

Package

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Type Package

Title TinderMIX: An R package to cluster gene expression by contour plots

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Author Angela Serra

Maintainer Angela Serra <angela.serra@tuni.fi>

Description The TinderMIX package allows to analyse toxicogenomics gene expression dataset with multiple dose levels and time-points. It allows to identify the expression patterns with respect to both variables and to cluster genes accordingly. It also identify enriched pathways/go terms that are associated to each cluster.

Depends R (>= 3.4),

stats,
utils,
AnnotationDbi,
gProfileR,
gtools,
reshape,
plotly,
clv,
gplots,
org.Hs.eg.db,
org.Mm.eg.db,
org.Rn.eg.db,
xlsx

License GPL (>= 3)

Encoding UTF-8

LazyData true

RoxygenNote 6.1.1

Suggests knitr,
rmarkdown,
testthat

VignetteBuilder knitr

R topics documented:

| | |
|------------------------------|---|
| build_items_list | 2 |
| clustering_summary | 3 |

| | |
|-------------------------------------|----|
| compute_anova_dose_time | 3 |
| compute_enrichment | 4 |
| convert_genes | 5 |
| create_contour | 5 |
| create_prototypes | 6 |
| enrich | 7 |
| findCenter | 8 |
| hls_genes_clustering | 8 |
| plot3d | 9 |
| plot_clusters_prototypes | 10 |
| write_xlsx_for_funmappone | 10 |

| | |
|--------------|-----------|
| Index | 12 |
|--------------|-----------|

| | |
|------------------|---|
| build_items_list | <i>This function computes the venn diagram of the genes associated to time, dose or their interaction</i> |
|------------------|---|

Description

This function computes the venn diagram of the genes associated to time, dose or their interaction

Usage

```
build_items_list(PvalMat, p.val.th = 0.01)
```

Arguments

| | |
|----------|---|
| PvalMat | matrix with pvalue associated to the dose, timepoint and the dose*timepoint effect that is the output of the compute_anova_dose_time function |
| p.val.th | is the threshold at which p.values are considered significant. Default = 0.01 |

Value

a list containing the genes in each position of the venn diagram

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data,dose_index = 2,time_point_index = 3)
ItemsList = build_items_list(PvalMat)
```

| | |
|--------------------|--|
| clustering_summary | <i>This function evaluate the summary index for a clustering results by taking into account the within and between variability</i> |
|--------------------|--|

Description

This function evaluate the summary index for a clustering results by taking into account the within and between variability

Usage

```
clustering_summary(DB, cluster)
```

Arguments

| | |
|---------|---|
| DB | your matrix dataset |
| cluster | is a numeric vector of clustering results |

Value

a vector of evaluation indexes

| | |
|-------------------------|---|
| compute_anova_dose_time | <i>This function computes a two way anova between dose and time for the expression value of every genes</i> |
|-------------------------|---|

Description

This function computes a two way anova between dose and time for the expression value of every genes

Usage

```
compute_anova_dose_time(exp_data, pheno_data, dose_index, time_point_index)
```

Arguments

| | |
|------------------|--|
| exp_data | is the expression matrix with genes on the rows and samples on the columns |
| pheno_data | is a dataframe with phenodata informations. Samples are on the rows. The columns should include the dose and time point information. |
| dose_index | numeric value specifying the column of the phenodata table containing the doses |
| time_point_index | numeric value specifying the column of the phenodata table containing the time points |

Value

a matrix with pvalue associated to the dose, timepoint and the dose*timepoint effect

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data, dose_index = 2, time_point_index = 3)
```

| | |
|--------------------|--|
| compute_enrichment | <i>This function perform enrichment of the genes in each cluster</i> |
|--------------------|--|

Description

This function perform enrichment of the genes in each cluster

Usage

```
compute_enrichment(optimal_clustering, corrType = "fdr",
  type_enrich = "KEGG", org_enrich = "rnorvegicus", pth = 0.05,
  sig = FALSE, mis = 0, only_annotated = FALSE)
```

