## Package 'patRoon'

May 28, 2020

```
Title Workflows for Mass-Spectrometry Based Non-Target Analysis
Version 1.0.0
Description Provides an easy-to-use interface to a mass spectrometry based
     non-target analysis workflow. Various (open-source) tools are combined
     which provide algorithms for extraction and grouping of features,
     extraction of MS and MS/MS data, automatic formula and compound annotation
     and grouping related features to components. In addition, various tools are
     provided for e.g. data preparation and cleanup, plotting results and
     automatic reporting.
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URL https://github.com/rickhelmus/patRoon
BugReports https://github.com/rickhelmus/patRoon/issues
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Depends R (\lambda = 3.5.0)
SystemRequirements GNU make
Imports methods,
     checkmate (i = 1.8.5),
     Rcpp,
     VennDiagram,
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     utils,
     parallel,
     grid,
     graphics,
     RColorBrewer,
     data.table,
     withr,
     digest,
```

Type Package

enviPick, XML, DBI, RSQLite, fst, processx, tools, MSnbase, xcms, cluster, fastcluster, gplots, heatmaply,  ${\it dynamic} \\ {\it Tree} \\ {\it Cut},$ dendextend, igraph, vis Network,rJava, rcdk, fingerprint, mzR, circlize, miniUI, plotly, rhandsontable, rstudioapi, htmlwidgets, shiny, templates, CAMERA, RAMClustR, enviPat, nontarget, knitr, rmarkdown, flexdashboard, DT, magrittr, kableExtra, R.utils, magick, glue, ggplot2, ggrepel, cowplot,jsonlite,

 $\begin{array}{c} Rdpack,\\ rsm \end{array}$ 

```
Suggests RDCOMClient,
     metfRag,
     testthat,
     rlang,
     vdiffr,
     patRoonData,
     devtools,
     covr,
     DiagrammeR,
     DiagrammeRsvg,
     rsvg,
     pkgload
{\bf Linking To} \ {\rm Rcpp}
{\bf RdMacros} {\bf Rdpack}
Collate 'generics.R'
     'cache.R'
     'main.R'
     'workflow-step.R'
     'features.R'
     'feature_groups.R'
     'EIC-tool.R'
     'RcppExports.R'
     'utils-adduct.R'
     'adduct.R'
     'components.R'
     'components-camera.R'
     'components-intclust.R'
     'components-nontarget.R'
     'components-ramclustr.R'
     'compounds.R'
     'compounds-cluster.R'
     'formulas.R'
     'mspeaklists.R'
     'compounds-metfrag.R'
     'utils-sirius.R'
     'compounds-sirius.R'
     'convert.R'
     'deprecated.R'
     'utils-IPO.R'
     'doe-optimizer.R'
     'feature_groups-bruker.R'
     'feature_groups-comparison.R'
     'feature_groups-envimass.R'
     'feature_groups-filter.R'
     'feature_groups-openms.R'
     'feature\_groups-optimize.R'
     'feature_groups-optimize-openms.R'
     'feature_groups-optimize-xcms.R'
```

'feature_groups-optimize-xcms3.R'
'feature_groups-screening.R'
'feature_groups-tasq.R'
feature_groups-xcms.R
feature_groups-xcms3.R
'utils-bruker.R'
'features-bruker.R'
'features-envipick.R'
'features-openms.R'
'features-optimize.R'
'features-optimize-envipick.R'
'features-optimize-openms.R'
'features-optimize-xcms.R'
'features-optimize-xcms3.R'
'features-tasq.R'
'features-xcms.R'
features-xcms3.R
'formulas-bruker.R'
'formulas-genform.R'
'formulas-sirius.R'
'mspeaklists-bruker.R'
'utils-mzr.R'
'mspeaklists-mzr.R'
'multi-process.R'
'project-tool.R'
'report.R'
utils-checkmate.R'
utils-compounds.R'
utils-exported.R
utils-formulas.R'
'utils-mol.R'
utils-mspeaklists.R
'utils-optimize.R'
'utils-plot.R'
'utils-xcms.R'
'utils.R'
'zzz.R'

## ${\bf VignetteBuilder} \ {\bf knitr}$

# R topics documented:

patRoon-package																	5
adduct-class																	7
adduct-utils																	8
analysis-information $\cdot$																	9
bruker-utils																	11
${\rm clearCache}\;.\;\ldots\;.\;.$																	14
component-generation																	14

patRoon-package 5

components-class
componentsIntClust-class
componentsNT-class
compound-generation
compounds-class
compounds-cluster
compoundsCluster-class
compoundsMF-class
convertMSFiles
feature-filtering
feature-finding
feature-grouping
feature-optimization
featureGroups-class
featureGroups-compare
featureGroupsComparison-class
features-class
formula-generation
formulas-class
generics
getXCMSSet
GUI-utils
MSPeakLists-class
MSPeakLists-generation
optimizationResult-class
reporting
suspect-screening
verifyDependencies
workflowStep-class
workhowbuch class

patRoon-package

Workflow solutions for mass-spectrometry based non-target analysis.

## Description

Provides an easy-to-use interface to a mass spectrometry based non-target analysis work-flow. Various (open-source) tools are combined which provide algorithms for extraction and grouping of features, extraction of MS and MS/MS data, automatic formula and compound annotation and grouping related features to components. In addition, various tools are provided for e.g. data preparation and cleanup, plotting results and automatic reporting.

## Package options

The following package options (see options) can be set:

6 patRoon-package

• patRoon.cache.mode: A character setting the current caching mode: "save" and "load" will only save/load results to/from the cache, "both" (default) will do both and "none" to completely disable caching. This option can be changed anytime, which might be useful, for instance, to temporarily disable cached results before running a function.

- patRoon.cache.fileName: a character specifying the name of the cache file (default is 'cache.sqlite').
- patRoon.maxProcAmount: The maximum number of processes that should be initiated in parallel. A good starting point is the number of physical cores, which is the default as detected by detectCores.
- patRoon.path.pwiz: The path in which the ProteoWizard binaries are installed. If unset an attempt is made to find this directory from the Windows registry and 'PATH' environment variable.
- patRoon.path.GenForm: The path to the GenForm executable. If not set (the default) the internal GenForm binary is used. Only set if you want to override the executable.
- patRoon.path.MetFragCL: The complete file path to the MetFrag CL 'jar' file that *must* be set when using generateCompoundsMetfrag. Example: "C:/MetFrag2.4.2-CL.jar".
- patRoon.path.MetFragCompTox: The complete file path to the CompTox database 'csv' file. See generateCompounds for more details.
- patRoon.path.MetFragPubChemLite: The complete file path to the PubChem database 'csv' file. See generateCompounds for more details.
- patRoon.path.SIRIUS: The directory in which SIRIUS is installed. Unless the binaries can be located via the 'PATH' environment variable, this *must* be set when using generateFormulasSIRIUS or generateCompoundsSIRIUS. Example: "C:/sirius-win64-3.5.1".
- patRoon.path.OpenMS: The path in which the OpenMS binaries are installed. Usually the location is added to the 'PATH' environment variable when OpenMS is installed, in which case this option can be left empty.
- patRoon.path.pngquant: The path of the pngquant binary that is used when optimizing '.png' plots generated by reportHTML (with optimizePng set to TRUE). If the binary can be located through the 'PATH' environment variable this option can remain empty. Note that some of the functionality of reportHTML only locates the binary through the 'PATH' environment variable, hence, it is recommended to set up 'PATH' instead.
- patRoon.path.obabel: The path in which the OpenBabel binaries are installed. Usually the location is added to the 'PATH' environment variable when OpenBabel is installed, in which case this option can be left empty.

### Author(s)

Maintainer: Rick Helmus < r. helmus@uva.nl> (ORCID)

Other contributors:

- Olaf Brock (ORCID) [contributor]
- Vittorio Albergamo (ORCID) [contributor]
- Andrea Brunner (ORCID) [contributor]
- Emma Schymanski (ORCID) [contributor]

adduct-class 7

#### See Also

Useful links:

- https://github.com/rickhelmus/patRoon
- Report bugs at https://github.com/rickhelmus/patRoon/issues

adduct-class

Generic adduct class

## Description

Objects from this class are used to specify adduct information in an algorithm independent way.

## Usage

```
adduct(...)
## S4 method for signature 'adduct'
show(object)
## S4 method for signature 'adduct'
as.character(x, format = "generic")
```

#### Arguments

x, object

An adduct object.

format

A character that specifies the source format.

"generic" is an internally used generic format that supports full textual conversion. Examples: "[M+H]+", "[2M+H]+", "[M+3H]3+".

"sirius" Is the format used by SIRIUS. It is similar to generic but does not allow multiple charges/molecules. See the SIRIUS manual for more details.

"genform" and "metfrag" support fixed types of adducts which can be obtained with the GenFormAdducts and MetFragAdducts functions, respectively.

01.0

Any of add, sub, molMult and/or charge. See Slots.

## Methods (by generic)

- show: Shows summary information for this object.
- as.character: Converts an adduct object to a specified character format.

8 adduct-utils

#### Slots

```
add, sub A character with one or more formulas to add/subtract.molMult How many times the original molecule is present in this molecule (e.g. for a dimer this would be '2'). Default is '1'.charge The final charge of the adduct (default '1').
```

#### See Also

as.adduct for easy creation of adduct objects and adduct utilities for other adduct functionality.

