Package ‘GenomicSuperSignature’

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Title Interpretation of RNA-seq experiments through robust, efficient comparison to public databases

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Description This package provides a novel method for interpreting new transcriptomic datasets through near-instantaneous comparison to public archives without high-performance computing requirements. Through the pre-computed index, users can identify public resources associated with their dataset such as gene sets, MeSH term, and publication. Functions to identify interpretable annotations and intuitive visualization options are implemented in this package.

Depends R (>= 4.1.0), SummarizedExperiment

Imports ComplexHeatmap, ggplot2, methods, S4Vectors, Biobase, ggpubr, dplyr, plotly, BiocFileCache, grid, flextable, irlba

Suggests knitr, rmarkdown, devtools, roxygen2, pkgdown, usethis, BiocStyle, testthat, forcats, stats, wordcloud, circlize, EnrichmentBrowser, clusterProfiler, msigdb, cluster, RColorBrewer, reshape2, tibble, BiocManager, bcellViper, readr, utils

License Artistic-2.0

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 'PCAGenomicSignatures-methods.R' 'annotatePC.R' 'annotateRAV.R'
 'availableRAVmodel.R' 'buildAvgLoading.R' 'calculateScore.R'
R topics documented:

'data.R' 'drawWordcloud.R' 'extractPC.R' 'findSignature.R'
'findStudiesInCluster.R' 'getMetadata.R' 'getModel.R'
'heatmapTable.R' 'plotAnnotatedPCA.R' 'plotValidate.R'
'rmNaInf.R' 'sampleScoreHeatmap.R' 'subsetEnrichedPathways.R'
'utils.R' 'validate.R' 'validatedSignatures.R'

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.calculateSilhouetteWidth

Calculate Silhouette Information of RAVs

Description

The silhouette value is a measure of how similar an object is to its own cluster (cohesion) compared to other clusters (separation). The silhouette width ranges from -1 to +1, where a high value indicates that the object is well matched to its own cluster and poorly matched to neighboring clusters.

Usage

.calculatedSilhouetteWidth(dat, kmeansRes)

Arguments

dat A matrix with all the top PCs from training data to be clustered.
kmeansRes Output from stats::kmeans.

Value

Silhouette-class object, which is an n x 3 matrix with attributes.

See Also

kmeans
### .loadingCor

**Validating new dataset**

**Description**

Validating new dataset

**Usage**

```r
.loadingCor(dataset, avgLoading, method = "pearson", scale = FALSE)
```

**Arguments**

- `dataset` A gene expression profile to be validated. Different classes of objects can be used including ExpressionSet, SummarizedExperiment, RangedSummarizedExperiment, or matrix. Rownames (genes) should be in human gene symbol format (HGNC). If dataset is a matrix, genes should be in rows and samples in columns. RNA-seq counts should be log(count + 1) prior to the `validate()` call.
- `avgLoading` A matrix with genes by RAVs.
- `method` A character string indicating which correlation coefficient is to be computed. One of "pearson" (default), "kendall", or "spearman": can be abbreviated.
- `scale` Default is FALSE. If it is set to TRUE, rows will be converted to z-score prior to PCA.

**Value**

A matrix of Pearson correlation coefficient (default, defined through `method` argument) between RAVs (row) and the top 8 PCs from the datasets (column)

### .RAVName

**Formatting RAV name**

**Description**

Keep the name with 'k + cluster number + number of PCs + number of unique studies' info during the model construction to make it easy to keep track of them, but at the PCAGenomicSignatures-class object building step, covert them into 'RAV + cluster number'.

**Usage**

```r
.RAVName(x, ...)
```

**Arguments**

- `x` PCAGenomicSignatures object
- `...` Additional arguments for supporting functions.
Value

a character vector

---

**annotatePC**  
*Annotate top PCs from the dataset*

**Description**

This function finds the RAV with the highest validation score (including RAVs with negative silhouette width) for specified PC of the dataset and returns the top enriched pathways.

**Usage**

```r
annotatePC(
  PCnum,
  val_all,
  RAVmodel,
  n = 5,
  scoreCutoff = 0.5,
  nesCutoff = NULL,
  simplify = TRUE,
  abs = FALSE,
  trimed_pathway_len = 45
)
```

**Arguments**

- **PCnum**: A numeric vector. PC number of your dataset to retrieve annotation results for. The vector can contain any integer number among 1:8.
- **val_all**: The output from `validate`
- **RAVmodel**: The RAV model used to generate the input for the argument, `val_all`.
- **n**: An integer. Default is 5. The number of the top enriched pathways to print out. If there are fewer than n pathways passed the cutoff, it will print out NA.
- **scoreCutoff**: A numeric value for the minimum correlation between loadings of the dataset principal component and the RAV. Default is 0.5.
- **nesCutoff**: A numeric value for the minimum Normalized Enrichment Score (NES) for the enrichment analysis. Default is NULL. The suggested value is 3.
- **simplify**: A logical. Under default (TRUE), the output will be a data frame with the number of column same as the length of PCnum argument, and the number of row same as the n argument. If it is set to FALSE, the output will be a list with the length of PCnum argument, where each element is a data frame containing detailed GSEA output of enriched pathways.
- **abs**: Default is FALSE. If it’s set to TRUE, the enriched pathways will be listed based on absolute value of the Normalized Enrichment Score (NES).
- **trimed_pathway_len**: Positive integer values, which is the display width of pathway names. Default is 45.
annotateRAV

Value

A data frame of a list based on the simplify argument. Check the output detail above.

