

Package ‘omicade4’

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Type Package

Title Multiple co-inertia analysis of omics datasets

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Imports made4, Biobase

Depends R (>= 3.0.0), ade4

Suggests BiocStyle

Description This package performs multiple co-inertia analysis of omics datasets.

Reference Meng C, Kuster B, Culhane AC and Gholami AM. A multivariate approach to the integration of multi-omics datasets. BMC Bioinformatics (2014) (Manuscript accepted) Culhane AC, Thioulouse J, Perriere G, Higgins DG. (2005) MADE4: an R package for multivariate analysis of gene expression data. Bioinformatics. 21(11):2789-90. S. Dray and A.B. Dufour. (2007) The ade4 package: implementing the duality diagram for ecologists. Journal of Statistical Software 22(4):1-20.

License GPL-2

LazyLoad yes

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omicade4-package	<i>multiple co-inertia analysis of omics datasets</i>
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Description

The main function in the package performing multiple co-inertia analysis on omics datasets

Details

Package:	omicade4
Type:	Package
Version:	1.7.2
Date:	2015-04-06
License:	GPL-2
LazyLoad:	yes

Multiple co-inertia analysis (MCIA) is a multivariate analysis method that could be used to analyze multiple tables measuring the same set of individuals, this package provides a one-stop function for MCIA and functions for subsequent analysis especially for multiple omics datasets.

Author(s)

Chen Meng, Aedin Culhane, Amin M. Gholami

Maintainer: Chen Meng <mengchen18@gmail.com>

References

Meng C, Kuster B, Culhane AC and Gholami AM. A multivariate approach to the integration of multi-omics datasets. (Manuscript under preparation)

Culhane AC, Thioulouse J, Perriere G, Higgins DG. (2005) MADE4: an R package for multivariate analysis of gene expression data. *Bioinformatics*. 21(11):2789-90.

S. Dray and A.B. Dufour. (2007) The ade4 package: implementing the duality diagram for ecologists. *Journal of Statistical Software* 22(4):1-20.

See Also

ade4 and package made4

Examples

```
data(NCI60_4arrays)
mci <- mci(NCI60_4arrays)
```

mci *multiple co-inertia analysis*

Description

The main function in `omicade4`. Performing multiple co-inertia analysis on a list of `data.frames` or `matrix`

Usage

```
mci(df.list, cia.nf = 2, cia.scan = FALSE, nsc = T, svd = TRUE)
## S3 method for class 'mci'
plot(x, axes = 1:2,
     sample.lab = TRUE, sample.legend = TRUE, sample.color = 1,
     phenovect = NULL, df.color = 1,
     df.pch = NA, gene.nlab = 0, ...)
```

Arguments

<code>df.list</code>	A list of <code>data.frames</code> , <code>matrix</code> or <code>ExpressionSet</code> is going to be analyzed, the column number must be the same and mapped across all <code>data.frame/matrix</code>
<code>cia.nf</code>	An integer indicating the number of kept axes
<code>cia.scan</code>	A logical indicating whether the co-inertia analysis eigenvalue (scree) plot should be shown so that the number of axes, (<code>cia.nf</code>) can be selected interactively. Default value is <code>FALSE</code> .
<code>nsc</code>	A logical indicating whether multiple co-inertia analysis should be performed using multiple non-symmetric correspondence analyses <code>dudi.nsc</code> . The default <code>=TRUE</code> is highly recommended. If <code>FALSE</code> , COA <code>dudi.coa</code> will be performed on the first <code>data.frame</code> , and row weighted COA <code>dudi.rwcoa</code> will be performed on the rest ones using the row weights from the first one.
<code>svd</code>	A logical indicates which function should be used to perform singular value decomposition.
<code>sample.lab</code>	A logical indicating if the samples should be labelled, the default is <code>TRUE</code> .
<code>sample.color</code>	Defining colours of samples for plotting sample space, the length of this argument should be either one (uniform color) or the same with the column number of <code>data.frame</code> in <code>df.list</code> .
<code>sample.legend</code>	A logical indicating if the legend for sample space should be drawn.
<code>df.color</code>	Defining the colours for plotting variables (genes) from different <code>data.frame</code> . The length of this argument should be either one (all datasets use the same colour) or the same number of datasets (each dataset has a specified colour, the repetitive use of colour code is allowed.)
<code>df.pch</code>	Defining the pch for plotting variable (gene) space. The default is <code>NA</code> , the function will distinguish datasets by default. Otherwise, the length of this argument should be either one (all datasets use the same pch) or the same number of datasets (each dataset has a specified pch).

phenovec	A factor for plotting sample space, phenovec could be used to distinguish individuals in the data.frames.
x	An object of class mcia
axes	A vector of integer in length 2 to indicate the axes are going to be plotted. The default are first two axes.
gene.nlab	An integer indicating how many top weighted genes on each axis should be labelled
...	Other arguments

Details

The column number of data.frame in the df.list must be the same, and the same column from different data.frame should be matchable. For example, Microarray profiling for the same set of cell lines, patients and etc.

mcia calls `dudi.nsc`, `ktab` and `mcoa` in `ade4` packages.