Arguments

| | |
|--------------------|---|
| optimal_clustering | vector of final clustering |
| corrType | string specifying the algorithm used for determining the significance threshold, one of gSCS, fdr, bonferroni. Default: fdr |
| type_enrich | string specifying the enrichment type. Default = KEGG |
| org_enrich | string specifying the organism. Default = rnorvegicus |
| pth | numeric value specifying the pvalue threshold. Default = 0.05 |
| sig | whether all or only statistically significant results should be returned |
| mis | minimum size of functional category, smaller categories are excluded |
| only_annotated | statistical domain size, one of "annotated", "known" |

Value

a list with the enriched pathways for each cluster of genes

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data, dose_index = 2, time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose), unlist(ItemsList$Time), unlist(ItemsList$`Dose:Time:Dose`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes, dose_index = 2, time_point_index = 3, grid = 10)
hls_res = hls_genes_clustering(contour_res$GenesMap, nClust = c(5, 10, 15, 20, 25), method = "pearson", hls.method = "hls")
clpr = create_prototypes(clust_res = hls_res, summaryMat = hls_res$summaryMat, contour_res = contour_res)
enrRes = compute_enrichment(clpr$optcl, corrType = "fdr", type_enrich = "KEGG", org_enrich = "rnorvegicus", pth = 0.05)
```

| | |
|---------------|--|
| convert_genes | <i>This function convert genes identifiers</i> |
|---------------|--|

Description

This function convert genes identifiers

Usage

```
convert_genes(organism = "hsapiens", GList, annType = "SYMBOL")
```

Arguments

| | |
|----------|---|
| organism | a string specifying the organism under analysis |
| GList | a list of genes identifier |
| annType | string specifying the wanted gene identifier |

Value

a list with the converted genes identifiers

| | |
|----------------|---|
| create_contour | <i>This function fits a 3D regression model for every gene in the dataset and creates an N x N contour plot</i> |
|----------------|---|

Description

This function fits a 3D regression model for every gene in the dataset and creates an N x N contour plot

Usage

```
create_contour(exp_data, pheno_data, responsive_genes, dose_index,
               time_point_index, gridSize = 50)
```

Arguments

| | |
|------------------|--|
| exp_data | is the expression matrix with genes on the rows and samples on the columns |
| pheno_data | is a dataframe with phenodata informations. Samples are on the rows. The columns should include the dose and time point information. |
| responsive_genes | responsive_genes character vector with the genes statistically significant for the two-way anova |
| dose_index | numeric value specifying the column of the phenodata table containing the doses |
| time_point_index | numeric value specifying the column of the phenodata table containing the time points |
| gridSize | numeric value specifying size of the z-grid |

Value

a list with list with estimated contour objects, 3D fitted objects, fitting statistics and feature values for time and dose

| | |
|----------|--|
| GenesMap | a matrix with the z-maps computed for each gene |
| RPGenes | a list with the 3D fitted objects |
| Statis | a matrix with the fitting statistics: PValue,Adj.R.Square,RMSE |
| DFList | a list with the data used for the fitting |

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data,dose_index = 2,time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose), unlist(ItemsList$Time), unlist(ItemsList$`Dose:Time:Dose:Time`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes,dose_index = 2,time_point_index = 3 ,grid = 100)
```

| | |
|-------------------|---|
| create_prototypes | <i>this function create the cluster prototypes as the mean values of the z maps of all the genes in the cluster</i> |
|-------------------|---|

Description

this function create the cluster prototypes as the mean values of the z maps of all the genes in the cluster

Usage

```
create_prototypes(clust_res, summaryMat, contour_res)
```

Arguments

| | |
|-------------|---|
| clust_res | the clustering results object given in input by the function hls_genes_clustering |
| summaryMat | the matrix with the summary statistics computed for the different k values |
| contour_res | a list with the contours object returned in output by the create_contour function |