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
val_all <- validate(dset, miniRAVmodel)
annotatePC(2, val_all, miniRAVmodel)

annotateRAV

Search the top enriched pathways for RAV

Description

Search the top enriched pathways for RAV

Usage

annotateRAV(RAVmodel, ind, n = 5, abs = FALSE)

Arguments

RAVmodel  PCAGenomicSignatures object.
ind        An integer for RAV you want to check the enriched pathways.
n          A number of top enriched pathways to output. Default is 5.
abs        Default is FALSE. If it’s set to TRUE, the enriched pathways will be listed based on abs(NES).

Value

A data frame with n rows and 4 columns; Description, NES, pvalue, and qvalues

Examples

data(miniRAVmodel)
annotateRAV(miniRAVmodel, ind = 695)
availableRAVmodel  

List the available RAVmodels

Description

List the available RAVmodels

Usage

availableRAVmodel(simplify = TRUE)

Arguments

simplify Default is TRUE. If it is set to FALSE, the additional metadata of different versions of RAVmodel

Value

Under the default, this function will return a data frame with four columns - prior, version, update, pkg_version.

• prior: Different gene sets used for RAVmodel annotation. Currently, two are available - C2 for MSigDB C2 (curated gene sets), and PLIERpriors for bloodCellMarkersIRISDMAP, svmMarkers, and canonicalPathways

• version: RAVmodel’s version, which can be an input for version argument of getModel function

• update: Date the RAVmodel is updated

• pkg_version: Compatible version of GenomicSuperSignature

Examples

availableRAVmodel()

buildAvgLoading  

Calculate average loadings of each cluster

Description

Calculate average loadings of each cluster

Usage

buildAvgLoading(dat, k, n = 20, cluster = NULL, study = TRUE)
calculateScore

Arguments

dat  A data frame. Each row represents principle components from different training datasets. Columns are genes used for PCA analysis.
k  The number of clusters used for hierarchical clustering
n  The number of top principle components from each datasets used for model building. Default is 20.
cluster  Provide pre-defined cluster membership of your data.
study  Under default (TRUE), studies involved in each cluster will be added in the output.

Value

A named list of 6 elements is returned. It contains:

cluster  A numeric vector on cluster membership of PCs
size  A integer vector on the size of clusters
avgLoading  A matrix of average loadings. Columns for clusters and rows for genes
k  The number of clusters
n  The number of top PCs used for clustering
studies  A list of character vector containing studies in each cluster

Examples

data(miniAllZ)
data(res_hcut)
res <- buildAvgLoading(miniAllZ, k = 40, cluster = res_hcut$cluster)

---

calculateScore

Description

Calculate the validation score for a new dataset

Usage

calculateScore(dataset, RAVmodel, rescale.after = TRUE)
Arguments

dataset  A gene expression profile to be validated. Different classes of objects can be used including ExpressionSet, SummarizedExperiment, RangedSummarizedExperiment, or matrix. Rownames (genes) should be in symbol format. If it is a matrix, genes should be in rows and samples in columns.

RAVmodel  PCAGenomicSignatures object. A matrix of average loadings, an output from buildAvgLoading, can be directly provided.

rescale.after  Under the default (TRUE), the continuous scores are rescaled post assignment, so average loadings have the same standard deviation in different studies. If it is FALSE, the rescaling of column (= dividing by sqrt(sum(x^2) is done before score assignment.

Value

A list containing the score matrices for input datasets. Scores are assigned to each sample (row) for each cluster (column).

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
score <- calculateScore(dset, miniRAVmodel)

data(miniTCGA)
score <- calculateScore(miniTCGA, miniRAVmodel)

---

drawWordcloud  Draw wordcloud using the collection of RAVs’ MeSH terms

Description

Plot a word cloud using the remaining MeSH terms in the selected RAV after user-defined filtering.

Usage

drawWordcloud(  
    RAVmodel,  
    ind,  
    rm.noise = NULL,  
    scale = c(3, 0.5),  
    weighted = TRUE,  
    drop = NULL,  
    filterMessage = TRUE  
)
Arguments

RAVmodel  PCAGenomicSignatures object
ind An index of the RAV you want to draw wordcloud.
rm.noise An integer. Under the default (rm.noise=NULL), if cluster size (= s) is smaller than 8, rm.noise = floor(s*0.5). For clusters with >= 8 PCs, rm.noise = 4. If rm.noise = 0, all the MeSH terms in RAV will be used to draw wordcloud.
scale A scale argument for \texttt{wordcloud} function
weighted A logical. If \texttt{TRUE} (default), MeSH terms from each study are weighted based on the variance explained by the principle component of the study contributing to a given RAV.
drop A character vector containing MeSH terms to be excluded from word cloud. Under the default (NULL), manually selected non-informative MeSH terms are excluded, which can be viewed through \texttt{data(droplist)}.
filterMessage A logical. Under the default \texttt{TRUE}, any output RAV belong to the filtering list will give a message. Silence this message with \texttt{filterMessage=FALSE}. You can check the filter list using \texttt{data("filterList")}.