Plotting and visualizing mcia results

Two functions could be used to visualize the result of mcia: The first is `plot.mcia`, which results in four plots. Top left represents the sample space. Individuals from the same column of different data.frames are linked by edges. Different platforms are distinguished by the shape of points. Top right shows the variable space, datasets are marked by different colours. Bottom left represents the eigenvalue scree plot. The pseudo-eigenvalue space of all data.frames are visualized in the bottom right panel. The second function is `plotVar.mcia`, which could be used to plot the variable space for different datasets as well as finding and visualizing the variables (genes) across datasets.

Other methods

`selectVar.mcia`: selecting variables (genes) according to the their coordinates.

Value

call	the function called
mcoa	The results returned by <code>mcoa</code>
coa	The results returned by separate analysis (applying <code>dudi.nsc</code> or <code>dudi.coa</code> on each data.frame separately)

Author(s)

Chen Meng

See Also

See Also as `mcoa`, `plotVar`, `plotVar`

Examples

```
data(NCI60_4arrays)
mcoin <- mcia(NCI60_4arrays)
plot(mcoin, sample.lab=FALSE, df.col=4:7)

colcode <- sapply(strsplit(colnames(NCI60_4arrays$agilent), split="\\.\\.\\."),
  function(x) x[1])
plot(mcoin, sample.lab=FALSE, sample.color=as.factor(colcode))
```

NCI60_4arrays	<i>Microarray gene expression profiles of the NCI 60 cell lines from 4 different platforms</i>
---------------	--

Description

The 60 human tumour cell lines are derived from patients with leukaemia, melanoma, lung, colon, central nervous system, ovarian, renal, breast and prostate cancers. The cell line panel is widely used in anti-cancer drug screen. In this dataset, a subset of microarray gene expression of the NCI 60 cell lines from four different platforms are combined in a list, which could be used as input to `mci` directly.

Usage

```
data(NCI60_4arrays)
```

Format

The format is: List of 4 `data.frame`s

- `\$agilent`: `data.frame` containing 300 rows and 60 columns. 300 gene expression log ratio measurements of the NCI60 cell lines, by Agilent platform.
- `\$hgu133`: `data.frame` containing 298 rows and 60 columns. 298 gene expression log ratio measurements of the NCI60 cell lines, by H-GU133 platform.
- `\$hgu133p2`: `data.frame` containing 268 rows and 60 columns. 268 gene expression log ratio measurements of the NCI60 cell lines, by H-GU133 plus 2.0 platform.
- `\$hgu95`: `data.frame` containing 288 rows and 60 columns. 288 gene expression log ratio measurements of the NCI60 cell lines, by H-GU95 platform.

Source

Cell Miner <http://discover.nci.nih.gov/cellminer/>

References

Reinhold WC, Sunshine M, Liu H, Varma S, Kohn KW, Morris J, Doroshow J, Pommier Y CellMiner: A Web-Based Suite of Genomic and Pharmacologic Tools to Explore Transcript and Drug Patterns in the NCI-60 Cell Line Set. *Cancer Research*. 2012 Jul, 15;72(14):3499-511

Examples

```
data(NCI60_4arrays)
summary(NCI60_4arrays)
mcoin <- mci(NCI60_4arrays)
```

plotVar	<i>Plot variable (gene) spaces of result from MCIA or CIA</i>
---------	---

Description

The user level function for plotting variable space of `mcia` or `cia`, which could be used to visualize selected variables (genes) across datasets. It calls `plotVar.cia` or `plotVar.mcia`.

