Package ‘MAIT’

January 30, 2017

**Type** Package

**Title** Statistical Analysis of Metabolomic Data

**Version** 1.8.0

**Date** 10-3-2014

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**Description** The MAIT package contains functions to perform end-to-end statistical analysis of LC/MS Metabolomic Data. Special emphasis is put on peak annotation and in modular function design of the functions.

**biocViews** MassSpectrometry, Metabolomics, Software

**License** GPL-2

**LazyLoad** yes

**Depends** R (>= 2.10), CAMERA, Rcpp, pls

**Imports** gplots,e1071,class,MASS,plsgenomics,agricolae,xcms,methods,caret

**Enhances** rgl

**NeedsCompilation** no

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Biotransformations

Biotransformations of the significant data contained in a MAIT object are identified.

Description

This function takes a MAIT-class object having significant features already detected and looks up for biotransformations between them. MAIT has a default biotransformation table that will be used if no other table is specified via the bioTable input parameter.

Usage

Biotransformations(MAIT.object = NULL,
                  peakPrecision = 0.005,
                  bioTable = NULL,
                  adductTable = NULL,
                  adductAnnotation = FALSE)
Arguments

MAIT.object  A MAIT-class object where significant features have already been found.

peakPrecision  Maximum difference between the peak masses differences and the values shown in bioTable to be considered as a biotransformation. As default the value is 0.005 Da.

bioTable  Table containing the biotransformations to be looked for in the signData input. By default it is taken the MAIT-class biotransformations table.

adductTable  Table containing the adducts to be looked for in the signData input. By default it is taken the MAIT-class positive adducts table. If this argument is set to "negAdducts", then the default table for negative adducts is taken instead. It is possible to use a user-defined adduct table.

adductAnnotation  If it is set to TRUE, both adduct and Biotransformations annotation stages are performed.

Value

A MAIT-class object with the updated biotransformations slot

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

spectralAnova, spectralTStudent

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-Biotransformations(MAIT.object = MAIT, peakPrecision = 0.005)
MAIT@FeatureInfo@biotransformations; #Detected Biotransformations

biotransformationsTable

Description

This table contains the biotransformations to be looked up for.

Value

A table having the fields:

- NAME: The name of the biotransformation
- MASSDIFF: The mass difference of the fragment caused by the biotransformation
classes

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
Biotransformations

classes Class names extractor from a MAIT object

Description
Function classes extracts the class names of a linkMAIT-class object as a vector.

Usage
classes(MAIT.object)

Arguments
MAIT.object A MAIT-class object

Value
A character vector containing the class names of the MAIT-class object

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class

Examples
data(MAIT_sample)
MAIT
classes(MAIT)
classifRatioClasses

Class classification ratio extractor from a MAIT object

Description

Function classifRatioClasses extracts the class classification ratio of a MAIT object as a matrix.

Usage

classifRatioClasses(MAIT.object)

Arguments

MAIT.object
A MAIT-class object where function Validation has already been launched successfully.

Value

A matrix containing the classification ratio for each class, classifier and iteration.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT <- Validation(Iterations = 20, trainSamples= 15, MAIT.object = MAIT)
classifRatioClasses(MAIT)

classNum

Sample number extractor for each class from a MAIT object

Description

Function classNum extracts the number of samples belonging to each class of a MAIT object as a vector.

Usage

classNum(MAIT.object)
Database

Arguments

MAIT.object  A MAIT-class object

Value

A numeric vector containing the number of samples for each class of the MAIT object. The order of the classes correspond to that of the output of function classes.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class

Examples

data(MAIT_sample)
MAIT
classNum(MAIT)

Database  Human Metabolome Database

Description

The Human Metabolome Database is saved in this dataframe.

Value

A table having the fields:

- ENTRY: HMDB entry
- NAME: The compound name
- FORMULA: The chemical formula of the compound
- MASS: Mass of the fragment
- Biofluid: Where the compound can be found

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

identifyMetabolites metaboliteTable
featureID

**Feature ID extractor from a MAIT object**

**Description**
Function `featureID` extracts the feature IDs of a MAIT object as a vector.

**Usage**

```r
featureID(MAIT.object)
```

**Arguments**

- `MAIT.object` A MAIT-class object

**Value**
A numeric vector containing the feature IDs of the MAIT object.

**Author(s)**
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

**See Also**
MAIT-class

**Examples**

```r
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
featureID(MAIT)
```

featureInfo

**Feature Info extractor from a MAIT object**

**Description**
Function `featureInfo` extracts the slot MAIT.FeatureInfo of a MAIT object.

**Usage**

```r
featureInfo(MAIT.object)
```

**Arguments**

- `MAIT.object` A MAIT-class object
featureSigID

Value
An object of the class MAIT.FeatureInfo. More Info at MAIT-class.

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class

Examples
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
featureInfo(MAIT)

---

featureSigID Feature statistically significant ID extractor from a MAIT object

Description
Function featureSigID extracts the vector index of the feature IDs of a MAIT object that have been found significant through function spectralSigFeatures.