Value

A word cloud with the MeSH terms associated with the given cluster.

Examples

```r
data(miniRAVmodel)
drawWordcloud(miniRAVmodel, 1139)
```

Description

MeSH terms to be excluded in drawWordcloud function

Usage

droplist

Format

A character vector containing MeSH terms to be excluded.

Author(s)

Sehyun Oh <shbrief@gmail.com>
extractPC

**PCA on gene expression profile**

**Description**
Performs a principal components analysis on the given data matrix and returns the results as an object of class `prcomp`.

**Usage**
```r
extractPC(x)
```

**Arguments**
- `x`: a numeric or complex matrix (or data frame) which provides the gene expression data for the principal components analysis. Genes in the rows and samples in the columns.

**Value**
A `prcomp` object.

**See Also**
`prcomp`

**Examples**
```r
m = matrix(rnorm(100), ncol=5)
extractPC(m)
```

---

**filterList**

**RAVs that will output with quality-control messages**

**Description**
RAVs that will output with quality-control messages

**Usage**
```r
filterList
```

**Format**
A named list with four elements - "Cluster_Size_filter", "GSEA_C2_filter", "GSEA_PLIERpriors_filter", and "Redundancy_filter".
Author(s)

Sehyun Oh <shbrief@gmail.com>

findKeywordInRAV

Find the rank of your keyword in the RAV’s GSEA annotation

Description

Once you provide RAVmodel, keyword you’re searching for, and the RAV number to this function, it will give you the abs(NES)-based rank of your keyword in the enriched pathways of the target RAV. If can be useful to find out how uniquely your keyword-containing pathways are represented.

Usage

findKeywordInRAV(RAVmodel, keyword, ind, n = NULL, includeTotal = TRUE)

Arguments

RAVmodel PCAGenomicSignatures-object.
keyword A character vector. If you are searching for multiple keywords at the same time, use paste with collapse="|
ind An integer. The RAV number you want to check.
n An integer. The number of top enriched pathways (based on abs(NES)) to search. Under default (NULL), all the enriched pathways are used.
includeTotal Under the default condition (TRUE), the total number of enriched pathways will be also printed out as a part of the output.

Value

A character containing the rank of keyword-containing pathways (separated by |), followed by the total number of enriched pathways in parenthesis.

Examples

data(miniRAVmodel)
findKeywordInRAV(miniRAVmodel, "Bcell", ind = 695)
findSignature  

Find the RAVs with the keyword-containing enriched pathways

Description

This function finds RAVs containing the keyword you provide. If you provide "the number of keyword-containing pathways per RAV" in argument k, it will give you the RAV number.

Usage

findSignature(RAVmodel, keyword, n = 5, k = NULL)

Arguments

- **RAVmodel**: PCAGenomicSignatures-object
- **keyword**: A character vector. If you are searching for multiple keywords at the same time, use `paste` with `collapse="|"` argument.
- **n**: The number of top ranked (based on abs(NES)) pathways you want to search your keyword
- **k**: The number of keyword-containing pathways you want to get the RAV number. Under default (NULL), the output will be a data frame with two columns: '# of keyword-containing pathways' and 'Freq'. If you assign the value for this argument, the output will be an integer vector containing the RAV index.

Value

A data frame or integer vector depending on the parameter k.

Examples

data(miniRAVmodel)
findSignature(miniRAVmodel, "Bcell")
findSignature(miniRAVmodel, "Bcell", k = 5)

findStudiesInCluster  

Find the studies contributing each RAV

Description

Find the studies contributing each RAV

Usage

findStudiesInCluster(RAVmodel, ind = NULL, studyTitle = FALSE)
Arguments

RAVmodel  PCAGenomicSignatures object.

ind  A numeric vector containing the RAV indexes. Under the default (NULL), studies associated with all the RAV indexes will be returned as a list.

studyTitle  Default is FALSE. This parameter is effective only when the index value is specified. If it’s TRUE, the output will be a data frame with the study

Value

A list of character vectors. Under the default condition (ind = NULL), all the RAVs will be checked for their contributing studies and the length of the list will be same as the number of RAVs (= metadata(x)$k). If you provide the ind argument, studies associated with only the specified RAVs will be returned.

Note

Mainly used for model building, within buildAvgLoading.

Examples

data(miniRAVmodel)
findStudiesInCluster(miniRAVmodel, 1076)

GenomicSignatures-class

Virtual class inherited from SummarizedExperiment

Description

GenomicSignatures is a virtual class inherited from SummarizedExperiment and hosts GenomicSignatures models built from different dimensional reduction methods. Currently, PCA-based model, called PCAGenomicSignatures, is available.

Arguments

x  A GenomicSignatures-class object

value  See details.

Details

GenomicSignatures
Methods and accesors for GenomicSignatures object

Description

The default contents of GenomicSignatures object, with a set of getter and setter generic functions, which extract either the assay, colData, or metadata slots of a GenomicSignatures-class object. When you create this object, colData$studies should be populated before adding any information in trainingData slot.

Usage

```r
## S4 method for signature 'GenomicSignatures'
RAVindex(x)

## S4 method for signature 'GenomicSignatures'
geneSets(x)

## S4 method for signature 'GenomicSignatures'
updateNote(x)

## S4 method for signature 'GenomicSignatures'
version(x)

## S4 replacement method for signature 'GenomicSignatures'
geneSets(x) <- value

## S4 replacement method for signature 'GenomicSignatures'
updateNote(x) <- value
```

Arguments

- `x` A GenomicSignatures object
- `value` See details.