## Examples

```
adduct("H") # [M+H]+
adduct(sub = "H", charge = -1) # [M-H]-
adduct(add = "K", sub = "H2", charge = -1) # [M+K-H2]+
adduct(add = "H3", charge = 3) # [M+H3]3+
adduct(add = "H", molMult = 2) # [2M+H]+
as.character(adduct("H")) # returns "[M+H]+"
```

adduct-utils

 $Adduct\ utilities$ 

#### Description

Several utility functions to work with adducts.

#### Usage

```
GenFormAdducts()
MetFragAdducts()
as.adduct(x, format = "generic", isPositive = NULL)
calculateIonFormula(formula, adduct)
calculateNeutralFormula(formula, adduct)
```

## Arguments

Х

The object that should be converted. Should be a character string, a numeric MetFrag adduct identifier (adduct\_mode column obtained with MetFragAdducts) or an adduct object (in which case no conversion occurs).

analysis-information 9

format A character that specifies the source format.

"generic" is an internally used generic format that supports full textual

conversion. Examples: "[M+H]+", "[2M+H]+", "[M+3H]3+".

"sirius" Is the format used by SIRIUS. It is similar to generic but does not allow multiple charges/molecules. See the SIRIUS manual for more

details.

"genform" and "metfrag" support fixed types of adducts which can be obtained with the GenFormAdducts and MetFragAdducts functions, respec-

tively.

isPositive A logical that specifies whether the adduct should be positive. Should

only be set when format="metfrag" and x is a numeric identifier.

formula A character vector with formulae to convert.

adduct An adduct object (or something that can be converted to it with as.adduct).

Examples: "[M-H]-", "[M+Na]+".

#### **Details**

GenFormAdducts returns a table with information on adducts supported by GenForm.

MetFragAdducts returns a table with information on adducts supported by MetFrag.

as.adduct Converts an object in to an adduct object.

calculateIonFormula Converts one or more neutral formulae to adduct ions.

calculateNeutralFormula Converts one or more adduct ions to neutral formulae.

#### Examples

```
as.adduct("[M+H]+")
as.adduct("[M+H2]2+")
as.adduct("[2M+H]+")
as.adduct("[M-H]-")
as.adduct("H-H]-")
as.adduct("+H", format = "genform")
as.adduct(1, isPositive = TRUE, format = "metfrag") # MetFrag adduct ID 1 --> returns [M+H]+
calculateIonFormula("C2H4O", "[M+H]+") # C2H5O
calculateNeutralFormula("C2H5O", "[M+H]+") # C2H4O
```

analysis-information Analys

Analysis information

## Description

Required information for analyses that should be processed and utilities to automatically generate this information.

10 analysis-information

#### Usage

```
generateAnalysisInfo(
  paths,
  groups = "",
  blanks = "",
  concs = NULL,
  formats = MSFileFormats()
)
generateAnalysisInfoFromEnviMass(path)
```

#### **Arguments**

paths A character vector containing one or more file paths that should be used

for finding the analyses.

groups, blanks An (optional) character vector containing replicate groups and references,

respectively (will be recycled). If groups is an empty character string ("")

the analysis name will be set as replicate group.

concs An optional numeric vector containing concentration values for each anal-

ysis. Can be NA if unknown. If the length of concs is less than the number of analyses the remainders will be set to NA. Set to NULL to not include

concentration data.

formats A character vector of analyses file types. Valid values are: Bruker, mzXML

and  $\mathsf{mzML}.$ 

path The path of the enviMass project.

### Details

Several properties need to be known about analyses that should be processed during various workflow steps such as finding features, averaging intensities of feature groups and blank subtraction. This information should be made available with an 'analysis info' object, which is a data.frame containing the following columns:

- path the full path to the analysis.
- analysis the filename without extension. Must be unique, even if the path is different.
- group name of *replicate group*. A replicate group is used to group analyses together that are replicates of each other. Thus, the group column for all analyses considered to be belonging to the same replicate group should have an equal (but unique) value. Used for *e.g.* avaraging and filter.
- blank: all analyses within this replicate group are used by filter for blank subtraction. Multiple entries can be entered by separation with a comma.
- conc a numeric value specifying the 'concentration' of the analysis. This can be actually any kind of quantitative value such as exposure time, dilution factor or anything else which may be used to form a linear relationship.

bruker-utils 11

Most functionality requires the data files to be in either the '.mzXML' or '.mzML' format. Functionality that utilizes Bruker DataAnalysis (e.g. findFeaturesBruker) may only work with data files in the proprietary '.d' format. Therefore, when tools with varying requirements are mixed (a common scenario), the data files also need to be present in the required formats. To deal with this situation the data files with varying formats should all be placed in the same path that was used to specify the location of the analysis.

Whether analysis data files are present in multiple formats or not, each analysis should only be entered *once*. The analysis column is used as a basename to automatically find back the data file with the required format, hence, analysis names should be specified as the file name without its file extension.

The group column is *mandatory* and needs to be filled in for each analysis. The blank column should also be present, however, these may contain empty character strings ("") for analyses where no blank subtraction should occur. The conc column is only required when obtaining regression information is desired with the as.data.table method.

generateAnalysisInfo is an utility function that automatically generates an analysis information object. It will collect all datafiles from given file paths and convert the filenames into valid analysis names (*i.e.* without extensions such as '.d' and '.mzML'). Duplicate analyses, which may appear when datafiles with different file extension ('.d', '.mzXML' and/or '.mzML') are present, will be automatically removed.

generateAnalysisInfoFromEnviMass loads analysis information from an enviMass project. Note: this funtionality has only been tested with older versions of enviMass.

bruker-utils

Bruker DataAnalysis utilities

## Description

Miscellaneous utility functions which interface with Bruker DataAnalysis

#### Usage

```
showDataAnalysis()
setDAMethod(anaInfo, method, close = TRUE)
revertDAAnalyses(anaInfo, close = TRUE, save = close)
recalibrarateDAFiles(anaInfo, close = TRUE, save = close)
getDACalibrationError(anaInfo)
addDAEIC(
    analysis,
    path,
    mz,
    mzWindow = 0.005,
```

12 bruker-utils

```
ctype = "EIC",
 mtype = "MS",
  polarity = "both",
  bgsubtr = FALSE,
  fragpath = "",
  name = NULL,
  hideDA = TRUE,
  close = FALSE,
  save = close
)
addAllDAEICs(
  fGroups,
 mzWindow = 0.005,
  ctype = "EIC",
  bgsubtr = FALSE,
  name = TRUE,
  onlyPresent = TRUE,
  hideDA = TRUE,
  close = FALSE,
  save = close
)
```

#### Arguments

anaInfo Analysis info table

method The full path of the DataAnalysis method.

close, save If TRUE then Bruker files are closed and saved after processing with Data-

Analysis, respectively. Setting close=TRUE prevents that many analyses might be opened simultaneously in DataAnalysis, which otherwise may use excessive memory or become slow. By default save is TRUE when close is TRUE, which is likely what you want as otherwise any processed

data is lost.

analysis Analysis name (without file extension).

path path of the analysis.

mz m/z (Da) value used for the chromatographic trace (if applicable).

mzWindow m/z window (in Da) used for the chromatographic trace (if applicable).

ctype Type of the chromatographic trace. Valid options are: "EIC" (extracted

ion chromatogram), "TIC" (total ion chromatogram, only for addDAEIC)

and "BPC" (Base Peak Chromatogram).

mtype MS filter for chromatographic trace. Valid values are: "all", "MS",

"MSMS", "allMSMS" and "BBCID".

polarity Polarity filter for chromatographic trace. Valid values: "both", "positive"

and "negative".

bgsubtr If TRUE then background subtraction ('Spectral' algorithm) will be per-

formed.

bruker-utils 13

fragpath Precursor m/z used for MS/MS traces ("" for none).

name For addDAEIC: the name for the chromatographic trace. For addAllEICs:

TRUE to automatically set EIC names. Set to NULL for none.

hideDA Hides DataAnalysis while adding the chromatographic trace (faster).

fGroups The featureGroups object for which EICs should be made.

onlyPresent If TRUE then EICs are only generated for analyses where the feature was

detected.

#### **Details**

These functions communicate directly with Bruker DataAnalysis to provide various functionality, such as calibrating and exporting data and adding chromatographic traces. For this the **RDCOMClient** package is required to be installed.

showDataAnalysis makes a hidden DataAnalysis window visible again. Most functions using DataAnalysis will hide the window during processing for efficiency reasons. If the window remains hidden (e.g. because there was an error) this function can be used to make it visible again. This function can also be used to start DataAnalysis if it is not running yet.

setDAMethod Sets a given DataAnalysis method ('.m' file) to a set of analyses. **NOTE**: as a workaround for a bug in DataAnalysis, this function will save(!), close and re-open any analyses that are already open prior to setting the new method. The close argument only controls whether the file should be closed after setting the method (files are always saved).

revertDAAnalyses Reverts a given set of analyses to their unprocessed raw state.

recalibrarateDAFiles Performs automatic mass recalibration of a given set of analyses. The current method settings for each analyses will be used.

getDACalibrationError is used to obtain the standard deviation of the current mass calibration (in ppm).

addDAEIC adds an Extracted Ion Chromatogram (EIC) or other chromatographic trace to a given analysis which can be used directly with DataAnalysis.

addAllDAEICs adds Extracted Ion Chromatograms (EICs) for all features within a featureGroups object.