Usage
featureSigID(MAIT.object)

Arguments
MAIT.object A MAIT-class object

Value
A numeric vector containing the statistically significant feature IDs of the MAIT object.

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class spectralSigFeatures

Examples
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
featureSigID(MAIT)
featureID(MAIT)[featureSigID(MAIT)] #Significant spectra IDs
Description

Function `getScoresTable` takes an MAIT-class object and returns a list with the scores of the features in the samples. Additionally, it returns the spectral ID of the peak and (optionally) a table containing the peak information (mass, retention time and annotation).

Usage

```r
getScoresTable(MAIT.object = NULL,
getSpectra = TRUE,
getExtendedTable = FALSE)
```

Arguments

- `MAIT.object` A MAIT-class object where significant features have already been found.
- `getSpectra` If it is set to TRUE, an element of the returned list will contain the spectra ID of each feature.
- `getExtendedTable` If it is set to TRUE, an element of the returned list will contain a table with peak information (mass, retention time, annotation, intensity per sample).

Value

A list containing:

- scores: The intensity of each feature per sample
- spectralID: A numeric with the correspondence between peaks and spectral ID
- extendedTable: a data frame containing detailed peak information (mass, retention time, annotation, intensity per sample).

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

- spectralTStudent
- spectralAnova

Examples

```r
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
getScoresTable(MAIT,getExtendedTable=TRUE)
```
identifyMetabolites

**Description**

Takes a MAIT object and performs the metabolite search for the significant features

**Usage**

```r
identifyMetabolites(MAIT.object=NULL,
                    peakTolerance=0.005,
                    database=NULL,
                    polarity="positive",
                    printCSVfile=TRUE)
```

**Arguments**

- **MAIT.object** A MAIT-class object where significant features have already been found.
- **peakTolerance** Maximum difference between the peak masses differences and the values shown in the database to be considered as a match. As default the value is 0.005 Da.
- **database** User-defined input table. If it is set to NULL, the default MAIT database is selected to perform the metabolite identification.
- **polarity** Character parameter that can be set to "positive" or "negative" depending on the polarity in which the samples were taken.
- **printCSVfile** Set to TRUE if an output table has to be produced. The table should be found in (working directory)/Tables/SearchTable.csv.

**Value**

An output table is stored in the folder (working directory)/Tables/SearchTable.csv if printCSVfile is set to TRUE. More info at metaboliteTable

**Author(s)**

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

**See Also**

Biotransformations spectralSigFeatures

**Examples**

```r
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-Biotransformations(MAIT.object = MAIT, peakPrecision = 0.005)
MAIT <- identifyMetabolites(MAIT.object = MAIT, peakTolerance = 0.005,polarity="positive")
```
Description

Function `loadings` returns the loading vectors for either the PCA, PLS models when functions `plotPCA` or `plotPLS` have been already respectively launched. It also can be used to retrieve the peak aggregation models.

Usage

```r
loadings(object, type = "none", ...)"`, "none"`, `...
```

Arguments

- `object` A MAIT-class object
- `type` A character whose value should be "PCA" or "PLS" depending on which loading vectors are wanted. If it is set to "none", the peak aggregation models are retrieved.
- `...` Other input

Value

A matrix with the loading vectors.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

`plotPCA` or `plotPLS`

Examples

```r
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
loadings(MAIT)

MAIT<-plotPCA(MAIT,plot3d=FALSE)
loadings(MAIT,type="PCA")

MAIT<-plotPLS(MAIT,plot3d=FALSE)
loadings(MAIT,type="PLS")
```
LSDResults  

**Extractor of the Fisher’s LSD tests from a MAIT object**

**Description**

Function LSDResults extracts the results of the LSD tests of a MAIT object as a matrix.

**Usage**

LSDResults(MAIT.object)

**Arguments**

- **MAIT.object**  
  A MAIT-class object

**Value**

A matrix containing the results of the Fisher’s LSD tests. For each row, equal letters mean that the groups are found to be equal in the test.

**Author(s)**

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

**See Also**

MAIT-class FisherLSD spectralSigFeatures

**Examples**

data(MAIT_sample)  
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)  
LSDResults(MAIT)

---

**MAIT**

**Description**

A MAIT-class object containing simulated LC/MS data

**Value**

- **MAIT.object**  
  A MAIT-class object

**Author(s)**

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>
MAIT-class

Slots

FeatureInfo: Object of class MAIT.FeatureInfo-class
RawData: Object of class MAIT.RawData-class
Validation: Object of class MAIT.Validation-class
PhenoData: Object of class MAIT.PhenoData-class
FeatureData: Object of class MAIT.FeatureData-class

Methods

summary signature(object = "MAIT"): This function show a summary of the workflow results performed so far including the classification results and the parameters used.

model signature(object = "MAIT"): returns the model for either the PCA, PLS models when functions plotPCA or plotPLS have been already respectively launched.

scores signature(object = "MAIT"): Retrieves the scores from a MAIT object

loadings signature(object = "MAIT"): Retrieves the loadings from a MAIT object

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

xsAnnotate
Slots

scores: Here it is saved the dataset obtained after applying the `peakAggregation` function.

featureID: The ID numbers of all features are saved here.

featureSigID: The ID numbers of the significant features are saved here.