Details

- `assay(x)`: RAVindex (= avgLoadings) containing genes x RAVs
- `metadata(x)`: Metadata associated with RAVindex building process
- `colData(x)`: Information on RAVs

Value

A GenomicSignatures object for the constructor
getModel

Setters

Setter method values (i.e., function(x) <- value):

- metadata<- : Assign metadata
- coldata<- : Assign extra information associated with RAVs
- geneSets<- : A character vector containing the name of gene sets used to annotate average loadings
- updateNote<- : A character vector. Describes the main feature of a model construction

Getters

- RAVindex : Equivalent to assays(x)$RAVindex
- geneSets : Access the metadata(x)$geneSets slot
- updateNote : Access the metadata(x)$updateNote slot
- version : Access the metadata(x)$version slot

Examples

data(miniRAVmodel)
miniRAVmodel

getModel

Download a PCAGenomicSignatures model

Description

Download a PCAGenomicSignatures model

Usage

getModel(prior = c("C2", "PLIERpriors"), version = "latest", load = TRUE)

Arguments

prior
The name of gene sets used to annotate PCAGenomicSignatures. Currently there are two available options.

- C2 : MSigDB C2 (curated gene sets)
- PLIERpriors : bloodCellMarkersIRISDMAP, svmMarkers, and canonical-Pathways

version
Default is latest. Available versions are listed in version column of availableRAVmodel() output.

load
Default is TRUE. If it’s set to FALSE, the models are just downloaded to cache but not loaded into memory.
Value

File cache location or PCAGenomicSignatures object loaded from it.

Examples

\[ z = \text{getModel("C2")} \]

---

**getRAVInfo**

*Extract information on a specific RAV*

**Description**

Extract information on a specific RAV

**Usage**

\[ \text{getRAVInfo(RAVmodel, ind)} \]

**Arguments**

<table>
<thead>
<tr>
<th>Argument</th>
<th>Description</th>
</tr>
</thead>
<tbody>
<tr>
<td>RAVmodel</td>
<td>A PCAGenomicSignatures object</td>
</tr>
<tr>
<td>ind</td>
<td>An index of RAV</td>
</tr>
</tbody>
</table>

**Value**

A list with four elements: clusterSize, silhouetteWidth, enrichedPathways (the number of enriched pathways), and members. The 'members' is the summary table of PCs in RAV, containing three columns: studyName, PC, and Variance explained.

**Examples**

\[ \text{data(miniRAVmodel)} \]
\[ \text{getRAVInfo(miniRAVmodel, ind = 438)} \]
getStudyInfo  
*Extract information on a specific training dataset*

**Description**

Extract information on a specific training dataset

**Usage**

`getStudyInfo(RAVmodel, study)`

**Arguments**

- `RAVmodel`: A PCAGenomicSignatures object
- `study`: A character for SRA study accession.

**Value**

A list with three elements: studyTitle, studySize (the number of samples from this study used in the RAVmodel building), and RAVs. 'RAVs' is a data frame with three columns - PC (1 to 20), RAV (RAV that the given PC belongs to), and Variance explained (miniRAVmodel, which doesn’t have all the PCA summary information, so the example will return only the two PCs of the study instead of all twenty.

**Examples**

```r
data(miniRAVmodel)
getStudyInfo(miniRAVmodel, "SRP028155")
```

---

heatmapTable  
*Validation result in heatmap format*

**Description**

This function subsets validate outputs with different criteria and visualize it in a heatmap-like table.
Usage

heatmapTable(  
  val_all,  
  RAVmodel,  
  ind = NULL,  
  num.out = 5,  
  scoreCutoff = NULL,  
  swCutoff = NULL,  
  clsSizeCutoff = NULL,  
  breaks = c(0, 0.5, 1),  
  colors = c("white", "white smoke", "red"),  
  column_title = NULL,  
  row_title = NULL,  
  whichPC = NULL,  
  filterMessage = TRUE,  
  ...  
)

Arguments

val_all An output matrix from validate function with the parameter level = "max". Subset of this matrix is plotted as a heatmap using Heatmap

RAVmodel PCAGenomicSignatures-class object. RAVmodel used to prepare val_all input.

ind An integer vector. If this parameter is provided, the other parameters, num.out, scoreCutoff, swCutoff, clsSizeCutoff will be ignored and the heatmap table containing only the provided index will be printed.

num.out A number of highly validated RAVs to output. Default is 5. If any of the cutoff parameters are provided, num.out or the number of filtered RAVs, whichever smaller, will be chosen.

scoreCutoff A numeric value for the minimum correlation (not include). If val_all input is from multiple studies, the default is 0.7 and this is the only cutoff criteria considered: swCutoff and clsSizeCutoff will be ignored.

swCutoff A numeric value for the minimum average silhouette width.

clsSizeCutoff A integer value for the minimum cluster size.

breaks A numeric vector of length 3. Number represents the values assigned to three colors. Default is c(0, 0.5, 1).

colors A character vector of length 3. Each represents the color assigned to three breaks. Default is c("white", "white smoke", "red").

column_title A character string. Provide the column title.

row_title A character string. Provide the row title.

whichPC An integer value between 1 and 8. PC number of your data to check the validated signatures with. Under the default (NULL), it outputs top scored signatures with any PC of your data.
filterMessage  A logical. Under the default TRUE, any output RAV belong to the filtering list will give a message. Silence this message with filterMessage=FALSE. You can check the filter list using data("filterList").