#### Value

getDACalibrationError returns a data.frame with a column of all analyses (named analysis) and their mass error (named error).

## See Also

analysis-information

clearCache

Clearing of cached data

## Description

Remove (part of) the cache database used to store (intermediate) processing results.

## Usage

```
clearCache(what = NULL, file = NULL)
```

## Arguments

what

This argument describes what should be done. When what = NULL this function will list which tables are present along with an indication of their size (database rows). If what = "all" then the complete file will be removed. Otherwise, what should be a character string (a regular expression) that is used to match the table names that should be removed.

file

The cache file. If NULL then the value of the patRoom.cache.fileName

option is used.

#### Details

This function will either remove one or more tables within the cache sqlite database or simply wipe the whole cache file. Removing tables will VACUUM the database, which may take some time for large cache files.

component-generation

Grouping feature groups in components

#### Description

Functionality to automatically group related feature groups (e.g. isotopes, adducts and homologues) to assist and simplify compound annotation.

#### Usage

```
## S4 method for signature 'featureGroups'
generateComponents(fGroups, algorithm, ...)

generateComponentsCAMERA(
   fGroups,
   ionization,
   onlyIsotopes = FALSE,
   minSize = 2,
   relMinReplicates = 0.5,
```

15

```
extraOpts = NULL
   )
   generateComponentsIntClust(
     fGroups,
     method = "complete",
     metric = "euclidean",
     normFunc = max,
     average = TRUE,
     maxTreeHeight = 1,
     deepSplit = TRUE,
     minModuleSize = 1
   )
   generateComponentsNontarget(
     fGroups,
     ionization,
     rtRange = c(-120, 120),
     mzRange = c(5, 120),
     elements = c("C", "H", "O"),
     rtDev = 30,
     absMzDev = 0.002,
     extraOpts = NULL,
     traceHack = all(R.Version()[c("major", "minor")] >= c(3, 4))
   )
   generateComponentsRAMClustR(
     fGroups,
     st = NULL,
     sr = NULL,
     maxt = 12,
     hmax = 0.3,
     normalize = "TIC",
     ionization,
     absMzDev = 0.002,
     relMzDev = 5,
     minSize = 2,
     relMinReplicates = 0.5,
     RCExperimentVals = list(design = list(platform = "LC-MS"), instrument =
       list(ionization = ionization, MSlevs = 1)),
     extraOptsRC = NULL,
     extraOptsFM = NULL
   )
Arguments
   fGroups
                    featureGroups object for which components should be generated.
                    A character string describing the algorithm that should be used: "ramclustr",
   algorithm
                    "camera", "nontarget", "intclust"
```

... Any parameters to be passed to the selected component generation algo-

rithm.

ionization Which ionization polarity was used to generate the data: should be

"positive" or "negative".

onlyIsotopes Logical value. If TRUE only isotopes are considered when generating com-

ponents (faster). Corresponds to quick argument of CAMERA::annotate.

minSize The minimum size of a component. Smaller components than this size

will be removed. For RAMClustR: sets the minModuleSize argument to

ramclustR. See note below.

relMinReplicates

Feature groups within a component are only kept when they contain data for at least this (relative) amount of replicate analyses. For instance, '0.5' means that at least half of the replicates should contain data for a particular feature group in a component. In this calculation replicates that are fully absent within a component are not taken in to account. See

note below.

extraOpts Named character vector with extra arguments directly passed to homol.search

(generateComponentsNontarget) or CAMERA::annotate (generateComponentsCAMERA).

Set to NULL to ignore.

method Clustering method that should be applied (passed to hclust).

metric Distance metric used to calculate the distance matrix (passed to daisy).

normFunc Function that should be used for normalization of data. Intensitity values

of a feature group will be divided by the result of this function when it is called with all intensity values of that feature group. For example, when

max is used normalized intensities will be between zero and one.

average If TRUE then all intensitity data will be averaged for each replicate group.

maxTreeHeight, deepSplit, minModuleSize

Arguments used by cutreeDynamicTree.

rtRange A numeric vector containing the minimum and maximum retention time

(in seconds) between homologues. Series are always considered from low to high m/z, thus, a negative minimum retention time allows detection of homologous series with increasing m/z and decreasing retention times.

These values set the minrt and maxrt arguments of homol.search.

mzRange A numeric vector specifying the minimum and maximum m/z incre-

ment of a homologous series. Sets the minmz and maxmz arguments of homol.search.

elements A character vector with elements to be considered for detection of repeat-

ing units. Sets the elements argument of homol.search function.

rtDev, absMzDev, relMzDev

Maximum deviation for retention time or absolute/relative m/z.

For generateComponentsRAMClustR:  $\operatorname{Sets}$  the mzabs.error and ppm.error

arguments to do.findmain.

For generateComponentsNontarget: Sets the rttol and mztol arguments

of homol.search.

traceHack

Currently homol.search does not work with R '>3.3.3'. This flag, which is enabled by default on these R versions, implements a (messy) workaround (more details here).

st, sr, maxt, hmax, normalize

Arguments to tune the behaviour of feature group clustering. See their documentation from ramclustR. When st is NULL it will be automatically calculated as the half of the median for all chromatographic peak widths.

**RCExperimentVals** 

A named list containing two more lists: design and instrument. These are used to construct the ExpDes argument passed to ramclustR.

extraOptsRC, extraOptsFM

Named list with further arguments to be passed to ramclustR and do.findmain. Set to NULL to ignore.

#### **Details**

Several algorithms are provided to group feature groups that are related in some (chemical) way to each other. These components generally include adducts, isotopes, in-source fragments and homologues. The linking of this data is generally useful to provide more information for compound annotation and reduce the data size and thus complexity.

generateComponents is a generic function that will generate components using one of the supported algorithms. The actual functionality is provided by algorithm specific functions such as generateComponentsRAMClustR and generateComponentsNontarget. While these functions may be called directly, generateComponents provides a generic interface and is therefore usually preferred.

generateComponentsCAMERA provides an interface to CAMERA which is used to generate components from known adducts, isotopes and in-source fragments. The specified featureGroups object is automatically converted to an xcmsSet object using getXCMSSet.

generateComponentsIntClust generates components based on intensity profiles of feature groups. Hierarchical clustering is performed on normalized (and optionally replicate averaged) intensity data and the resulting dendrogram is automatically cut with cutreeDynamicTree. The distance matrix is calculated with daisy and clustering is performed with hclust. The clustering of the resulting components can be further visualized and modified using the methods defined for componentsIntClust.

generateComponentsNontarget uses the nontarget R package to generate components by unsupervised detection of homologous series. In the first step the homol.search function is used to detect all homologues within each replicate group (analyses within each replicate group are averaged prior to detection). Then, homologous series across replicate groups are merged in case of full overlap or when merging of partial overlapping series causes no conflicts.

generateComponentsRAMClustR uses RAMClustR to generate components from feature groups which follow similar chromatographic retention profiles, but are not necessarily restricted to known rules (e.g. adducts or isotopes). This method uses the ramclustR functions for generating the components, whereas do.findmain is used for annotation.

## Value

A components (derived) object containing all generated components.

#### Note

For generateComponentsCAMERA and generateComponentsRAMClustR: the minSize and relMinReplicates arguments provide additional filtering functionality not provided by **CAMERA** or **RAM-ClustR** (except minSize). Note that these filters are enabled by default, hence, final results may be different than what CAMERA/RAMClustR normally would return.

#### References

Kuhl, C., Tautenhahn, R., Boettcher, C., Larson, T. R. and Neumann, S. CAMERA: an integrated strategy for compound spectra extraction and annotation of liquid chromatography/mass spectrometry data sets. Analytical Chemistry, 84:283-289 (2012)

Martin Loos (2016). nontarget: Detecting Isotope, Adduct and Homologue Relations in LC-MS Data. R package version 1.9. https://CRAN.R-project.org/package=nontarget

Loos, M., Gerber, C., Corona, F., Hollender, J., Singer, H. (2015). Accelerated isotope fine structure calculation using pruned transition trees, Analytical Chemistry 87(11), 5738-5744.

Broeckling, Heuberger CD, Prince AL, Ingelsson JA, Prenni E, E. J (2013). "Assigning precursor-product ion relationships in indiscriminant MS/MS data from non-targeted metabolite profiling studies." *Analytical Chemistry*, **9**, 33-43.

Broeckling CD, Afsar FA, Neumann S, Ben-Hur A, Prenni JE (2014). "RAMClust: A Novel Feature Clustering Method Enables Spectral-Matching-Based Annotation for Metabolomics Data." *Analytical Chemistry*, **86** (14), 6812–6817.

components-class

Component class

#### Description

Contains data for feature groups that are related in some way. These *components* commonly include adducts, isotopes and homologues.