LSDResults: The results of performing a Fisher LSD test on each significant variable are saved in this slot.

models: The model for each feature used to obtain the scores are saved in this slot.

pvalues: In this slot are saved the pvalues of the features.

pvaluesCorrection: The pvalues corrected by multiple test correction are saved here.

pcamodel: PCA model generated using the function `plotPCA`.

plsmodel: PCA model generated using the function `plotPLS`.

masses: Masses used as an input for the function `MAITbuilder`.

rt: Retention time values used as an input for the function `MAITbuilder`.

extendedTable: Dataframe containing the information regarding masses, retention time values, intensity and spectra IDs passes as an input for the function `MAITbuilder`.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class xsAnnotate

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### MAIT.FeatureInfo-class

**Class** "MAIT.FeatureInfo"

**Description**

MAIT.FeatureInfo objects are used in the MAIT package to save the data related to the information of the features.

**Slots**

It stores information related to the features. It contains three extra slots:

biotransformations: Biotransformations found when function `Biotransformations` is launched.

peakAgMethod: In this slot is stored the table created by the function `identifyMetabolites`. It can be retrieved quickly in R by using the function `metaboliteTable`.

metaboliteTable: Peak Aggregation Method used when function `peakAggregation` is launched.

**Methods**

No methods defined with class "MAIT.FeatureInfo" in the signature.
MAIT.Parameters-class

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class xsAnnotate

MAIT.Parameters-class  Class "MAIT.Parameters"

Description

This class contains all the parameters used in the MAIT run.

Slots

  sampleProcessing: List containing the parameters of the function sampleProcessing
  peakAnnotation: List containing the parameters of the function peakAnnotation
  peakAggregation: List containing the parameters of the function peakAggregation
  sigFeatures: List containing the parameters of the function spectralSigFeatures
  biotransformations: List containing the parameters of the function Biotransformations
  identifyMetabolites: List containing the parameters of the function identifyMetabolites
  classification: List containing the parameters of the function Validation
  plotPCA: List containing the parameters of the function plotPCA
  plotPLS: List containing the parameters of the function plotPLS
  plotHeatmap: List containing the parameters of the function plotHeatmap

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class
MAIT.PhenoData-class  Class "MAIT.PhenoData"

Description

MAIT.PhenoData objects are used in the MAIT package to save the phenotype data.

Objects from the Class

Objects can be created by calls of the form `new("MAIT.PhenoData", ...)`. 

Slots

The information related to the classes present in the data is stored in this slot. It has three different extra slots:

- `classes`: It contains the name of the classes in the data. It can be quickly accessed by using the function `classes`
- `classNum`: Vector showing the number of samples belonging to each class. It can be quickly accessed by using the function `classNum`
- `resultsPath`: In this slot is saved the direction where the project is saved. This means that all the output tables and files of the MAIT object are going to be stored in that directory. It can be quickly accessed by using the function `resultsPath`

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class xsAnnotate

MAIT.RawData-class  Class "MAIT.RawData"

Description

MAIT.RawData objects are used in the MAIT package to save the data related to the information of the features.

Slots

This class contains information of the raw data and the parameters of the whole analysis. It has two slots:

- `parameters`: All the parameters of the analysis are saved in this slot. It can be obtained as a matrix in R by typing `summary(parameters(MAIT.object))`
- `data`: This slot contains either the xcmsSet-class or the xsAnnotate object, depending if the function `peakAnnotation` has already been launched
Description

MAIT.Validation objects are used in the MAIT package to save the validation results obtained from the classification run.

Slots

The information related to the run of the function Validation is saved here. It contains three lots:

ovClassifRatioTable: Summary table showing the overall classification ratios for each of the three classifiers. It can be quickly gathered by using the function ovClassifRatioTable

ovClassifRatioData: All the data corresponding to the overall classification ratios. It can be quickly gathered by using the function ovClassifRatioData

classifRatioClasses: All the data corresponding to the classification ratios per class. It can be quickly gathered by using the function classifRatioClasses

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class xsAnnotate
**MAITbuilder**

*MAIT constructor function when using external peak data*

**Description**

Function MAITbuilder creates a MAIT-class object for a given external data. This process allows the user to analyse external peak data through all the MAIT processing steps.

**Usage**

```r
MAITbuilder(data = NULL,
             spectraID = NULL,
             masses = NULL,
             rt = NULL,
             classes = NULL,
             significantFeatures = FALSE,
             spectraEstimation = FALSE,
             rtRange = 0.2,
             corThresh = 0.7)
```

**Arguments**

- `data`  
  Matrix containing the peak intensity values for each sample. Each row should correspond to a peak and each column to a sample.

- `spectraID`  
  Numeric corresponding to the peak spectral grouping IDs. Two peaks having the same spectraID means that they correspond to the same spectrum.

- `masses`  
  Numeric that contains the masses of the peaks. It should be as long as the number of rows in the argument data.

- `rt`  
  Numeric that contains the retention time of the peaks. It should be as long as the number of rows in the argument data.