... any additional argument for Heatmap

Value

A heatmap displaying the subset of the validation result that met the given cutoff criteria. If val_all input is from a single dataset, the output heatmap will contain both score and average silhouette width for each cluster.

If val_all input is from multiple studies, the output heatmap's rows will represent each study and the columns will be RAVs, which meet scoreCutoff for any of the input studies.

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)

## Single dataset
val_all <- validate(dset, miniRAVmodel)
heatmapTable(val_all, miniRAVmodel, swCutoff = 0)

## A list of datasets
val_all2 <- validate(miniTCGA, miniRAVmodel)
heatmapTable(val_all2, miniRAVmodel)
**Arguments**

- **RAVmodel**  
  A PCAGenomicSignatures object

- **ind**  
  An index of RAV

- **rm.noise**  
  An integer. Under the default (rm.noise=NULL), if cluster size (= s) is smaller than 8, rm.noise = floor(s*0.5). For clusters with >= 8 PCs, rm.noise = 4. If rm.noise = 0, all the MeSH terms in RAV will be used to draw wordcloud.

- **weighted**  
  A logical. If TRUE, MeSH terms from each study are weighted based on the variance explained by the principle component of the study contributing a given RAV. Default is TRUE.

- **filterMessage**  
  A logical. Under the default TRUE, any output RAV belong to the filtering list will give a message. Silence this message with filterMessage=FALSE. You can check the filter list using data("filterList").

**Value**

A table with two columns, word and freq. MeSH terms in the defined RAV (by ind argument) is ordered based on their frequency.

**Examples**

```r
data(miniRAVmodel)
meshTable(miniRAVmodel,1139)
```

**miniAllZ**  
*Subset of allZ matrix constructed from 8 CRC training datasets*

**Description**

Eight colorectal cancer microarray datasets were used to build RAVmodel and the intermediate file containing genes and top PCs from each dataset is named as allZ. Hierarchical clustering result of allZ is saved as res_hcut. For demonstration, we subset the allZ matrix with the first 100 genes, which is named as miniAllZ.

**Usage**

miniAllZ

**Format**

A matrix with 100 genes and 160 PCs from 8 training datasets.

**Author(s)**

Sehyun Oh <shbrief@gmail.com>
Source

https://github.com/shbrief/model_building/tree/main/RAVmodel_8CRC

miniRAVmodel

RAVmodel from 536 studies, annotated with MSigDB C2

Description

A object providing a miniature version of RAVmodel_C2 (PCAGenomicSignatures object constructed from 536 studies and annotated with MSigDB C2).

Usage

miniRAVmodel

Format

PCAGenomicSignatures

Author(s)

Sehyun Oh <shbrief@gmail.com>

miniTCGA

Subset of TCGA-COAD and TCGA-BRCA RNA sequencing datasets

Description

TCGA-COAD and TCGA-BRCA RNA sequencing data were acquired using GSEABenchmarkerR::loadEData and log-transformed. Conversion from EntrezID to gene symbol was done with EnrichmentBrowser::idMap. Only 8 samples from each dataset are kept.

Usage

miniTCGA

Format

A list containing two SummarizedExperiment objects.

Author(s)

Sehyun Oh <shbrief@gmail.com>
PCAGenomicSignatures

Construct PCAGenomicSignatures object

Description
The default contents of PCAGenomicSignatures object, with a set of accessors and setter generic functions, which extract either the assay, colData, metadata, or trainingData slots of a PCAGenomicSignatures-class object. When you create this object, colData$studies should be populated before adding any information in trainingData slot

Usage
PCAGenomicSignatures(..., trainingData)

Arguments
... Additional arguments for supporting functions.
trainingData A DataFrame class object for metadata associated with training data

Details
- RA Vindex(x) : RA Vindex (= avgLoadings) containing genes x RAVs
- metadata(x)$cluster : A vector of integers (from 1:k) indicating the cluster to which each point is allocated.
- metadata(x)$size : The number of PCs in each cluster.
- metadata(x)$k : The number of RAVs.
- metadata(x)$n : The number of top PCs from each dataset.
- metadata(x)$geneSets : Name of the prior gene sets used to annotate average loadings.
- colData(x)$studies : A list of character vectors containing studies contributing to each PC cluster.
- colData(x)$silhouetteWidth : A numeric array of average silhouette widths of each clusters
- colData(x)$gsea : A list of data frames. Each element is a subset of outputs from clusterProfiler::GSEA function.

Value
PCAGenomicSignatures object with multiple setters or accessors

Slots
trainingData A DataFrame class object for metadata associated with training data
Setters

Setter method values (i.e., function(x) <- value):

- `geneSets<-` : A character vector containing the name of gene sets used to annotate average loadings
- `studies<-` : A list of character vectors containing gene sets used to annotate average loadings
- `gsea<-` : A list of data frames. Each element is a subset of output from `gseaResult` objects.
- `metadata<-` : A list object of metadata
- `'<-'` : A vector to replace the indicated column in `colData`

Accessors

All the accessors inherited from `SummarizedExperiment` are available and the additional accessors for `PCAGenomicSignatures` specific data are listed below.