## Usage

```
## S4 method for signature 'components'
componentTable(obj)

## S4 method for signature 'components'
componentInfo(obj)

## S4 method for signature 'components'
groupNames(obj)

## S4 method for signature 'components'
length(x)
```

```
## S4 method for signature 'components'
names(x)
## S4 method for signature 'components'
show(object)
## S4 method for signature 'components, ANY, ANY, missing'
x[i, j, ..., drop = TRUE]
## S4 method for signature 'components, ANY, ANY'
x[[i, j]]
## S4 method for signature 'components'
x$name
## S4 method for signature 'components'
as.data.table(x)
## S4 method for signature 'components'
filter(
  obj,
  size = NULL,
  adducts = NULL,
  isotopes = NULL,
  rtIncrement = NULL,
 mzIncrement = NULL,
 negate = FALSE
)
## S4 method for signature 'components'
findFGroup(obj, fGroup)
## S4 method for signature 'components'
plotSpec(
 obj,
  index,
 markFGroup = NULL,
  useGGPlot2 = FALSE,
 xlim = NULL,
 ylim = NULL,
## S4 method for signature 'components'
plotEIC(obj, index, fGroups, rtWindow = 5, ...)
## S4 method for signature 'components'
```

```
consensus(obj, ...)
```

#### Arguments

obj, object, x The component object.

i, j A numeric or character value which is used to select components/feature

groups by their index or name, respectively (for the order/names see

names()/groupNames()).

For [: Can also be logical to perform logical selection (similar to regular vectors). If missing all components/feature groups are selected.

For [[: should be a scalar value. j is optional.

.. For ploteic: Further (optional) arguments passed to the ploteic method

for the featureGroups class. Note that the colourBy, showPeakArea, showFGroupRect and topMost arguments cannot be set as these are set

by this method.

For plotSpec: Further arguments passed to plot.

For consensus: components objects that should be used to generate the

consensus.

drop ignored.

name The component name (partially matched).

size Should be a two sized vector with the minimum/maximum size of a com-

ponent. Set to NULL to ignore.

adducts Remove any feature groups within components that do not match given

adduct rules. If adducts is a logical then only results are kept when an adduct is assigned (adducts=TRUE) or not assigned (adducts=FALSE). Otherwise, if adducts contains one or more adduct objects (or something that can be converted to it with <code>as.adduct</code>) then only results are kept

that match the given adducts. Set to NULL to ignore this filter.

isotopes Only keep results that match a given isotope rule. If isotopes is a logical

then only results are kept with (isotopes=TRUE) or without (isotopes=FALSE) isotope assignment. Otherwise isotopes should be a numeric vector with isotope identifiers to keep (e.g. '0' for monoisotopic results, '1' for 'M+1'

results etc.). Set to NULL to ignore this filter.

rtIncrement, mzIncrement

Should be a two sized vector with the minimum/maximum retention or

mz increment of a homologous series. Set to NULL to ignore.

negate If TRUE then filters are applied in opposite manner.

fGroup The name (thus a character) of the feature group that should be searched

for.

index The index of the component. Can be a numeric index or a character with

its name.

markFGroup If specified (i.e. not NULL) this argument can be used to mark a feature

group in the plotted spectrum. The value should be a character with the name of the feature group. Setting this to NULL will not mark any peak.

useGGPlot2	If TRUE then <b>ggplot2</b> is used for plotting, otherwise base plot used. For plotSpec, ggplot2 allows nicely repelled text for annotation. However, base plot is generally faster.
xlim, ylim	Sets the plot size limits used by <b>plot</b> . Set to NULL for automatic plot sizing.
fGroups	The featureGroups object that was used to generate the components.
rtWindow	Retention window: see the plotEIC method for the featureGroups class.

#### **Details**

components objects are obtained from component generators.

#### Value

The subset operator ("[") and filter method return the data subset in an object from the componentsReduced class. This object does not contain any algorithm specific data and as such, algorithm specific methods (e.g. treeCut) will not work on this object. The reason for this is that it is often very difficult or impossible to subset the algorithmic data.

consensus returns a components object that is produced by merging multiple specified components objects.

## Methods (by generic)

- componentTable: Accessor method for the components slot of a components class. Each component is stored as a data.table.
- componentInfo: Accessor method for the componentInfo slot of a components class.
- groupNames: returns a character vector with the names of the feature groups for which data is present in this object.
- length: Obtain total number of components.
- names: Obtain the names of all components.
- show: Show summary information for this object.
- [: Subset on components/feature groups.
- [[: Extracts a component table, optionally filtered by a feature group.
- \$: Extracts a component table by component name.
- as.data.table: Returns all component data in a table.
- filter: Provides rule based filtering for components.
- findfGroup: Returns the component id(s) to which a feature group belongs.
- plotSpec: Plot a pseudo mass spectrum for a single component.
- plotEIC: Plot an extracted ion chromatogram (EIC) for all feature groups within a single component.
- consensus: Generates a consensus from multiple components objects. At this point results are simply combined and no attempt is made to merge similar components.

## Slots

components List of all components in this object. Use the componentTable method for access.

componentInfo A data.table containing general information for each component. Use the componentInfo method for access.

#### S4 class hierarchy

- workflowStep
  - components
    - \* componentsReduced
    - \* componentsCamera
    - \* componentsIntClust
    - \* componentsNT
    - \* componentsRC

#### Note

filter Applies only those filters for which a component has data available. For instance, filtering by adduct will only filter any results within a component if that component contains adduct information.

#### See Also

component-generation, componentsNT and componentsIntClust

#### componentsIntClust-class

Components based on clustered intensity profiles.

## Description

This class is derived from components and is used to store hierarchical clustering information from intensity profiles of feature groups.

#### Usage

```
## S4 method for signature 'componentsIntClust'
clusters(obj)
## S4 method for signature 'componentsIntClust'
cutClusters(obj)
## S4 method for signature 'componentsIntClust'
clusterProperties(obj)
```

```
## S4 method for signature 'componentsIntClust'
   treeCut(obj, k = NULL, h = NULL)
    ## S4 method for signature 'componentsIntClust'
    treeCutDynamic(obj, maxTreeHeight, deepSplit, minModuleSize)
   ## S4 method for signature 'componentsIntClust'
   plotHeatMap(
     obj,
     interactive = FALSE,
     col = NULL,
     margins = c(6, 2),
     cexCol = 1,
   )
   ## S4 method for signature 'componentsIntClust'
   plotInt(obj, index, pch = 20, type = "b", lty = 3, col = NULL, ...)
   ## S4 method for signature 'componentsIntClust,ANY'
   plot(
     Х,
     pal = "Paired",
     numericLabels = TRUE,
     colourBranches = length(x) < 50,
     showLegend = length(x) < 20,
   )
   ## S4 method for signature 'componentsIntClust'
   plotSilhouettes(obj, kSeq, pch = 16, type = "b", ...)
Arguments
   k, h
                    Desired number of clusters or tree height to be used for cutting the den-
                    drogram, respectively. One or the other must be specified. Analogous to
                    cutree.
   maxTreeHeight, deepSplit, minModuleSize
                    Arguments used by cutreeDynamicTree.
                    If TRUE an interactive heatmap will be drawn (with heatmaply).
    interactive
                    The colour used for plotting. Set to NULL for automatic colours.
    col
   margins, cexCol
                    Passed to heatmap.2
                    Further options passed to heatmap.2 / heatmaply (plotHeatMap), plot.dendrogram
    . . .
                    (plot) or plot (plotInt).
                    Numeric component/cluster index.
    index
                    Passed to plot.
   pch, type
```

lty Passed to lines.

x, obj A componentsIntClust object.

pal Colour palette to be used from **RColorBrewer**.

numericLabels Set to TRUE to label with numeric indices instead of (long) feature group

names.

colourBranches Whether branches from cut clusters (and their labels) should be coloured.

Might be slow with large numbers of clusters, hence, the default is only

TRUE when this is not the case.

showLegend If TRUE and colourBranches is also TRUE then a legend will be shown

which outlines cluster numbers and their colours. By default TRUE for

small amount of clusters to avoid overflowing the plot.

kSeq An integer vector containing the sequence that should be used for average

silhouette width calculation.

#### **Details**

Objects from this class are generated by generateComponentsIntClust

#### Value

plotHeatMap returns the same as heatmap. 2 or heatmaply.

## Methods (by generic)

- clusters: Accessor method to the clust slot, which was generated by hclust.
- cutClusters: Accessor method to the cutClusters slot. Returns a vector with cluster membership for each candidate (format as cutree).
- clusterProperties: Returns a list with properties on how the clustering was performed.
- treeCut: Manually (re-)cut the dendrogram.
- treeCutDynamic: Automatically (re-)cut the dendrogram using the cutreeDynamicTree function from dynamicTreeCut.
- plotHeatMap: draws a heatmap using the heatmap.2 or heatmaply function.
- plotInt: makes a plot for all (normalized) intensity profiles of the feature groups within a given cluster.
- plot: generates a dendrogram from a given cluster object and optionally highlights resulting branches when the cluster is cut.
- plotSilhouettes: Plots the average silhouette width when the clusters are cut by a sequence of k numbers. The k value with the highest value (marked in the plot) may be considered as the optimal number of clusters.

25

#### Slots

clusterm Numeric matrix with normalized feature group intensities that was used for clustering.
distm Distance matrix that was used for clustering (obtained with daisy).

clust Object returned by hclust.

cutClusters A list with assigned clusters (same format as what cutree returns).

gInfo The groupInfo of the feature groups object that was used.

properties A list containing general properties and parameters used for clustering.

#### Note

The intensity values for components (used by plotSpec) are set to a dummy value (1) as no single intensity value exists for this kind of components.

#### References

Schollee JE, Bourgin M, von Gunten U, McArdell CS, Hollender J (2018). "Non-target screening to trace ozonation transformation products in a wastewater treatment train including different post-treatments." Water Research, 142, 267–278. doi: 10.1016/j.watres.2018.05.045.