- `classes`  
  Character with the class labels for each sample. It should be as long as the number of columns in the argument data.

- `significantFeatures`  
  If it is set to TRUE, all the features set as an input are considered to be significant. Functions `Biotransformations`, `identifyMetabolites`, `Validation`, `plotPCA`, `plotPLS`, `plotHeatmap`, `plotBoxplot` are computed on the significant features only. If it is only wanted to perform an annotation process on the external peak data, this flag should be set to TRUE.

- `spectraEstimation`  
  If it is set to TRUE, an estimation of the peak grouping into spectra is performed. This computation is based on a retention time window (set by the argument `rtRange`) and a correlation threshold (defined by the parameter `corThresh`).

- `rtRange`  
  Retention time parameter used to build a window to perform an estimation of the peak grouping into spectra.

- `corThresh`  
  Peak correlation value used to define a threshold to perform an estimation of the peak grouping into spectra.
metaboliteTable

Value

All the input values are stored in a new MAIT object.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

Examples

data(MAIT_sample)
peaks<-scores(MAIT)
masses<-aux$extendedTable$mz
rt <- aux$extendedTable$rt
classFactor <- rep(classes(MAIT),classNum(MAIT))
importMAIT <- MAITbuilder(data=peaks,masses=masses,rt=rt,
   significantFeatures=TRUE, spectraEstimation=TRUE, rtRange=0.2,
   corThresh=0.7,classes=classFactor)

importMAIT

metaboliteTable

Metabolite table generator

Description

Takes a MAIT-class object and builds a table with the information related to the significant features and their possible identifications.

Usage

metaboliteTable(MAIT.object, printCSVfile = FALSE)

Arguments

MAIT.object A MAIT-class object where significant features have already been found.
printCSVfile A boolean parameter. Set to TRUE if a csv file should be written with the metabolite table.

Value

An output table is stored in the folder (working directory)/Tables/SearchTable.csv having the fields:

• First column: search ID number.
• Second column (mz): Peak mass.
• Third column (rt): Peak retention time (in minutes).
• The columns from the third to the column labeled "p.adj" contain number of class samples where the peak has been detected and the intensities of the peak among samples.
• The P.adjust column contains the corrected peak p-value using bonferroni.
• The p column shows the peak p-value with no multiple test correction.
• The Fisher column shows the Fisher test results for the peak. Each of the letters separated by the character "_" corresponds to a class value. Classes having the same letters are indistinguishable whereas those having different letters are statistically different classes.
• The isotope column shows if the peak has been identified as a possible isotope.
• The adduct column shows which kind of adduct or biotransformation could the peak be.
• Column Name contains the name of the possible metabolite identification for the peak.
• The column labeled spectra contains the spectral ID of the peak.
• Column Biofluid shows if the identified search is stored as a biofluid in the input database or not.
• The column ENTRY shows the database name of the entry for the metabolite.

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
identifyMetabolites spectralAnova spectralTStudent

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-Biotransformations(MAIT.object = MAIT, peakPrecision = 0.005)
MAIT <- identifyMetabolites(MAIT.object = MAIT, peakTolerance = 0.005,polarity="positive")
head(metaboliteTable(MAIT))

model

Model extractor for either PCA or PLS models

Description
Function model returns the model for either the PCA, PLS models when functions plotPCA or plotPLS have been already respectively launched.

Usage

model(x,type)

Arguments

  x  A MAIT-class object

  type A character whose value should be "PCA" or "PLS" depending on which loading vectors are wanted.

Value

The PCA or PLS model
Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
plotPCA or plotPLS

Examples
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-plotPCA(MAIT,plot3d=FALSE)
model(MAIT,type="PCA")

MAIT<-plotPLS(MAIT,plot3d=FALSE)
model(MAIT,type="PLS")

models
Model extractor from a MAIT object

Description
Function models extracts the models of a MAIT object as a list.

Usage
models(MAIT.object)

Arguments
MAIT.object A MAIT-class object

Value
A list containing the models of the MAIT object.

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class

Examples
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
models(MAIT)
negAdducts  

**Negative adducts table**

**Description**

This table contains the adducts to be looked up for when the LC/MS polarisation mode was set to Negative. The layout of the table is that of the CAMERA adduct table.

**Value**

A table having the fields:

- **ID**: An ID number
- **name**: The adduct name
- **nmol**: Number of fragments in the adduct
- **charge**: Electric charge of the adduct
- **massdiff**: Mass difference in the fragment caused by the adduct
- **oidscore**: Numeric relating the related clusters of ions
- **quasi**: Binary value showing the validness of the annotation group
- **ips**: Four values are possible (0.25, 0.5, 0.75, 1) depending on the likelihood of the rule

**Author(s)**

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

**See Also**

peakAnnotation

---

**ovClassifRatioData**  

**Overall classification ratio extractor for MAIT objects**

**Description**

Function `ovClassifRatioData` extracts the overall classification ratio for a MAIT-class object.