Usage

```
plotVar(x, var = NA, axes = 1:2,
        var.col = "red", var.lab = FALSE, bg.var.col = "gray",
        nlab = 0, sepID.data=NULL, sepID.sep="_", ...)
```

Arguments

<code>x</code>	An object of class <code>cia</code> or <code>mcia</code>
<code>var</code>	A character vector defining the variables (genes) are going to be labelled and coloured. The default <code>NA</code> means no variables (genes) selected.
<code>axes</code>	An integer vector in length 2 indicating which axes are going to be plotted. Default are the first two axes.
<code>var.col</code>	The colour of selected variables (genes), the length of this argument should be either 1 (uniform colour) or the length of <code>var</code> (each <code>var</code> has a specified colour).
<code>var.lab</code>	A logical indicating if the variables (genes) selected should be labelled, the default is <code>FALSE</code>
<code>bg.var.col</code>	Colour code for unselected variables (genes) in all datasets.
<code>nlab</code>	An integer indicating how many top weighted genes on each axis should be labelled.
<code>sepID.data</code>	This argument enables a more generalized mapping of identifiers in different datasets. For example, if there is a PTM (post-transcriptional modification) dataset in one of the <code>data.frames</code> , the corresponding protein could be detected with setting this argument. For more details, see "details" section.
<code>sepID.sep</code>	Used to help determine the separator of variables (genes) in the <code>sepID.data</code> . For more details, see "details" section.
<code>...</code>	Other arguments

Details

For the `sepID.data`, a typical example is the post-transcriptional modification (PTM) data. The name of variables (genes) have a general form like "proteinName_modificationSite". The `sepID.data` specifies the IDs from dataset that should be separated, `sepID.sep` specifies the separator of protein name and modification site. This is used to determine the same proteins/genes across different datasets.

Value

If `var` is not `NA`, a data frame is returned, with rows for variables (genes) of interest and columns of logical values indicating which dataset contains which variables (genes).

Author(s)

Chen Meng

See AlsoSee Also as [plotVar.cia](#), [plotVar.mcia](#)**Examples**

```

data(NCI60_4arrays)
mcoin <- mcia(NCI60_4arrays)
plotVar(mcoin, var=c("S100B", "S100A1"), var.lab=TRUE)

# an example for the usage of sepID.data and sepID.sep
nci60_mod <- NCI60_4arrays
rownames(nci60_mod$hgu95) <- paste(rownames(nci60_mod$hgu95), "s1", sep="_")
mcoin_mod <- mcia(nci60_mod)
id <- split(rownames(mcoin_mod$mcoa$Tco), mcoin_mod$mcoa$TC$T)
sapply(id, function(x) head(x))

plotVar(mcoin_mod, var=c("S100B", "S100A1"), var.lab=TRUE, sepID.data=1:4, sepID.sep = c("\\.", "\\.", "\\.", "\\.", "\\.", "\\.", "\\.", "\\."))
plotVar(mcoin_mod, var=c("S100B", "S100A1"), var.lab=TRUE, sepID.data=4, sepID.sep="_")
plotVar(mcoin_mod, var=c("S100B", "S100A1"), var.lab=TRUE, sepID.data=1:3, sepID.sep="\\.")

```

`plotVar.cia`*Plot variable space of result from [cia](#)*

DescriptionPlot variable space of [mcia](#) and visualize selected variables across datasets.**Usage**

```

## S3 method for class 'cia'
plotVar(x, var = NA, axes = 1:2,
        var.col = "red", var.lab = FALSE, bg.var.col = "gray",
        nlab = 0, sepID.data = NULL, sepID.sep = "_", ...)

```

Arguments

<code>x</code>	An object of class <code>cia</code>
<code>var</code>	see plotVar
<code>axes</code>	see plotVar
<code>var.col</code>	see plotVar
<code>var.lab</code>	see plotVar
<code>bg.var.col</code>	see plotVar
<code>nlab</code>	see plotVar

sepID.data	see plotVar
sepID.sep	see plotVar
...	Other arguments

Value

If var is not NA, a data frame is return, with rows for variables of interest and columns of logical value indicating which data.frames contains which variables.

Author(s)

Chen Meng

See Also

See Also as [plotVar.mcia](#)

plotVar.mcia	<i>Plot variable space of result from mcia</i>
--------------	--

Description

Plot variable space of [mcia](#) and visualize selected variables across datasets, the function is called by plotVar.