#### See Also

components and component-generation

componentsNT-class

Components class for homologous series.

## Description

This class is derived from components and is used to store results from unsupervised homolog detection with the **nontarget** package.

## Usage

```
## S4 method for signature 'componentsNT'
plotGraph(obj, onlyLinked = TRUE)
```

#### Arguments

obj The componentsRC object to plot.

onlyLinked If TRUE then only series with links are plotted.

#### Details

Objects from this class are generated by generateComponentsNontarget

#### Value

plotGraph returns the result of visNetwork.

#### Methods (by generic)

• plotGraph: Plots an interactive network graph for linked homologous series (*i.e.* series with (partial) overlap which could not be merged). The resulting graph can be browsed interactively and allows quick inspection of series which may be related. The graph is constructed with the **igraph** package and rendered with **visNetwork**.

#### References

Martin Loos (2016). nontarget: Detecting Isotope, Adduct and Homologue Relations in LC-MS Data. R package version 1.9. https://CRAN.R-project.org/package=nontarget

Loos, M., Gerber, C., Corona, F., Hollender, J., Singer, H. (2015). Accelerated isotope fine structure calculation using pruned transition trees, Analytical Chemistry 87(11), 5738-5744.

Csardi G, Nepusz T: The igraph software package for complex network research, InterJournal, Complex Systems 1695. 2006. http://igraph.org

Almende B.V., Benoit Thieurmel and Titouan Robert (2019). visNetwork: Network Visualization using 'vis.js' Library. R package version 2.0.9. https://CRAN.R-project.org/package=visNetwork

## See Also

components and component-generation

compound-generation

Automatic compound identification

#### Description

Functionality to automatically identify chemical compounds from feature groups.

#### Usage

```
## S4 method for signature 'featureGroups'
generateCompounds(fGroups, MSPeakLists, algorithm, ...)

generateCompoundsMetfrag(
   fGroups,
   MSPeakLists,
   method = "CL",
   logPath = file.path("log", "metfrag"),
   timeout = 300,
   timeoutRetries = 2,
```

```
errorRetries = 2,
  topMost = 100,
  dbRelMzDev = 5,
  fragRelMzDev = 5,
  fragAbsMzDev = 0.002,
  adduct,
  database = "pubchem",
  extendedPubChem = "auto",
  chemSpiderToken = "",
  scoreTypes = compoundScorings("metfrag", database, onlyDefault = TRUE)$name,
  scoreWeights = 1,
  preProcessingFilters = c("UnconnectedCompoundFilter", "IsotopeFilter"),
  postProcessingFilters = c("InChIKeyFilter"),
 maxCandidatesToStop = 2500,
  identifiers = NULL,
  extraOpts = NULL,
 maxProcAmount = getOption("patRoon.maxProcAmount")
)
generateCompoundsSIRIUS(
  fGroups,
 MSPeakLists,
  relMzDev = 5,
  adduct = "[M+H]+",
 elements = "CHNOP",
 profile = "qtof",
  formulaDatabase = NULL,
  fingerIDDatabase = "pubchem",
  noise = NULL,
  errorRetries = 2,
  cores = NULL,
  topMost = 100,
  topMostFormulas = 5,
  extraOptsGeneral = NULL,
  extraOptsFormula = NULL,
  verbose = TRUE,
  SIRBatchSize = 0,
 logPath = file.path("log", "sirius_compounds"),
 maxProcAmount = getOption("patRoon.maxProcAmount")
)
compoundScorings(
  algorithm = NULL,
 database = NULL,
  includeSuspectLists = TRUE,
  onlyDefault = FALSE,
  includeNoDB = TRUE
)
```

#### Arguments

**fGroups** featureGroups object for which compounds should be identified. This

> should be the same or a subset of the object that was used to create the specified MSPeakLists. In the case of a subset only the remaining feature

groups in the subset are considered.

MSPeakLists A MSPeakLists object that was generated for the supplied fGroups.

algorithm A character string describing the algorithm that should be used: "metfrag",

"sirius"

Any parameters to be passed to the selected compound generation algo-

rithm.

method Which method should be used for MetFrag execution: "CL" for MetFragCL

and "R" for MetFragR. The former might be faster.

logPath Destination directory for log files with output from executed commands.

Will be created if non-existant. Set to NULL to disable logging.

timeout Maximum time (in seconds) before a metFrag query for a feature group

is stopped. Also see timeoutRetries argument.

timeoutRetries Maximum number of retries after reaching a timeout before completely

skipping the metFrag query for a feature group. Also see timeout argu-

ment.

errorRetries Maximum number of retries after an error occurred. This may be useful

to handle e.g. connection errors.

topMost Only keep this number of candidates (per feature group) with highest

> score. Set to NULL to always keep all candidates, however, please note that this may result in significant usage of CPU/RAM resources for large

numbers of candidates.

dbRelMzDev Relative mass deviation (in ppm) for database search. Sets the 'DatabaseSearchRelativeMassDev

option.

fragRelMzDev Relative mass deviation (in ppm) for fragment matching. Sets the 'FragmentPeakMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatchRelativeMatch

Absolute mass deviation (in Da) for fragment matching. Sets the 'FragmentPeakMatchAbsoluteMas

option.

option.

adduct An adduct object (or something that can be converted to it with as.adduct).

Examples: "[M-H]-", "[M+Na]+".

Compound database to use. Valid values are: "pubchem", "chemspider", database

> "for-ident", "comptox", "pubchemlite", "kegg", "sdf", "psv" and "csv". See section below for more information. Sets the MetFragDatabaseType

option.

extendedPubChem

fragAbsMzDev

If database="pubchem": whether to use the extended database that includes information for compound scoring (i.e. number of patents/PubMed references). Note that downloading candidates from this database might take extra time. Valid values are: FALSE (never use it), TRUE (always use

it) or "auto" (default, use if specified scorings demand it).

#### chemSpiderToken

A character string with the ChemSpider security token that should be set when the ChemSpider database is used. Sets the 'ChemSpiderToken' option.

scoreTypes

A character vector defining the scoring types. See the Scorings section below for more information. Note that both generic and MetFrag specific names are accepted (*i.e.* name and metfrag columns returned by compoundScorings). When a local database is used, the name should match what is given there (e.g column names when database=csv). Note that MetFrag may still report other scoring data, however, these are not used for ranking. Sets the 'MetFragScoreTypes' option.

scoreWeights

Numeric vector containing weights of the used scoring types. Order is the same as set in scoreTypes. Values are recycled if necessary. Sets the 'MetFragScoreWeights' option.

preProcessingFilters, postProcessingFilters

A character vector defining pre/post filters applied before/after fragmentation and scoring (e.g. "UnconnectedCompoundFilter", "IsotopeFilter", "ElementExclusionFilter"). Some methods require further options to be set. For all filters and more information refer to the Candidate

Filters section on the MetFragR homepage. Sets the 'MetFragPreProcessingCandidateFilter' and MetFragPostProcessingCandidateFilter options.

#### maxCandidatesToStop

If more than this number of candidate structures are found then processing will be aborted and no results this feature group will be reported. Low values increase the chance of missing data, whereas too high values will use too much computer resources and significantly slowdown the process. Sets the 'MaxCandidateLimitToStop' option.

identifiers

A list containing for each feature group a character vector with database identifiers that should be used to find candidates for a feature group (the list should be named by feature group names). If NULL all relevant candidates will be retrieved from the specified database. An example usage scenario is to obtain the list of candidate identifiers from a compounds object obtained with <code>generateCompoundsSIRIUS</code> using the <code>identifiers</code> method. This way, only those candidates will be searched by MetFrag that were generated by SIRIUS+CSI:FingerID. Sets the 'PrecursorCompoundIDs' option.

extraOpts

For MetFrag: A named list containing further settings to be passed to run.metfrag. See the MetFragR and MetFrag CL homepages for all available options.

For SIRIUS: a character vector with any extra commandline parameters for formula prediction. See the SIRIUS manual for more details.

Set to NULL to ignore.

maxProcAmount

Maximum number of processes to run for parallelization. Usually a number close to the amount of physical cores yields most efficient results.

relMzDev

Maximum relative deviation between the measured and candidate formula m/z values (in ppm). Sets the '--ppm-max' commandline option.

elements

Elements to be considered for formulae calculation. This will heavily affects the number of candidates! Always try to work with a minimal set by excluding elements you don't expect. The minimum/maximum number of elements can also be specified, for example: a value of "C[5]H[10-15]0" will only consider formulae with up to five carbon atoms, between ten and fifteen hydrogen atoms and any amount of oxygen atoms. Sets the '--elements' commandline option.

profile

Name of the configuration profile, for example: "qtof", "orbitrap", "fticr". Sets the '--profile' commandline option.

#### formulaDatabase

If not NULL, use a database for retrieval of formula candidates. Possible values are: "pubchem", '"bio", '"kegg", '"hmdb". Sets the '--database' commandline option.

#### fingerIDDatabase

Database specifically used for CSI:FingerID. If NULL, the value of the formulaDatabase parameter will be used or "pubchem" when that is also NULL. Sets the '--fingerid-db' option.

noise

Median intensity of the noise (NULL ignores this parameter). Sets the '--noise' commandline option.

cores

The number of cores SIRIUS will use. If NULL then the default of all cores will be used.