**Usage**

`ovClassifRatioData(MAIT.object)`

**Arguments**

- **MAIT.object**: A MAIT-class object

**Value**

A list containing the overall classification ratio of the MAIT-class object for each classifier.
ovClassifRatioTable

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class Validation

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT <- Validation(Iterations = 20, trainSamples= 15, MAIT.object = MAIT)

ovClassifRatioData(MAIT)

ovClassifRatioTable

Overall classification table extractor for MAIT objects

Description
Function ovClassifRatioData extracts the overall classification table for a MAIT-class object

Usage

ovClassifRatioTable(MAIT.object)

Arguments

MAIT.object A MAIT-class object

Value
A list containing the overall classification table of the MAIT object for each classifier showing the mean value and their standard error.

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class Validation

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT <- Validation(Iterations = 20, trainSamples= 15, MAIT.object = MAIT)

ovClassifRatioTable(MAIT)
parameters  
*Extractor of the parameters used in the whole run from a MAIT object*

Description

Function `parameters` extracts the slot `linkMAIT.Parameters-class` of a `MAIT-class` object. This class contains all the parameters that have been used in the previous functions. Typing a summary of this object, a matrix version of the parameters is obtained.

Usage

```r
parameters(MAIT.object)
```

Arguments

- `MAIT.object` A `MAIT-class` object

Value

An object of the class `MAIT.Parameters`.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

`MAIT-class`

Examples

```r
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT <- Validation(Iterations = 20, trainSamples= 15, MAIT.object = MAIT)
parameters(MAIT)
```

peakAnnotation  
*Spectra constructor and peak annotator*

Description

`peakAnnotation` function performs spectra building and peak annotation using the CAMERA package on a `MAIT-class` object, after applying the `sampleProcessing` function. The resultant `xsAnnotate` object is stored in a `MAIT-class` object.
peakAnnotation

Usage

peakAnnotation(MAIT.object = NULL,
corrWithSamp = 0.7,
perfwhm = 0.6,
sigma = 6,
adductTable = NULL,
printSpectraTable = TRUE,
corrBetSamp = 0.75,
pval = 0.05,
calcIso = TRUE,
calcCis = TRUE,
calcCAs = TRUE,
graphMethod = "hcs",
annotateAdducts = TRUE)

Arguments

MAIT.object A MAIT-class object where function sampleProcessing has already been applied. The output of the function is going to be an update of the same MAIT-class object.
corrWithSamp Correlation threshold value within samples
perfwhm This parameter is used to group two peaks depending on their retention time. Two peaks are considered to be coeluted if their retention time falls in a range defined as Rt_med +/- FWHM * perfwhm. Where Rt_med is the retention time median and FWHM is the Full Width at Half Maximum. Defined this way, perfwhm is the percentage of the width of the FWHM (Full Width at Half Maximum)
sigma Defining the coelution range as defined in the perfwhm variable, the FWHM is obtained by the expression FWHM=SD*sigma, where SD is calculated considering the peak as normally distributed.
adductTable User-defined input table to annotate the peaks. If it is set to NULL, the default MAIT table for adducts in positive polarization is selected. If its value is "negAdducts", the default MAIT table for fragments in negative polarization is chosen. By default it is set to NULL.
printSpectraTable If it is set to TRUE, a three-column table is build as a csv file, where the first column shows the peak mass, the second column its retention time and the third one shows its spectral ID number. This file is saved under the project directory, in the subfolder named Tables.
corrBetSamp Correlation threshold value between samples
pval See groupCorr function in the CAMERA package
calcIso See groupCorr function in the CAMERA package
calcCis See groupCorr function in the CAMERA package
calcCAs See groupCorr function in the CAMERA package
graphMethod See groupCorr function in the CAMERA package
annotateAdducts If it is set to TRUE, the function will perform an adduct annotation stage.
plotBoxplot

Description

This function takes a MAIT-class object containing information related to the significant features and plots a boxplot for each significant feature (peak or spectra).

Usage

plotBoxplot(MAIT.object=NULL)

Arguments

MAIT.object A MAIT-class object where significant features have already been found.

Value

A boxplot is stored as a png file for each of the significant features (peak or spectra). The files will be stored in the directory (working directory)/Boxplots.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

xsAnnotate, xsAnnotate-class

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-plotBoxplot(MAIT)
plotHeatmap

Builds ten heatmaps with different p-values and clustering distances

Description

This function takes a MAIT object containing information of the significant features in the data and plots 10 heatmaps. 5 different p-values (0.05, 0.01, 0.001, 1e-4 and 1e-5) and two clustering distances (euclidean and pearson) are used.

Usage

plotHeatmap(MAIT.object=NULL)

Arguments

MAIT.object A MAIT-class object where significant features have already been found.