- `RAVindex` : Equivalent to the `assay(x)`
- `geneSets` : Access the `metadata(x)$geneSets` slot
- `studies` : Access the `colData(x)$studies` slot
- `gsea` : Access the `colData(x)$gsea`
- `'<-'` : Access a column in `colData`
- `trainingData` : Access the `trainingData` slot
- `mesh` : Access the `trainingData(x)$MeSH` slot
- `PCAsummary` : Access the `trainingData(x)$PCAsummary` slot

Examples

data(miniRAVmodel)
miniRAVmodel

Description

PCA-based `GenomicSignatures-class`.

Arguments

- `x` : A `GenomicSignatures-class` object
- `value` : See details.
Details

PCAGenomicSignatures

Slots

trainingData  A DataFrame class object for metadata associated with training data

Examples

data(miniRAVmodel)
miniRAVmodel

Description

The default contents of PCAGenomicSignatures object, with a set of accessor and setter generic functions, which extract either the assay, colData, metadata, or trainingData slots of a PCAGenomicSignatures-class object. When you create this object, colData$studies should be populated before adding any information in trainingData slot.

Usage

## S4 replacement method for signature 'PCAGenomicSignatures'

studies(x) <- value

## S4 replacement method for signature 'PCAGenomicSignatures'

silhouetteWidth(x) <- value

## S4 replacement method for signature 'PCAGenomicSignatures'

gsea(x) <- value

## S4 replacement method for signature 'PCAGenomicSignatures'

trainingData(x) <- value

## S4 replacement method for signature 'PCAGenomicSignatures'

mesh(x) <- value

## S4 replacement method for signature 'PCAGenomicSignatures'

PCAsummary(x) <- value

## S4 method for signature 'PCAGenomicSignatures'

studies(x)
## S4 method for signature 'PCAGenomicSignatures'
silhouetteWidth(x)

## S4 method for signature 'PCAGenomicSignatures'
gsea(x)

## S4 method for signature 'PCAGenomicSignatures'
trainingData(x)

## S4 method for signature 'PCAGenomicSignatures'
mesh(x)

## S4 method for signature 'PCAGenomicSignatures'
PCAsummary(x)

## S4 method for signature 'PCAGenomicSignatures'
show(object)

### Arguments

- **value**
  See details.

- **object, x**
  A PCAGenomicSignatures object

### Details

- RA Vindex(x) : RA Vindex (= avgLoadings) containing genes x RAVs
- metadata(x)$cluster : A vector of integers (from 1:k) indicating the cluster to which each PC is allocated.
- metadata(x)$size : The number of PCs in each cluster.
- metadata(x)$k : The number of RAVs.
- metadata(x)$n : The number of top PCs from each dataset.
- metadata(x)$geneSets : Name of the prior gene sets used to annotate average loadings.
- colData(x)$studies : A list of character vectors containing studies contributing to each PC cluster.
- colData(x)$gsea : A list of data frames. Each element is a subset of outputs from clusterProfiler::GSEA function.

### Value

PCAGenomicSignatures object with multiple setters or accessors

### Slots

- **trainingData** A DataFrame class object for metadata associated with training data
Setters

Setter method values (i.e., `function(x) <- value`):

- `geneSets<-` : A character vector containing the name of gene sets used to annotate average loadings
- `studies<-` : A list of character vectors containing gene sets used to annotate average loadings
- `gsea<-` : A list of `gseaResult` objects.
- `metadata<-` : A list object of metadata
- `$<-` : A vector to replace the indicated column in `colData`

Accessors

All the accessors inherited from `SummarizedExperiment` are available and the additional accessors for `PCAGenomicSignatures` specific data are listed below.

- `RAVindex` : Equivalent to the `assay(x)`
- `geneSets` : Access the `metadata(x)$geneSets` slot
- `studies` : Access the `colData(x)$studies` slot
- `gsea` : Access the `colData(x)$gsea` slot
- `$` : Access a column in `colData`
- `trainingData` : Access the `trainingData(x)` slot
- `mesh` : Access the `trainingData(x)$MeSH` slot
- `PCAsummary` : Access the `trainingData(x)$PCAsummary` slot

Examples

```r
data(miniRAVmodel)
miniRAVmodel
```

---

**PCinRAV**

*Extract the list of PCs in a cluster*

**Description**

A RAV model contains clusters of PCs from individual studies. This function extracts the names of the original PCs from the RAV model given the index in the RAV model.