#### topMostFormulas

Do not return more than this number of candidate formulae. Note that only compounds for these formulae will be searched. Sets the '--candidates' commandline option.

## extraOptsGeneral, extraOptsFormula

a character vector with any extra commandline parameters for SIRIUS. For SIRIUS versions <4.4 there is no distinction between general and formula options. Otherwise commandline options specified in extraOptsGeneral are added prior to the formula command, while options specified in extraOptsFormula are added in afterwards. See the SIRIUS manual for more details. Set to NULL to ignore.

verbose

If TRUE then more output is shown in the terminal.

SIRBatchSize

The maximum number of calculations done by SIRIUS. If this number is less than the amount of features to be calculated then calculations will be evenly split over multiple SIRIUS calls (which may be run in parallel if maxProcAmount>1). If SIRBatchSize=0 then all feature calculations are performed from a single SIRIUS exection, which is often the fastest.

### includeSuspectLists, onlyDefault, includeNoDB

A logical specifying whether scoring terms releated to suspect lists, default scoring terms and non-database specific scoring terms should be included in the output, respectively.

#### Details

Several algorithms are provided to automatically identify compounds for given feature groups. To this end, each measured masses for all feature groups are searched within

online database(s) (e.g. PubChem) to retrieve a list of potential candidate chemical compounds. Depending on the algorithm and its parameters, further scoring of candidates is then performed using, for instance, matching of measured and theoretical isotopic patterns, presence within other data sources such as patent databases and similarity of measured and in-silico predicted MS/MS fragments. Note that this process is often quite time consuming, especially for large feature group sets. Therefore, this is often one of the last steps within the workflow and not performed before feature groups have been prioritized.

generateCompounds is a generic function that will generate compounds using one of the supported algorithms. The actual functionality is provided by algorithm specific functions such as generateCompoundsMetfrag and generateCompoundsSIRIUS. While these functions may be called directly, generateCompounds provides a generic interface and is therefore usually preferred.

generateCompoundsMetfrag uses the metfRag package or MetFrag CL for compound identification (see http://ipb-halle.github.io/MetFrag/). Several online compound databases such as PubChem and ChemSpider may be chosen for retrieval of candidate structures. In addition, many options exist to score and filter resulting data, and it is highly suggested to optimize these to improve results. While MS/MS data is not mandatory, it will usually greatly improve candidate scoring. The MetFrag options PeakList, IonizedPrecursorMass and ExperimentalRetentionTimeValue (in minutes) fields are automatically set from feature data.

generateCompoundsSIRIUS uses SIRIUS in combination with CSI:FingerID for compound identification. Similar to generateFormulasSIRIUS, candidate formulae are generated with SIRIUS. These results are then feed to CSI:FingerID to acquire candidate structures. This method requires the availability of MS/MS data, and feature groups without it will be ignored.

compoundScorings displays an overview of scorings may be applied to rank candidate compounds (see Scorings section below).

## Value

generateCompoundsMetFrag returns a compoundsMF object.

generateCompoundsSIRIUS returns a compounds object.

compoundScorings returns a data.frame with information on which scoring terms are used, what their algorithm specific name is and other information such as to which database they apply and short remarks.

#### **Scorings**

Each algorithm implements their own scoring system. Their names have been simplified and harmonized where possible and are used for reporting and in the case MetFrag is used to specify how compounds should be scored (scoreTypes argument). The compoundScorings function can be used to get an overview of both the algorithm specific and generic scoring names. For instance, the table below shows all scorings for MetFrag: (some columns are omitted)

name metfrag score Score database

fragScore	FragmenterScore	
metFusionScore	OfflineMetFusionScore	
individual MoNAS core	OfflineIndividualMoNAScore	
numberPatents	PubChemNumberPatents	pubchem
numberPatents	Patent_Count	pubchemli
pubMedReferences	PubChemNumberPubMedReferences	pubchem
pubMedReferences	ChemSpiderNumberPubMedReferences	chemspide
pubMedReferences	NUMBER_OF_PUBMED_ARTICLES	comptox
pubMedReferences	PubMed_Count	pubchemli
extReferenceCount	ChemSpiderNumberExternalReferences	chemspide
dataSourceCount	ChemSpiderDataSourceCount	chemspide
referenceCount	ChemSpiderReferenceCount	chemspide
RSCCount	ChemSpiderRSCCount	chemspide
smartsInclusionScore	SmartsSubstructureInclusionScore	•
smartsExclusionScore	SmartsSubstructureExclusionScore	
suspectListScore	SuspectListScore	
retentionTimeScore	RetentionTimeScore	
CPDATCount	CPDAT_COUNT	comptox
TOXCASTActive	TOXCAST_PERCENT_ACTIVE	comptox
dataSources	DATA_SOURCES	comptox
pubChemDataSources	PUBCHEM_DATA_SOURCES	comptox
EXPOCASTPredExpo	EXPOCAST_MEDIAN_EXPOSURE_PREDICTION_MG/KG-BW/DAY	comptox
ECOTOX	ECOTOX	comptox
NORMANSUSDAT	NORMANSUSDAT	comptox
MASSBANKEU	MASSBANKEU	comptox
TOX21SL	TOX21SL	comptox
TOXCAST	TOXCAST	comptox
KEMIMARKET	KEMIMARKET	comptox
MZCLOUD	MZCLOUD	comptox
pubMedNeuro	PubMedNeuro	-
CIGARETTES	CIGARETTES	comptox
		comptox
INDOORCT16	INDOORCT16	comptox
SRM2585DUST	SRM2585DUST	comptox
SLTCHEMDB	SLTCHEMDB	comptox
THSMOKE	THSMOKE	comptox
ITNANTIBIOTIC	ITNANTIBIOTIC	comptox
STOFFIDENT	STOFFIDENT	comptox
KEMIMARKET_EXPO	KEMIMARKET_EXPO	comptox
KEMIMARKET_HAZ	KEMIMARKET_HAZ	comptox
REACH2017	REACH2017	comptox
KEMIWW_WDUIndex	KEMIWW_WDUIndex	comptox
$KEMIWW\_StpSE$	$KEMIWW\_StpSE$	comptox
$KEMIWW\_SEHitsOverDL$	KEMIWW_SEHitsOverDL	comptox
ZINC15PHARMA	ZINC15PHARMA	comptox
PFASMASTER	PFASMASTER	comptox
peakFingerprintScore	${\bf Automated Peak Finger print Annotation Score}$	
lossFingerprintScore	Automated Loss Finger print Annotation Score	
$\operatorname{agroChemInfo}$	AgroChemInfo	pubchemli

bioPathway	BioPathway
drugMedicInfo	DrugMedicInfo
foodRelated	FoodRelated
pharmacoInfo	PharmacoInfo
safetyInfo	SafetyInfo
toxicityInfo	ToxicityInfo
knownUse	KnownUse
anno Type Count	FPSum

pubchemli pubchemli pubchemli pubchemli pubchemli pubchemli pubchemli pubchemli

annoTypeCount AnnoTypeCount

In addition, the compoundScorings function is also useful to programatically generate a set of scorings to be used by MetFrag. For instance, the following can be given to the scoreTypes argument to use all default scorings for PubChem: compoundScorings("metfrag", "pubchem", onlyDefault=TRUE)\$r

For all MetFrag scoring types refer to the Candidate Scores section on the MetFragR homepage.

## Usage of MetFrag databases

When database="chemspider" setting the chemSpiderToken argument is mandatory.

When a local database is set (*i.e.* sdf, psv, csv, comptox, pubchemlite) the file location of the database should be set in the LocalDatabasePath value via the extraOpts argument or using the patRoon.path.MetFragCompTox/patRoon.path.MetFragPubChemLite option (only when database="comptox" or database="pubchemlite").

```
Examples: options(patRoon.path.MetFragCompTox = "C:/CompTox_17March2019_SelectMetaData.csv") extraOpts = list(LocalDatabasePath = "C:/myDB.csv").
```

For database="comptox" the files can be obtained from here. Furthermore, the files with additions for https://zenodo.org/record/3364464#.XnjM-XLvKUk and https://zenodo.org/record/3472781#.XnjM/metadata are also supported. Note that only recent MetFrag versions (i= '2.4.5') support these libraries.

## Note

For annotations performed with SIRIUS it is often the fastest to keep the default SIRBatchSize=0. In this case, the maxProcAmount argument will be ignored and all SIRIUS output will be printed to the terminal (unless verbose=FALSE).

#### References

Ruttkies C, Schymanski EL, Wolf S, Hollender J, Neumann S (2016). "MetFrag relaunched: incorporating strategies beyond in silico fragmentation." *Journal of Cheminformatics*, **8**(1). doi: 10.1186/s1332101601159.

Duhrkop K, Fleischauer M, Ludwig M, Aksenov AA, Melnik AV, Meusel M, Dorrestein PC, Rousu J, Bocker S (2019). "SIRIUS 4: a rapid tool for turning tandem mass spectra into metabolite structure information." *Nature Methods*, **16**(4), 299–302. doi: 10.1038/s41592-01903448, https://doi.org/10.1038/s41592-019-0344-8.

34 compounds-class

Duhrkop K, Bocker S (2015). "Fragmentation Trees Reloaded." In Przytycka TM (ed.), Research in Computational Molecular Biology, 65–79. ISBN 978-3-319-16706-0.