Value

10 different heatmaps using 5 p-values (0.05, 0.01, 0.001, 1e-4 and 1e-5) and two clustering distances (euclidean and pearson) are created. The plots will be stored as png files in a folder called (working directory)/Heatmaps.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

spectralAnova spectralTStudent

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-plotHeatmap(MAIT)

plotPCA

2D and 3D PCA scoreplots from a MAIT object

Description

This function takes a MAIT-class object containing information of the significant features in the data and performs 2D scoreplots (PC1 vs PC2, PC2 vs PC3 and PC1 vs PC3) saved as png files. Additionally it also performs an interactive 3D PCA scoreplot.
Usage

plotPCA (MAIT.object=NULL, Log=FALSE, center=TRUE, scale=TRUE, plot3d=TRUE)

Arguments

MAIT.object  A MAIT-class object where significant features have already been found.
Log           Set to TRUE if the data should be plotted using the logarithm of the intensity.
center        Set to TRUE if the data should be centered around its mean. See scale.
scale         Set to TRUE if the data should be scaled. See scale.
plot3d        Boolean set to TRUE if a 3D PCA scoreplot should be plot.

Value

Three different PCA scoreplots are printed in three png files. One using PC1 vs PC2, another with PC1 vs PC3 and the last one with PC2 vs PC3. The files will be stored in the directory (working directory)/PCA_Scoreplots. Moreover, an interactive 3D PCA scoreplot is also generated through function PCAplot3d.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

spectralAnova spectralTStudent

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-plotPCA(MAIT,plot3d=FALSE)

plotPLS  2D and 3D PLS scoreplots from a MAIT object

Description

This function takes a MAIT-class object containing information of the significant features in the data and performs 2D scoreplots (PC1 vs PC2, PC2 vs PC3 and PC1 vs PC3) saved as png files. Additionally it also performs an interactive 3D PLS scoreplot.
Usage

`plotPLS(MAIT.object=NULL, Log=FALSE, center=TRUE, scale=TRUE, plot3d=TRUE)`

Arguments

- **MAIT.object**: A MAIT-class object where significant features have already been found.
- **Log**: Set to TRUE if the data should be plotted using the logarithm of the intensity.
- **center**: Set to TRUE if the data should be centered around its mean. See **scale**.
- **scale**: Set to TRUE if the data should be scaled. See **scale**.
- **plot3d**: Boolean set to TRUE if a 3D PCA scoreplot should be plot.

Value

If the number of components in the PLS is found to be three or more, three different PLS scoreplots are printed in three png files. One using PC1 vs PC2, another with PC1 vs PC3 and the last one with PC2 vs PC3. If the number of components is less than three, all the possible plots of these three are created. The files will be stored in the directory (working directory)/PLS_Scoreplots. Moreover, an interactive 3D PLS scoreplot is also generated through function `PCAplot3d`.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

`spectralAnova spectralTStudent`

Examples

```r
data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT<-plotPLS(MAIT,plot3d=FALSE)
```

---

### posAdducts

**Positive adducts table**

Description

This table contains the adducts to be looked up for when the LC/MS polarisation mode was set to positive. The layout of the table is that of the CAMERA adduct table.
**Value**

A table having the fields:

- ID: An ID number
- name: The adduct name
- nmol: Number of fragments in the adduct
- charge: Electric charge of the adduct
- massdiff: Mass difference in the fragment caused by the adduct
- oidscore: Numeric relating the related clusters of ions
- quasi: Binary value showing the validness of the annotation group
- ips: Four values are possible (0.25,0.5,0.75,1) depending on the likelihood of the rule

**Author(s)**

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

**See Also**

peakAnnotation

---

**pvalues**

*Pvalues extractor from a MAIT object*

**Description**

Function `pvalues` extracts the pvalues contained in a *MAIT-class* object.

**Usage**

```r
pvalues(MAIT.object)
```

**Arguments**

- `MAIT.object` A *MAIT-class* object

**Value**

A numeric vector containing the pvalues of a *MAIT-class* object.

**Author(s)**

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

**See Also**

*MAIT-class spectralSigFeatures*
pvaluesCorrection

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
pvalues(MAIT)

pvaluesCorrection  P-values correction extractor from a MAIT object

Description

Function pvaluesCorrection returns a character showing whether some multiple testing correction has been performed on the p-values.

Usage

pvaluesCorrection(MAIT.object)

Arguments

MAIT.object  A MAIT-class object

Value

The output is a character whose values could be "None" if no p-value correction has been performed or "Bonferroni" if Bonferroni multiple test correction was selected when function spectralSigFeatures was applied.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class spectralSigFeatures

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
pvaluesCorrection(MAIT)
rawData

Description
Function `rawData` extracts the raw data used to build the `MAIT-class` object.

Usage
```
rawData(MAIT.object)
```

Arguments
- `MAIT.object`: A `MAIT-class` object.

Value
A list containing either a `xcmsSet` or a `xsAnnotate` object.

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
- `xsAnnotate-class`

Examples
```
data(MAIT_sample)
MAIT
rawData(MAIT)
```

resultsPath

Description
Function `resultsPath` returns the folder where the plots and tables are saved for a `MAIT-class` object.

Usage
```
resultsPath(MAIT.object)
```
sampleProcessing

Arguments

MAIT.object A MAIT-class object

Value

A character showing where the plots and tables have been stored.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
resultsPath(MAIT)

---

sampleProcessing  Peak detector of netCDF samples using xcms package

Description

sampleProcessing takes a set of netCDF files containing LC/MS sample data and performs a peak
detection, retention time correction and peak grouping steps using the package xcms. A MAIT-class
object is created and all the informated is saved in it.