Value

a list with the contour objects for each clustering prototype and the vector of the optimal clustering

| | |
|---------|--|
| meanXYZ | a list the contour object for each prototype |
| optcl | a vector with the optimal clustering |

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data, dose_index = 2, time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose), unlist(ItemsList$Time), unlist(ItemsList$`Dose:Time:Dose`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes, dose_index = 2, time_point_index = 3, grid = 100)
hls_res = hls_genes_clustering(contour_res$GenesMap, nClust = c(5, 10, 15, 20, 25), method = "pearson", hls_method = "hls")
clpr = create_prototypes(clust_res = hls_res, summaryMat = hls_res$summaryMat, contour_res = contour_res)
```

| | |
|--------|--|
| enrich | <i>This function perform enrichment of the genes in each cluster</i> |
|--------|--|

Description

This function perform enrichment of the genes in each cluster

Usage

```
enrich(x, type, org, pval, adjust_method, sig = FALSE, mis = 0,
       only_annotated = TRUE)
```

Arguments

| | |
|----------------|---|
| x | a dataframe with the gene names on the first column |
| type | string specifying the enrichment type. Default = KEGG |
| org | string specifying the organism. Default = rnorvegicus |
| pval | numeric value specifying the pvalue threshold. Default = 0.05 |
| adjust_method | string specifying the algorithm used for determining the significance threshold, one of gSCS, fdr, bonferroni. Default: fdr |
| sig | whether all or only statistically significant results should be returned |
| mis | minimum size of functional category, smaller categories are excluded |
| only_annotated | statistical domain size, one of "annotated", "known" |

Value

a list with the enriched pathways for each cluster of genes

| | |
|------------|---|
| findCenter | <i>This function select cluster prototypes. It select the prototype as the more correlated with the other elements in the cluster</i> |
|------------|---|

Description

This function select cluster prototypes. It select the prototype as the more correlated with the other elements in the cluster

Usage

```
findCenter(DB, clust_vector)
```

Arguments

| | |
|--------------|--|
| DB | your matrix dataset |
| clust_vector | a numeric vector of clustering results |

Value

a matrix of prototypes

| | |
|----------------------|--|
| hls_genes_clustering | <i>It clusters the contour plots by also estimating the ideal number of clusters</i> |
|----------------------|--|

Description

It clusters the contour plots by also estimating the ideal number of clusters

Usage

```
hls_genes_clustering(GenesMap, nClust = c(5, 10, 25, 50, 75, 100, 125,
  150, 175, 200, 250, 300), method = "pearson", hls.method = "ward")
```

Arguments

| | |
|------------|---|
| GenesMap | a matrix with the z-maps computed with the function create_contour |
| nClust | vector of putative numbers used to determine number of clusters. Default = c(5,10,25,50,75,100,125,150,175,200,250,300) |
| method | string specifying the correlation method. Default = "pearson" |
| hls.method | string specifying method for the hierarchical clustering. Default = "ward" |

Value

a list with the clustering results and statistics for the optimal number of clusters

| | |
|-------------|---|
| hls_res | a list containing the clustering results, the clustering vector and the centers for each k value given in input |
| summaryMat | a matrix with summary statistic for each k value given in input |
| clusterList | a list with the clustering vectors |

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data,dose_index = 2,time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose),unlist(ItemsList$Time),unlist(ItemsList$`Dose:Time:Dose`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes,dose_index = 2,time_point_index =3 ,grid = 100)
hls_res = hls_genes_clustering(contour_res$GenesMap, nClust = c(5,10,15,20,25), method="pearson", hls.method="hierarchical")
```

| | |
|--------|---|
| plot3d | <i>This function plots the fitted 3d surface for the expression value of a gene</i> |
|--------|---|