Duhrkop K, Shen H, Meusel M, Rousu J, Bocker S (2015). "Searching molecular structure databases with tandem mass spectra using CSI:FingerID." *Proceedings of the National Academy of Sciences*, **112**(41), 12580–12585. doi: 10.1073/pnas.1509788112.

Bocker S, Letzel MC, Liptak Z, Pervukhin A (2008). "SIRIUS: decomposing isotope patterns for metabolite identification." *Bioinformatics*, **25**(2), 218–224. doi: 10.1093/bioinformatics/btn603.

#### See Also

compounds-class

compounds-class

Compound lists class

#### Description

Contains data of generated chemical compounds for given feature groups.

#### Usage

```
## S4 method for signature 'compounds'
compoundTable(obj)
## S4 method for signature 'compounds'
algorithm(obj)
## S4 method for signature 'compounds'
groupNames(obj)
## S4 method for signature 'compounds'
length(x)
## S4 method for signature 'compounds'
show(object)
## S4 method for signature 'compounds, ANY, missing, missing'
x[i, j, ..., drop = TRUE]
## S4 method for signature 'compounds, ANY, missing'
x[[i, j]]
## S4 method for signature 'compounds'
x$name
```

compounds-class 35

```
## S4 method for signature 'compounds'
as.data.table(
  fGroups = NULL,
  fragments = FALSE,
  normalizeScores = "none",
  excludeNormScores = c("score", "individualMoNAScore")
)
## S4 method for signature 'compounds'
identifiers(compounds)
## S4 method for signature 'compounds'
filter(
  obj,
 minExplainedPeaks = NULL,
 minScore = NULL,
 minFragScore = NULL,
 minFormulaScore = NULL,
  scoreLimits = NULL,
  elements = NULL,
  fragElements = NULL,
  lossElements = NULL,
  topMost = NULL,
  negate = FALSE
)
## S4 method for signature 'compounds'
addFormulaScoring(
  compounds,
  formulas,
  updateScore = FALSE,
  formulaScoreWeight = 1
)
## S4 method for signature 'compounds'
getMCS(obj, index, groupName)
## S4 method for signature 'compounds'
plotStructure(
  obj,
  index,
  groupName,
 width = 500,
 height = 500,
  useGGPlot2 = FALSE
)
```

36 compounds-class

```
## S4 method for signature 'compounds'
plotScores(
  obj,
  index,
  groupName,
  normalizeScores = "max",
  excludeNormScores = c("score", "individualMoNAScore"),
  onlyUsed = TRUE,
  useGGPlot2 = FALSE
)
## S4 method for signature 'compounds'
annotatedPeakList(
  obj,
  index,
  groupName,
 MSPeakLists,
  formulas = NULL,
  onlyAnnotated = FALSE
)
## S4 method for signature 'compounds'
plotSpec(
  obj,
  index,
  groupName,
 MSPeakLists,
  formulas = NULL,
  plotStruct = TRUE,
  title = NULL,
  useGGPlot2 = FALSE,
  xlim = NULL,
 ylim = NULL,
)
## S4 method for signature 'compounds'
plotVenn(obj, ..., labels = NULL, vennArgs = NULL)
## S4 method for signature 'compounds'
plotUpSet(
 obj,
 labels = NULL,
  nsets = length(list(...)) + 1,
  nintersects = NA,
  upsetArgs = NULL
```

```
## S4 method for signature 'compounds'
consensus(
  obj,
    ...,
  absMinAbundance = NULL,
  relMinAbundance = NULL,
  uniqueFrom = NULL,
  uniqueOuter = FALSE,
  minMaxNormalization = FALSE,
  rankWeights = 1,
  labels = NULL
)
```

# Arguments

obj, object, x, compounds

The compound object.

i

A numeric or character value which is used to select feature groups by their index or name, respectively (for the order/names see groupNames()).

For [: Can also be logical to perform logical selection (similar to regular vectors). If missing all feature groups are selected.

For [[: should be a scalar value.

. . .

For plotSpec: Further arguments passed to plot.

Others: Any further (and unique) compounds objects.

drop, j

ignored.

name

The feature group name (partially matched).

**fGroups** 

The featureGroups object that was used to generate this object. If not NULL it is used to add feature group information (retention and m/z values).

fragments

If  $\ensuremath{\mathsf{TRUE}}$  then information on annotated fragments will be included.

## normalizeScores

A character that specifies how normalization of compound scorings occurs. Either "none" (no normalization), "max" (normalize to max value) or "minmax" (perform min-max normalization). Note that normalization of negative scores (e.g. output by SIRIUS) is always performed as min-max. Furthermore, currently normalization takes the original scoring min/max values into account when candidates were generated. Thus, normalization is not affected when candidate results were removed after they were generated (e.g. by use of filter).

# excludeNormScores

A character vector specifying any compound scoring names that should *not* be normalized. Set to NULL to normalize all scorings. Note that

whether any normalization occurs is set by the excludeNormScores argument.

For compounds: By default score and individualMoNAScore are set to mimic the behaviour of the MetFrag web interface.

minExplainedPeaks, minScore, minFragScore, minFormulaScore

Minimum number of explained peaks, overall score, in-silico fragmentation score and formula score, respectively. Set to NULL to ignore. The scoreLimits argument allows for more advanced score filtering.

scoreLimits

Filter results by their scores. Should be a named list that contains two-sized numeric vectors with the minimum/maximum value of a score (use -Inf/Inf for no limits). The names of each element should follow the values returned by compoundScorings()\$name. For instance, scoreLimits=list(numberPatents=c(1 specifies that numberPatents should be at least '10'. For more details of scorings see compoundScorings. Note that a result without a specified scoring is never removed. Set to NULL to skip this filter.

elements

Only retain candidate formulae (neutral form) that match a given elemental restriction. The format of elements is a character string with elements that should be present where each element is followed by a valid amount or a range thereof. If no number is specified then '1' is assumed. For instance, elements="C1-10H2-2000-2P", specifies that '1-10', '2-20', '0-2' and '1' carbon, hydrogen, oxygen and phosphorus atoms should be present, respectively. When length(elements)>1 formulas are tested to follow at least one of the given elemental restrictions. For instance, elements=c("P", "S") specifies that either one phosphorus or one sulphur atom should be present. Set to NULL to ignore this filter.

fragElements, lossElements

Specifies elemental restrictions for fragment or neutral loss formulae (charged form). Candidates are retained if at least one of the fragment formulae follow (or not follow if negate=TRUE) the given restrictions. See elements for the used format.

topMost

Only keep a maximum of topMost candidates with highest score (or least highest if negate=TRUE). Set to NULL to ignore.

negate

If TRUE then filters are applied in opposite manner.

formulas

The formulas object that should be used for scoring/annotation. For plotSpec: set to NULL to ignore.

updateScore

If set to TRUE then the score column is updated by adding the normalized 'formulaScore' (weighted by 'formulaScoreWeight'). Currently, this **only** makes sense for MetFrag results!

formulaScoreWeight

Weight used to update scoring (see updateScore parameter).

index

The numeric index of the candidate structure. Multiple indices (i.e. vector with length  $\xi=2$ ) may be specified for plotStructure and are mandatory for getMCS. Alternatively, '-1' may be specified to these methods to select all candidates. When multiple indices are specified for plotStructure, their maximum common substructure will be drawn.

groupName

The name of the feature group to which the candidate belongs.

width, height The dimensions (in pixels) of the raster image that should be plotted.

useGGPlot2 If TRUE then ggplot2 is used for plotting, otherwise base plot used. For

plotSpec, ggplot2 allows nicely repelled text for annotation. However,

base plot is generally faster.

onlyUsed If TRUE then only scorings are plotted that actually have been used to

rank data (see the scoreTypes argument to generateCompoundsMetfrag

Sets the plot size limits used by plot. Set to NULL for automatic plot

for more details).

MSPeakLists The MSPeakLists object that was used to generate the candidate

onlyAnnotated Set to TRUE to filter out any peaks that could not be annotated.

plotStruct If TRUE then the candidate structure is drawn in the spectrum.

title The title of the plot. If NULL a title will be automatically made.

sizing.

labels A character with names to use for labelling. If NULL labels are automat-

ically generated.

vennArgs A list with further arguments passed to VennDiagram plotting functions.

Set to NULL to ignore.

nsets See upset.
nintersects See upset.

xlim, ylim

upsetArgs A list with any further arguments to be passed to upset. Set to NULL to

ignore.

absMinAbundance, relMinAbundance

Minimum absolute or relative ('0–1') abundance across objects for a result to be kept. For instance, relMinAbundance=0.5 means that a result should be present in at least half of the number of compared objects. Set to 'NULL' to ignore and keep all results. Limits cannot be set when uniqueFrom is

not NULL.

uniqueFrom Set this argument to only retain compounds that are unique within one

or more of the objects for which the consensus is made. Selection is done by setting the value of uniqueFrom to a logical (values are recycled), numeric (select by index) or a character (as obtained with algorithm(obj)). For logical and numeric values the order corresponds to the order of the objects given for the consensus. Set to NULL to ignore.

uniqueOuter If uniqueFrom is not NULL and if uniqueOuter=TRUE: only retain data that

are also unique between objects specified in uniqueFrom.

minMaxNormalization

Set to TRUE to apply min-max normalization of (merged) scoring columns. FALSE will apply normalization to the maximum value. Scorings with

negative values will always be min-max normalized.

rankWeights A numeric vector with weights of to calulcate the mean ranking score

for each candidate. The value will be re-cycled if necessary, hence, the default value of '1' means equal weights for all considered objects.