Usage

sampleProcessing(dataDir = NULL,
snThres = 2,
Sigma = 5/2.3548,
mzSlices = 0.3,
retcorrMethod = "loess",
groupMethod = "density",
bwGroup = 3,
mzWidGroup = 0.25,
filterMethod = "matchedFilter",
rtStep = 0.03,
nSlaves = 0,
minfrac = 0.5,
minsamp = 1,
peakwidth = c(5, 20),
project = NULL,
ppm = 10,
family = c("gaussian", "symmetric"),
span = 0.2,
fhwm = 30)
Arguments

dataDir        Folder where the netCDF files are stored. The samples files must be classified in subdirectories according to their classes.
snThres       Signal to noise ratio. Setting a high value of this parameter will lead to a higher number of features although they will be more noisy.
Sigma          Standard deviation (width) of matched filtration model peak.
mzSlices       Minimum difference in m/z for peaks with overlapping retention times.
retcorrMethod  Method used to correct the retention times values of the variables.
groupMethod    Method used to build the group peaks of variables.
bwGroup        Bandwidth (standard deviation or half width at half maximum) of gaussian smoothing kernel to apply to the peak density chromatogram.
mzWidGroup     Width of overlapping m/z slices to use for creating peak density chromatograms and grouping peaks across samples.
filterMethod   Filtering method applied in the peak detection step.
rtStep         Step size to use for profile generation.
nSlaves        Number of slaves for parallel calculus.
project        Project folder name under which the results will be saved. This folder will be created in the working directory.
minfrac        minimum fraction of samples necessary in at least one of the sample groups for it to be a valid group. See group.density in package xcms for details.
minsamp        minimum number of samples necessary in at least one of the sample groups for it to be a valid group. See group.density in package xcms for details.
ppm            maximal tolerated m/z deviation in consecutive scans, in ppm (parts per million). See findPeaks.centWave in package xcms for details.
peakwidth      Chromatographic peak width, given as range (min,max) in seconds.
fwhm           See fwhm argument in xcmsSet function.
span           See span argument in xcmsSet function.
family         See family argument in xcmsSet function.

Value

A MAIT-class object containing the data of the netCDF files. The xcmsSet-class object can be retrieved using the function rawData.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

Examples

#Provided that the data files are saved accordingly
#in subfolders under a folder named "data" (see vignette):
#MAIT<-sampleProcessing(dataDir = "data", project = "Results", snThres=2, rtStep=0.02)
scores

Retrieves the scores from a MAIT object

Description
Function scores extracts the scores MAIT object

Usage
scores(object,  
  type,...)

Arguments
<table>
<thead>
<tr>
<th>argument</th>
<th>description</th>
</tr>
</thead>
<tbody>
<tr>
<td>object</td>
<td>A MAIT-class object</td>
</tr>
<tr>
<td>type</td>
<td>If it is set to &quot;none&quot;, the peak aggregation models are returned. If it is set to &quot;PCA&quot;, the PCA model is returned. If it is set to &quot;PLS&quot;, the PCA model is returned.</td>
</tr>
<tr>
<td>...</td>
<td>Other input</td>
</tr>
</tbody>
</table>

Value
A numeric matrix containing the scores saved in the MAIT object

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
MAIT-class

Examples
```r
data(MAIT_sample)  
MAIT<-spectralSigFeatures(MAIT,p.adjust="fdr",parametric=TRUE)  
scores(MAIT)

MAIT<-plotPCA(MAIT,plot3d=FALSE)  
scores(MAIT,type="PCA")

MAIT<-plotPLS(MAIT,plot3d=FALSE)  
scores(MAIT,type="PLS")
```
sigPeaksTable

Build a table of the information related to the significant features contained in a MAIT object

Description

Function sigPeaksTable takes an MAIT-class object containing significant feature information and builds a table with the information related to these features.

Usage

```r
sigPeaksTable(MAIT.object=NULL, printCSVfile=FALSE, extendedTable = TRUE, printAnnotation=TRUE)
```

Arguments

- **MAIT.object** A MAIT-class object where significant features have already been found.
- **printCSVfile** Set to TRUE if an output table has to be produced. The table should be found in (working directory)/(project directory)Tables/significativeFeatures.csv.
- **extendedTable** Set to TRUE the table created by the peak external data is used.
- **printAnnotation** Set to TRUE The peak annotation is provided in the output table.