**Usage**

```r
PCinRAV(RAVmodel, ind)
```

**Arguments**

- `RAVmodel` : A `PCAGenomicSignatures` object
- `ind` : An index of RAV
plotAnnotatedPCA

Value
A character vector of PC/study names

Examples

```r
data(miniRAVmodel)
PCinRAV(miniRAVmodel, 695)
```

plotAnnotatedPCA  
Two-dimensional PCA plot with the PC annotation

Description
Two-dimensional PCA plot with the PC annotation

Usage

```r
plotAnnotatedPCA(
  dataset,           # A gene expression profile to be validated. Different classes of objects can be used including ExpressionSet, SummarizedExperiment, RangedSummarizedExperiment, or matrix. Rownames (genes) should be in symbol format. If it is a matrix, genes should be in rows and samples in columns.
  RAVmodel,         # PCAGenomicSignatures-class object
  PCnum,            # A numeric vector length of 2. The values should be between 1 and 8.
  val_all = NULL,   # The output from validate
  scoreCutoff = 0.5, # A numeric value for the minimum correlation. Default 0.5.
  nesCutoff = NULL, # A numeric value for the minimum NES. Default is NULL and the suggested value is 3.
  color_by = NULL,  # A named vector with the feature you want to color by. Name should be match with the sample names of the dataset.
  color_lab = NULL, # A numeric value for the minimum NES. Default is NULL and the suggested value is 3.
  trimed_pathway_len = 45 # A numeric value for the minimum NES. Default is NULL and the suggested value is 3.
)
```

Arguments

dataset  
RAVmodel  
PCnum  
val_all  
scoreCutoff  
nesCutoff  
color_by  
color_lab  
trimed_pathway_len
color_lab  A name for color legend. If this argument is not provided, the color legend will be labeled as "Color By" by default.
trimed_pathway_len  Positive inter values, which is the display width of pathway names. Default is 45.

Value  Scatter plot and the table with annotation. If enriched pathway didn’t pass the scoreCutoff the table will be labeled as "No significant pathways". If any enriched pathway didn’t pass the nesCutoff, it will labeled as NA.

Examples  
```r
data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
## Not run:
plotAnnotatedPCA(exprs(dset), miniRAVmodel, PCnum = c(1,2))
## End(Not run)
```

---

### plotValidate

**Plot validation results in an interactive graph**

**Description**

There are three main information on the graph:

- **x-axis** : Pearson correlation coefficient. Higher value means that test dataset and RAV is more tightly associated with.
- **y-axis** : Silhouette width representing the quality of RAVs.
- **size** : The number of studies in each RAV (= cluster size)
- **color** : Test dataset’s PC number that validate each RAV. Because we used top 8 PCs of the test dataset, there are 8 categories.

**Usage**

```r
plotValidate(
  val_all,
  minClusterSize = 2,
  swFilter = FALSE,
  minSilhouetteWidth = 0,
  interactive = FALSE,
  minClSize = NULL,
  maxClSize = NULL,
  colorPalette = "Dark2"
)
```
Arguments

val_all Output from validate function.
minClusterSize The minimum size of clusters to be included in the plotting. Default value is 2, so any single-element clusters are excluded.
swFilter If swFilter=TRUE, only RAV above the cutoff, defined through minSilhouetteWidth argument will be plotted. Default is swFilter=FALSE
minSilhouetteWidth A minimum average silhouette width to be plotted. Only effective under swFilter=TRUE condition. Default is 0.
interactive If set to TRUE, the output will be interactive plot. Default is FALSE.
minClSize The minimum number of PCs in the clusters you want.
maxClSize The maximum number of PCs in the clusters you want.
colorPalette Default is Dark2. For other color options, please check scale_color_brewer

Value

a ggplot object

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
val_all <- validate(dset, miniRAVmodel)
plotValidate(val_all)

res_hcut

Subset of allZ matrix constructed from 8 CRC training datasets

Description

Eight colorectal cancer microarray datasets were used to build RAVmodel and the intermediate file containing genes and top PCs from each dataset is named as allZ. Hierarchical clustering result of allZ is saved as res_hcut.

Usage

res_hcut

Format

hclust object from factoextra::hcut function.

Author(s)

Sehyun Oh <shbrief@gmail.com>
### rmNaInf

**Remove rows with missing and Inf values from a matrix**

**Description**

Remove rows with missing and Inf values from a matrix

**Usage**

```r
rmNaInf(x)
```

**Arguments**

- `x`: A numeric matrix.

**Value**

The updated input matrix where rows with NA and Inf values are removed.

**Examples**

```r
m = matrix(rnorm(100), ncol=10)
m[1,1] = NA
ml = rmNaInf(m)
dim(ml)
```

---

### sampleScoreHeatmap

**Plot heatmap of the sample scores**

**Description**

Plot heatmap of the sample scores

**Usage**

```r
sampleScoreHeatmap(
    score,
    dataName,
    modelName,
    cluster_rows = TRUE,
    cluster_columns = TRUE,
    show_row_names = TRUE,
    show_column_names = TRUE,
    row_names_gp = 0.7,
)```
subsetEnrichedPathways

Arguments

score An output from `calculateScore` function, which is a matrix with samples (row) and PrcompClusters (column) If it is a simple vector, it will be converted to a one-column matrix.
dataName Title on the row. The name of the dataset to be scored.
modelName Title on the column. The RAVmodel used for scoring.
cluster_rows A logical. Under the default (TRUE), rows will be clustered.
cluster_columns A logical. Under the default (TRUE), columns will be clustered.
show_row_names Whether show row names. Default is TRUE, showing the row name.
show_column_names Whether show column names. Default is TRUE, showing the column name.
row_names_gp Graphic parameters for row names. The default is 0.7.
column_names_gp Graphic parameters for column names. The default is 5.

Value

A heatmap of the sample score. Rows represent samples and columns represent RAVs.

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
score <- calculateScore(dset, miniRAVmodel)
sampleScoreHeatmap(score, dataName="bcellViper", modelName="miniRAVmodel")

subsetEnrichedPathways

Subset enriched pathways of RAV

Description

Subset enriched pathways of RAV
Usage