Usage

```
## S3 method for class 'mcia'
plotVar(x, var = NA, axes = 1:2,
        var.col = "red", var.lab = FALSE, bg.var.col = "gray",
        nlab = 0, sepID.data=NULL, sepID.sep= "\\.",
        df = NA, layout = NA, ...)
```

Arguments

x	An object of class <code>mcia</code> , the result returned by mcia .
var	see plotVar
axes	see plotVar
var.col	see plotVar
var.lab	see plotVar
bg.var.col	see plotVar
nlab	see plotVar
sepID.data	see plotVar
sepID.sep	see plotVar
df	Integers indicating which dataset should be plotted, the default NA means all datasets are plotted.
layout	The layout of multiple plots.
...	Other arguments

Value

If var is not NA, a data frame is return, with rows for variables of interest and columns of logical values indicating which data.frames contains which variables.

Author(s)

Chen Meng

See Also

See Also as [plotVar.cia](#), [plotVar](#)

Examples

```
data(NCI60_4arrays)
mcoin <- mcia(NCI60_4arrays)
plot.mcia(mcoin, sample.lab=FALSE, df.col=4:7)
plotVar(mcoin, var=NA, bg.var.col=1:4, var.lab=TRUE)
plotVar(mcoin, var=c("SPOPL", "CAPN2", "SNX8"),
        df=1:4, var.lab=TRUE, var.col=c("red", "green", "blue"))
```

```
data(NCI60_4arrays)
mcoin <- mcia(NCI60_4arrays)
plotVar(mcoin, var=c("S100B", "S100A1"), var.lab=TRUE)
```

```
# an example for the usage of sepID.data and sepID.sep
nci60_mod <- NCI60_4arrays
rownames(nci60_mod$hgu95) <- paste(rownames(nci60_mod$hgu95), "s1", sep="_")
mcoin_mod <- mcia(nci60_mod)
id <- split(rownames(mcoin_mod$mcoa$TCO), mcoin_mod$mcoa$TCO)
sapply(id, function(x) head(x))
```

```
plotVar(mcoin_mod, var=c("S100B", "S100A1"), var.lab=TRUE, sepID.data=1:4, sepID.sep = c("\\.", "\\.", "\\."))
plotVar(mcoin_mod, var=c("S100B", "S100A1"), var.lab=TRUE, sepID.data=4, sepID.sep="_")
plotVar(mcoin_mod, var=c("S100B", "S100A1"), var.lab=TRUE, sepID.data=1:3, sepID.sep="\\.")
```

selectVar

Selecting variables (genes) from result of MCIA or CIA according to co-ordinates

Description

The user level function calls `selectVar.mcia` or `selectVar.cia`. Function `cia` or `mcia` projects variables (genes) from different datasets to a 2 dimensional space. This function supplies a method selecting variables (genes) according to the coordinates of variables

Usage

```
selectVar(x, axis1 = 1, axis2 = 2, ...)
```

Arguments

x	An object of class <code>cia</code> or <code>mcia</code> , the result returned by <code>cia</code> or <code>mcia</code> respectively.
axis1	Integer, the column number for the x-axis. The default is 1.
axis2	Integer, the column number for the y-axis. The default is 2.
...	Other arguments

Value

Returns a data.frame describing which variables (genes) are presented on which data.frames within the limited region(s).

Author(s)

Chen Meng

See Also

See Also as [selectVar.mcia](#), [selectVar.cia](#)

Examples

```
data(NCI60_4arrays)
mcoin <- mcia(NCI60_4arrays)
selectVar(mcoin, a1.lim=c(2, Inf), a2.lim=c(-Inf, Inf))

# an example for the usage of sepID.data and sepID.sep
nci60_mod <- NCI60_4arrays
rownames(nci60_mod$hgu95) <- paste(rownames(nci60_mod$hgu95), "s1", sep="_")
mcoin_mod <- mcia(nci60_mod)
# without specifying
selectVar(mcoin_mod, a1.lim=c(2, Inf), a2.lim=c(-Inf, Inf))
# specifying the sepID.data and sepID.sep
selectVar(mcoin_mod, a1.lim=c(2, Inf), a2.lim=c(-Inf, Inf), sepID.data=4, sepID.sep="_")
```

selectVar.cia

Selecting variables from result of CIA

Description

To select variables in CIA variable space, the function is called by `selectVar`.