Description

This function plots the fitted 3d surface for the expression value of a gene

Usage

```
plot3d(toPlot = list(x, y, z), DF)
```

Arguments

| | |
|--------|--|
| toPlot | is a list containing the predicted value for the x, y and z axis |
| DF | is the data frame containing the information for the samples used in the fitting process |

Value

a plotly object

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data,dose_index = 2,time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose),unlist(ItemsList$Time),unlist(ItemsList$`Dose:Time:Dose`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes,dose_index = 2,time_point_index =3 ,grid = 100)
plot3d(toPlot = contour_res$RPGenes[["Pdk4"]],DF = contour_res$DFList[["Pdk4"]])
```

plot_clusters_prototypes

this function plots the clusters prototype

Description

this function plots the clusters prototype

Usage

```
plot_clusters_prototypes(meanXYZ, nR = 2)
```

Arguments

| | |
|---------|---|
| meanXYZ | a list the contour object for each prototype computed with the function create_prototypes |
| nR | the number of rows to use in the plot |

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data, dose_index = 2, time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose), unlist(ItemsList$Time),
                           unlist(ItemsList$`Dose:Time:DoseTime`),
                           unlist(ItemsList$`Dose:Time`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes, \cr
                           dose_index = 2, time_point_index = 3, gridSize = 50)
hls_res = hls_genes_clustering(contour_res$GenesMap, nClust = c(5,10,15,20,25), \cr
                           method="pearson", hls.method = "ward")

clpr = create_prototypes(clust_res = hls_res, summaryMat = hls_res$summaryMat, contour_res)
plot_clusters_prototypes(clpr$meanXYZ, nR = 2)
```

write_xlsx_for_funmappone

This function create an excel file with the same format of the input need by the FunMappOne tool

Description

This function create an excel file with the same format of the input need by the FunMappOne tool

Usage

```
write_xlsx_for_funmappone(optimal_clustering,
  filePath = "../contour_clustering/gene_clustering.xlsx")
```

Arguments

`optimal_clustering` is a numeric vector with the clustering result for every gene

`filePath` is a string specifying the path of the xlsx file

Examples

```
data("WY14643")
exp_data = WY14643$exp_data
pheno_data = WY14643$pheno_data
PvalMat = compute_anova_dose_time(exp_data, pheno_data, dose_index = 2, time_point_index = 3)
ItemsList = build_items_list(PvalMat)
responsive_genes = unique(c(unlist(ItemsList$Dose), unlist(ItemsList$Time), unlist(ItemsList$`Dose:Time:Dose`)))
contour_res = create_contour(exp_data, pheno_data, responsive_genes, dose_index = 2, time_point_index = 3, grid = 100)
hls_res = hls_genes_clustering(contour_res$GenesMap, nClust = c(5, 10, 15, 20, 25), method = "pearson", hls.method = "hls")
enrRes = compute_enrichment(clpr$optcl, corrType = "fdr", type_enrich = "KEGG", org_enrich = "rnorvegicus", pth = 0.05)
write_xlsx_for_funmappone(clpr$optcl, filePath = "../contour_clustering/gene_clustering.xlsx")
```

Index

- *Topic **clustering**;
 - findCenter, [8](#)
- *Topic **clustering**
 - clustering_summary, [3](#)
- *Topic **correlation**
 - findCenter, [8](#)
- *Topic **evaluation**
 - clustering_summary, [3](#)
- *Topic **multi-view**
 - findCenter, [8](#)
- *Topic **prototype**;
 - findCenter, [8](#)
- build_items_list, [2](#)
- clustering_summary, [3](#)
- compute_anova_dose_time, [3](#)
- compute_enrichment, [4](#)
- convert_genes, [5](#)
- create_contour, [5](#)
- create_prototypes, [6](#)
- enrich, [7](#)
- findCenter, [8](#)
- hls_genes_clustering, [8](#)
- plot3d, [9](#)
- plot_clusters_prototypes, [10](#)
- write_xlsx_for_funmappone, [10](#)