ; plot(Entrez.GeneSybo.list) ...
```

**Description**

One FEM result on real cancer methylation and gene expression data

**Usage**

```
data(fembi.o)
```

**Format**

The format is:

**Examples**

```
data(fembi.o)
## maybe str(fembi.o) ; plot(fembi.o) ...
```

---

FemModShow

*FemModShow*

---

**Description**

generate particular module net which is from FEM result object such as fembi.o which can be loaded by "data(fembi.o)". and also it will return an igraph object.

**Usage**

```
FemModShow(mod, name = "mod", edgeweight, adjacency, mode="integration")
```

**Arguments**

mod	particular module of the FEM result object
name	the name of the module
edgeweight	FEM result object's edgeweight
adjacency	the whole net adjacency matrix
mode	There are three mode, "integration", "Epi", "Exp". "integration" means the module is from DoFEMbi, "Epi" means the module is from DoEpiMod, "Exp" means the module is from DoExpMod.

**Examples**

```
data(fembi.o)
data(realdata)
FemModShow(fembi.o$topmod$HAND2, name="HAND2", fembi.o$ew, realdata$adjacency)
```

---

map450kEID.v	<i>map450kEID</i>
--------------	-------------------

---

**Description**

Enrez ID and gene symbol

**Usage**

```
data(map450kEID.v)
```

**Examples**

```
data(map450kEID.v)
## maybe str(map450kEID.v) ; plot(map450kEID.v) ...
```

---

probeInfoALL.lv	<i>Probes all information.</i>
-----------------	--------------------------------

---

**Description**

A list include the 450k methylation probes's Design, ID, and GeneGroup, etc.

**Usage**

```
data(probeInfoALL.lv)
```

**Examples**

```
data(probeInfoALL.lv)
## maybe str(probeInfoALL.lv) ; plot(probeInfoALL.lv) ...
```

---

realdata	<i>realdata from TCGA endometrial cancer</i>
----------	--

---

**Description**

realdata from TCGA endometrial cancer. Including statistics files of Methylation, RNA Expression, and also the adjacency matrix file and annotation file.

**Usage**

```
data(realdata)
```

**Examples**

```
data(realdata)
## maybe str(realdata) ; plot(realdata) ...
```

---

tennodes	<i>tennodes</i>
----------	-----------------

---

### Description

Randomly selected 10 nodes in toydata.

### Usage

```
data(tennodes)
```

### Examples

```
data(tennodes)
## maybe str(tennodes) ; plot(tennodes) ...
```

---

toydata	<i>toydata</i>
---------	----------------

---

### Description

Artificial created statistics of Methylation, RNA Expression, and also the adjacency matrix and annotation matrix. These data are used to test and prove that FEM's ability to find hotspot or module based on inverse association between methylation and gene expression.

### Usage

```
data(toydata)
```

### Format

The format is: List of 4 \$ statM : num [1:84, 1:2] -0.06511 0.00116 0.19583 3.93402 -0.0254 ... ..- attr(\*, "dimnames")=List of 2 .. ..\$ : chr [1:84] "1" "2" "3" "4" ... .. ..\$ : NULL \$ statR : num [1:84, 1:2] -0.0959 -0.033 0.1779 -2.5759 -0.1286 ... ..- attr(\*, "dimnames")=List of 2 .. ..\$ : chr [1:84] "1" "2" "3" "4" ... .. ..\$ : NULL \$ adjacency :Formal class 'dgCMatrix' [package "Matrix"] with 6 slots .. ..@ i : int [1:300] 26 30 79 5 40 3 10 18 27 29 ... .. ..@ p : int [1:85] 0 2 3 5 17 20 21 23 25 27 ... .. ..@ Dim : int [1:2] 84 84 .. ..@ Dimnames:List of 2 .. .. ..\$ : chr [1:84] "1" "2" "3" "4" ... .. .. ..\$ : NULL .. ..@ x : num [1:300] 1 1 1 1 1 1 1 1 1 1 ... .. ..@ factors : list() \$ annotation: chr [1:84, 1:2] "1" "2" "3" "4" ... ..- attr(\*, "dimnames")=List of 2 .. .. ..\$ : NULL .. .. ..\$ : chr [1:2] "EntrezID" "GeneSymbol"

### Examples

```
data(toydata)
## maybe str(toydata) ; plot(toydata) ...
```

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