Usage

```
## S3 method for class 'cia'
selectVar(x, axis1 = 1, axis2 = 2,
  df1.a1.lim = c(-Inf, Inf), df1.a2.lim = c(-Inf, Inf),
  df2.a1.lim = df1.a1.lim, df2.a2.lim = df1.a2.lim,
  sepID.data = NULL, sepID.sep = "_", ...)
```

Arguments

x	The result returned by cia
axis1	Integer, the column number for the x-axis. The default is 1.
axis2	Integer, the column number for the y-axis. The default is 2.
df1.a1.lim	A vector containing 2 numbers indicating the range of X axis of selected on the 1st data.frame. The first value limiting the lower boundary, the second value limiting the upper boundary.
df1.a2.lim	The range of Y axis of selected on the 1st datasets.
df2.a1.lim	The range of X axis of selected on the 2nd dataset.
df2.a2.lim	The range of Y axis of selected on the 2nd dataset.
sepID.data	See plotVar.mcia
sepID.sep	See plotVar.mcia
...	Other arguments

Details

`cia` projecting variables from different datasets to a two dimensional space. This function supplies a method selecting variables according to the co-ordinates of variables

Value

Returns a data.frame describing which variables are presented on which data.frame within the limited region(s).

Author(s)

Chen Meng

See Also

See Also as [selectVar.mcia](#)

selectVar.mcia

Selecting variables from result of MCIA

Description

The selection of variables based on co-ordinates of MCIA variable space. The function is called by `selectVar`

Usage

```
## S3 method for class 'mcia'
selectVar(x, axis1 = 1, axis2 = 2,
  a1.lim = c(-Inf, Inf), a2.lim = c(-Inf, Inf),
  sepID.data = NULL, sepID.sep = "_", ...)
```

Arguments

x	An object of class <code>mci.a</code> , the result returned by <code>mci.a</code> .
axis1	Integer, the column number for the x-axis. The default is 1.
axis2	Integer, the column number for the y-axis. The default is 2.
a1.lim	The limited range of x-axis of selected. It could be either a vector (containing 2 numbers, the first value limiting the lower boundary, the second value limiting the upper boundary) or a list of vectors, each of which contains two number. If it is a list, the length of the list should be the same with number of <code>data.frames</code> in <code>mci.a</code> .
a2.lim	The limited range of y-axis.
sepID.data	See <code>plotVar.mci.a</code>
sepID.sep	See <code>plotVar.mci.a</code>
...	Other arguments

Details

`mci.a` projecting variables (genes) from different datasets to a lower dimensional space. This function supplies a method selecting variables according to the co-ordinates of variables.

Value

Returns a `data.frame` describing which variables are presented on which `data.frames` within the limited region(s).

Author(s)

Chen Meng

See Also

See Also as `selectVar.cia`, `selectVar`

Examples

```
data(NCI60_4arrays)
mcoin <- mci.a(NCI60_4arrays)
selectVar(mcoin, a1.lim=c(1, Inf))
```

topVar

Selecting top weighted variables (genes) from result of MCIA or CIA

Description

The user level function calls `topVar.mci.a` or `topVar.cia`. This function provides a method selecting top weighted variables (genes) on an axis (either positive side or negative side or both).

Usage

```
topVar(x, axis = 1, end = "both", topN = 5)
```

Arguments

x	an object of class <code>mcia</code> or <code>cia</code>
axis	an interger to sepecificy which axis to check
end	which end of the axis to check, could be positive, negative or both. Any unambiguous substring can be given.
topN	An integer. The number of top weighted variable to return.

Value

Returns a data.frame contains selected variables.

Author(s)

Chen Meng

Examples

```
data(NCI60_4arrays)
mcoin <- mcia(NCI60_4arrays)
topVar(mcoin, axis = 1, end = "both", topN = 3)
```

topVar.cia

Selecting top weighted variables (genes) from result of CIA

Description

This function provides a method selecting top weighted variables (genes) on an axis (either positive side or negative side or both) from an object of class `cia` (see `made4` package).

Usage

```
## S3 method for class 'cia'
topVar(x, axis = 1, end = "both", topN = 5)
```

Arguments

x	See plotVar.mcia
axis	See plotVar.mcia
end	See plotVar.mcia
topN	See plotVar.mcia

Value

See [plotVar.mcia](#)

Author(s)

Chen Meng

`topVar.mcia`*Selecting top weighted variables (genes) from result of MCIA*

Description

This function provides a method selecting top weighted variables (genes) on an axis (either positive side or negative side or both) from an object of class `mcia`.

Usage

```
## S3 method for class 'mcia'  
topVar(x, axis = 1, end = "both", topN = 5)
```

Arguments

<code>x</code>	See plotVar.mcia
<code>axis</code>	See plotVar.mcia
<code>end</code>	See plotVar.mcia
<code>topN</code>	See plotVar.mcia

Value

See [plotVar.mcia](#)

Author(s)

Chen Meng

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