```r
subsetEnrichedPathways(
  RAVmodel,
  ind = NULL,
  n = 10,
  both = FALSE,
  include_nes = FALSE
)
```

Arguments

- **RAVmodel**: PCAGenomicSignatures object. Also an output from GSEA can be used.
- **ind**: A numeric vector containing the RAV number you want to check enriched pathways. If not specified, this function returns results from all the RAVs.
- **n**: The number of top and bottom pathways to be selected based on normalized enrichment score (NES).
- **both**: Default is `FALSE`, where only the top `n` pathways will be printed. If it is set to `TRUE`, the output will contain both top and bottom `n` pathways.
- **include_nes**: Default is `FALSE`. If it set to `TRUE`, the output will include both description and NES of the enriched pathway.

Value

A DataFrame with top and bottom `n` pathways from the enrichment results.

Examples

```r
data(miniRAVmodel)

# all RAVs in model
subsetEnrichedPathways(miniRAVmodel,n=5)

# only a specific RAV (note the colnames above)
subsetEnrichedPathways(miniRAVmodel,ind=695,n=5)
```

validate

Validate new datasets

Description

Validate new datasets
validate

Usage

validate(
  dataset,
  RAVmodel,
  method = "pearson",
  maxFrom = "PC",
  level = "max",
  scale = FALSE
)

Arguments

dataset Single or a named list of SummarizedExperiment (RangedSummarizedExperiment, ExpressionSet or matrix) object(s). Gene names should be in 'symbol' format. Currently, each dataset should have at least 8 samples.

RAVmodel PCAGenomicSignatures object.

method A character string indicating which correlation coefficient is to be computed. One of "pearson" (default), "kendall", or "spearman": can be abbreviated.

maxFrom Select whether to display the maximum value from dataset’s PCs or avgLoadings. Under the default (maxFrom="PC"), the maximum correlation coefficient from top 8 PCs for each avgLoading will be selected as an output. If you choose (maxFrom="avgLoading"), the avgLoading with the maximum correlation coefficient with each PC will be in the output.

level Output format of validated result. Two options are available: c("max", "all"). Default is "max", which outputs the matrix containing only the maximum coefficient. To get the coefficient of all 8 PCs, set this argument as "all". level = "all" can be used only for one dataset.

scale Default is FALSE. If it is set to TRUE, dataset will be row normalized.

Value

A data frame containing the maximum pearson correlation coefficient between the top 8 PCs of the dataset and pre-calculated average loadings (in row) of training datasets (score column). It also contains other metadata associated with each RAV: PC for one of the top 8 PCs of the dataset that results in the given score, sw for the average silhouette width of the RAV, cl_size for the size of each RAV.

If the input for dataset argument is a list of different datasets, each row of the output represents a new dataset for test, and each column represents clusters from training datasets. If level = "all", a list containing the matrices of the pearson correlation coefficient between all top 8 PCs of the datasets and avgLoading.

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
validate(dset, miniRAVmodel)
validatedSignatures

validate(dset, miniRAVmodel, maxFrom = "avgLoading")

---

**validatedSignatures**

*Validation result in data frame*

---

**Description**

Validation result in data frame

**Usage**

```r
validatedSignatures(
  val_all,
  RAVmodel,
  num.out = 5,
  scoreCutoff = NULL,
  swCutoff = NULL,
  clsSizeCutoff = NULL,
  indexOnly = FALSE,
  whichPC = NULL,
  filterMessage = TRUE
)
```

**Arguments**

- **val_all**: An output matrix from `validate` function. If this input is from multiple datasets, only `scoreCutoff` argument will be considered and other inputs will be ignored.
- **RAVmodel**: PCAGenomicSignatures-class object. RAVmodel used to prepare `val_all` input.
- **num.out**: A number of highly validated RAVs to output. Default is 5. If any of the cutoff parameters are provided, `num.out` or the number of filtered RAVs, whichever smaller, will be chosen.
- **scoreCutoff**: A numeric value for the minimum correlation. For multi-studies case, the default is 0.7.
- **swCutoff**: A numeric value for the minimum average silhouette width.
- **clsSizeCutoff**: An integer value for the minimum cluster size.
- **indexOnly**: A logical. Under the default (`FALSE`), the detailed information on validated RAVs, such as score, average silhouette width, cluster size, is printed. If it is set `TRUE`, only the RAV number will be printed.
- **whichPC**: An integer value between 1 and 8. PC number of your data to check the validated signatures with. Under the default (NULL), it outputs top scored signatures with any PC of your data.
- **filterMessage**: A logical. Under the default `TRUE`, any output RAV belong to the filtering list will give a message. Silence this message with `filterMessage=FALSE`. You can check the filter list using `data("filterList")`. 

---

**Example**

```r
validate(dset, miniRAVmodel, maxFrom = "avgLoading")
```
Value

A subset of the input matrix, which meets the given condition.

Examples

data(miniRAVmodel)
library(bcellViper)
data(bcellViper)
val_all <- validate(dset, miniRAVmodel)
validatedSignatures(val_all, miniRAVmodel, num.out = 3, scoreCutoff = 0)
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