Value

A table containing:

- First column (mz): Peak mass
- Second column(mzmin): Minimum peak mass of the peak group.
- Third column(mzmax): Maximum peak mass of the peak group.
- Fourth column(rt): Peak retention time (in minutes).
- Fifth column(rtmin): Minimum peak retention time of the peak group.
- Sixth column(rtmax): Maximum peak retention time of the peak group.
- Seventh column(npeaks): Number of samples where the peak has been detected.
- The columns from the nineth to the column labeled “isotopes” contain number of class samples where the peak has been detected and the intensities of the peak among samples.
- The isotopes column shows if the peak has been identified as a possible isotope.
- The adduct column shows which kind of adduct could the peak be.
- The column labeled pcgroup contains the spectral ID of the peak.
- The P.adjust column contains the corrected peak p-value using post-hoc methods.
- The p column shows the peak p-value with no multiple test correction.
- The Fisher column shows the Fisher test results for the peak. Each of the letters separated by the character "_" corresponds to a class value. Classes having the same letters are indistinguishable whereas those having different letters are statistically different clases.
- The last columns contain the mean and median values for each feature.
spectralSigFeatures

Author(s)
Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also
spectralTStudent spectralAnova

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
head(sigPeaksTable(MAIT))

spectralSigFeatures  Extract significant features from a MAIT object

Description
Function spectralSigFeatures takes a MAIT-class object and obtains which of the variables are significant given a p-value threshold. The parameters of the significant features can be printed to an output table (TRUE by default). Depending on the number of classes in the data, the function chooses between using ANOVA tests through function spectralAnova, or T-Student tests by using function spectralTStudent.

Usage

spectralSigFeatures(MAIT.object = NULL,
pvalue = 0.05,
p.adj = "none",
printCSVfile = FALSE,
scale = FALSE,
parametric = TRUE,
var.equal = FALSE,
test.fun = NULL,
jitter = FALSE,
jitter.factor = 1,
jitter.amount = 0,
namefun = NULL)

Arguments

MAIT.object  A MAIT-class object where function peakAggregation has already been applied. The output of the function is going to be an update of the same MAIT-class object.

pvalue  P-value threshold. Variables having a p-value lower than this value is considered as a significant variable.

p.adj  Character with the name of the posthoc method to be applied to correct the pvalues. The supported methods are that of the p.adjust function

printCSVfile  Set to TRUE if an output table has to be produced. See function sigPeaksTable for more information.
Validation

scale  Set to FALSE by default. When set to TRUE, a unit variance scaling of the
data when no peak aggregation is performed. If a peak aggregation method is
applied, this parameter is ignored.

parametric  If it is set to TRUE, the statistical tests to be applied will be parametrical tests
(e.g. ANOVA, TStudent or Welch’s tests). Non-parametrical tests (e.g. Kruskal-
Wallis, Mann-Whitney tests) are applied otherwise.

var.equal  Set to FALSE by default. When set to TRUE, a Student’s T-Test is applyied
when having 2 classes in the data. If it is set to FALSE, a Welch’s test is applyied
instead.

test.fun  Function of the user-defined posthoc method to be applyied.

jitter  If it is set to TRUE, a jitter noise is added to the data. This is useful when
applying Mann-Whitney tests with ties.

jitter.factor  See argument factor of the function jitter.

jitter.amount  See argument amount of the function jitter.

namefun  Name of the user-defined posthoc test in the argument test.fun.

Value

A MAIT-class object containing the significant features of the scores slot of MAIT-class object used
as an input.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

MAIT-class spectralTStudent spectralAnova sigPeaksTable

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)

Validation  Cross validated classification over the output of the function
signPeaksAnova or function TStudent2Clases

Description

Function Validation performs a cross-validated classification using three different classifiers: KNN,
PLSDA and SVM. The output comes in a table with the classification ratio and its standard error.
The classification ratio is weighted to take into account the different sample number of each class.
Usage

Validation(Iterations=NULL,
         MAIT.object=NULL,
         trainSamples=NULL,
         PCAscale=FALSE,
         PCAcenter=TRUE,
         RemoveOnePeakSpectra=FALSE,
         tuneSVM=FALSE,
         scale=TRUE)

Arguments

Iterations  Number of iterations to be performed in the classifications. For each iteration a new training group is randomly chosen.

MAIT.object  A MAIT-class object where significant features have already been found.

trainSamples  Number of samples per class to construct the train dataset.

PCAscale  If method="PCA" and PCAscale is set to TRUE, then the data is scaled following the prcomp function. If it is set to TRUE, scale input is ignored.

PCAcenter  If method="PCA" and PCAscale is set to TRUE, then the data is centered following the prcomp function. If it is set to TRUE, scale input is ignored.

RemoveOnePeakSpectra  If it is set to TRUE, all the one-peak spectra are deleted from the dataSet and the resulting spectralData object will only contain spectra with more than one peak.

tuneSVM  If it is set to TRUE, a tune of parameters is performed before the SVM calculus.

scale  If it is set to TRUE, the data is scaled through the spectral mean value. Set to TRUE by default.

Value

The numerical results of the classification per class and per classifier are saved in a MAIT-class object. Additionally, a table is also included in the output both in the list (field table) and printed as a csv file in the folder (working directory)/Validation. A boxplot is also printed as a png in the same folder showing the differences between classifiers. The confusion matrices of each iteration and classifier are also stored as csv files.

Author(s)

Francesc Fernandez, <francesc.fernandez.albert@upc.edu>

See Also

peakAggregation spectralAnova spectralTStudent spectralSigFeatures

Examples

data(MAIT_sample)
MAIT<-spectralSigFeatures(MAIT,p.adj="fdr",parametric=TRUE)
MAIT <- Validation(Iterations = 20, trainSamples= 15, MAIT.object = MAIT)
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