#### **Details**

compounds objects are obtained from compound generators.

#### Value

plotSpec and plotStructure will return a ggplot object if useGGPlot2 is TRUE.

compoundTable returns a list containing for each feature group a data.table with an overview of all candidate compounds and other data such as candidate scoring, matched MS/MS fragments, etc.

filter returns a filtered compounds object.

addFormulaScoring returns a compounds object updated with formula scoring.

getMCS returns an rcdk molecule object (IAtomContainer).

plotVenn (invisibly) returns a list with the following fields:

- gList the gList object that was returned by the utilized VennDiagram plotting function.
- areas The total area for each plotted group.
- intersectionCounts The number of intersections between groups.

The order for the areas and intersectionCounts fields is the same as the parameter order from the used plotting function (see e.g. draw.pairwise.venn and draw.triple.venn).

consensus returns a compounds object that is produced by merging multiple specified compounds objects.

### Methods (by generic)

- compoundTable: Accessor method to obtain generated compounds.
- algorithm: Accessor method for the algorithm (a character string) used to generate compounds.
- groupNames: returns a character vector with the names of the feature groups for which data is present in this object.
- length: Obtain total number of candidate compounds.
- show: Show summary information for this object.
- [: Subset on feature groups.
- [[: Extract a compound table for a feature group.
- \$: Extract a compound table for a feature group.
- as.data.table: Returns all MS peak list data in a table.
- identifiers: Returns a list containing for each feature group a character vector with database identifiers for all candidate compounds. The list is named by feature group names, and is typically used with the identifiers option of generateCompoundsMetfrag.
- filter: Provides rule based filtering for generated compounds. Useful to eliminate unlikely candidates and speed up further processing.

• addFormulaScoring: Adds formula ranking data from a formulas object as an extra compound candidate scoring (formulaScore column). The formula score for each compound candidate is between '0-1', where zero means no match with any formula candidates, and one means that the compound candidate's formula is the highest ranked.

- getMCS: Calculates the maximum common substructure (MCS) for two or more candidate structures for a feature group. This method uses the get.mcs function from rcdk.
- plotStructure: Plots a structure of a candidate compound using the **rcdk** package. If multiple candidates are specified (*i.e.* by specifying a **vector** for **index**) then the maximum common substructure (MCS) of the selected candidates is drawn.
- plotScores: Plots a barplot with scoring of a candidate compound.
- annotatedPeakList: Returns an MS/MS peak list annotated with data from a given candidate compound for a feature group.
- plotSpec: Plots an annotated spectrum for a given candidate compound for a feature group.
- plotVenn: plots a Venn diagram (using VennDiagram) outlining unique and shared compound candidates of up to five different compounds objects. Comparison is made on InChIKey1.
- plotUpSet: plots an UpSet diagram (using the upset function) outlining unique and shared compound candidates between different compounds objects. Comparison is made on InChIKey1.
- consensus: Generates a consensus of results from multiple objects. In order to rank the consensus candidates, first each of the candidates are scored based on their original ranking (the scores are normalized and the highest ranked candidate gets value '1'). The (weighted) mean is then calculated for all scorings of each candidate to derive the final ranking (if an object lacks the candidate its score will be '0'). The original rankings for each object is stored in the rank columns.

#### Slots

compounds Lists of all generated compounds. Use the compounds method for access.

scoreTypes A character with all the score types that were used when generating the compounds.

scoreRanges The original min/max values of all scorings when candidate results were generated. This is used for normalization.

# S4 class hierarchy

- workflowStep
  - compounds
    - \* compoundsConsensus
    - \* compoundsMF

42 compounds-cluster

#### Source

Subscripting of formulae for plots generated by plotSpec is based on the chemistry2expression function from the ReSOLUTION package.

#### References

Guha, R. (2007). 'Chemical Informatics Functionality in R'. Journal of Statistical Software 6(18)

Conway JR, Lex A, Gehlenborg N (2017). "UpSetR: an R package for the visualization of intersecting sets and their properties." *Bioinformatics*, **33**(18), 2938-2940. doi: 10.1093/bioinformatics/btx364, http://dx.doi.org/10.1093/bioinformatics/btx364.

Lex A, Gehlenborg N, Strobelt H, Vuillemot R, Pfister H (2014). "UpSet: Visualization of Intersecting Sets." *IEEE Transactions on Visualization and Computer Graphics*, **20**(12), 1983–1992. doi: 10.1109/tvcg.2014.2346248, https://doi.org/10.1109/tvcg.2014.2346248.

compounds-cluster

Hierarchical clustering of compounds

# Description

Perform hierarchical clustering of structure candidates based on chemical similarity and obtain overall structural information based on the maximum common structure (MCS).

# Usage

```
## S4 method for signature 'compounds'
makeHCluster(
  obj,
  method,
  fpType = "extended",
  fpSimMethod = "tanimoto",
  maxTreeHeight = 1,
  deepSplit = TRUE,
  minModuleSize = 1
)
```

# Arguments

obj The compounds object to be clustered.

method The clustering method passed to hclust.

fpType The type of structural fingerprint that should be calculated. See the type

argument of the get.fingerprint function of rcdk.

fpSimMethod The similarity method (i.e. not dissimilarity!) to be used for generat-

ing the distance matrix. See the method argument of the fp.sim.matrix

function of the **fingerprint** package.

#### **Details**

Often many possible chemical structure candidates are found for each feature group when performing compound identification. Therefore, it may be useful to obtain an overview of their general structural properties. One strategy is to perform hierarchical clustering based on their chemical (dis)similarity, for instance, using the Tanimoto score. The resulting clusters can then be characterized by evaluating their maximum common substructure (MCS).

makeHCluster performs hierarchical clustering of all structure candidates for each feature group within a compounds object. The resulting dendrograms are automatically cut using the cutreeDynamicTree function from the dynamicTreeCut package. The returned compoundsCluster object can then be used, for instance, for plotting dendrograms and MCS structures and manually re-cutting specific clusters.

#### Value

makeHCluster returns an compoundsCluster object.

#### Source

The methodology applied here has been largely derived from 'chemclust.R' from the met-fRag package and the package vignette of rcdk.

### See Also

compoundsCluster

```
compoundsCluster-class
```

 $Compounds\ cluster\ class$ 

# Description

Objects from this class are used to store hierarchical clustering data of candidate structures within compounds objects.

# Usage

```
## S4 method for signature 'compoundsCluster'
clusters(obj)
## S4 method for signature 'compoundsCluster'
cutClusters(obj)
## S4 method for signature 'compoundsCluster'
```

```
clusterProperties(obj)
## S4 method for signature 'compoundsCluster'
groupNames(obj)
## S4 method for signature 'compoundsCluster'
length(x)
## S4 method for signature 'compoundsCluster'
lengths(x, use.names = TRUE)
## S4 method for signature 'compoundsCluster'
show(object)
## S4 method for signature 'compoundsCluster, ANY, missing, missing'
x[i, j, ..., drop = TRUE]
## S4 method for signature 'compoundsCluster'
treeCut(obj, k = NULL, h = NULL, groupName)
## S4 method for signature 'compoundsCluster'
treeCutDynamic(obj, maxTreeHeight, deepSplit, minModuleSize, groupName)
## S4 method for signature 'compoundsCluster, ANY'
plot(
  х,
  groupName,
  pal = "Paired",
  colourBranches = lengths(x)[groupName] < 50,</pre>
  showLegend = lengths(x)[groupName] < 20,</pre>
  . . .
)
## S4 method for signature 'compoundsCluster'
getMCS(obj, groupName, cluster)
## S4 method for signature 'compoundsCluster'
plotStructure(
  obj,
  {\tt groupName} ,
  cluster,
 width = 500,
 height = 500,
 withTitle = TRUE
)
## S4 method for signature 'compoundsCluster'
plotSilhouettes(obj, kSeq, groupName, pch = 16, type = "b", ...)
```

## Arguments

obj, x, object A compoundsCluster object.

use.names A logical value specifying whether the returned vector should be named

with the feature group names.

i A numeric or character value which is used to select feature groups by

their index or name, respectively (for the order/names see  ${\tt groupNames}$ ()). Can also be logical to perform logical selection (similar to regular vectors).

If missing all feature groups are selected.

... Further arguments passed directly to the plotting function (plot or plot.dendrogram).

drop, j ignored.

k, h Desired number of clusters or tree height to be used for cutting the den-

drogram, respecitively. One or the other must be specified. Analogous to

cutree.

groupName A character specifying the feature group name.

maxTreeHeight, deepSplit, minModuleSize

Arguments used by cutreeDynamicTree.

pal Colour palette to be used from **RColorBrewer**.

colourBranches Whether branches from cut clusters (and their labels) should be coloured.

Might be slow with large numbers of clusters, hence, the default is only

TRUE when this is not the case.

showLegend If TRUE and colourBranches is also TRUE then a legend will be shown

which outlines cluster numbers and their colours. By default TRUE for

small amount of clusters to avoid overflowing the plot.

cluster A numeric value specifying the cluster.

width, height The dimensions (in pixels) of the raster image that should be plotted.

with Title A logical value specifying whether a title should be added.

kSeq An integer vector containing the sequence that should be used for average

silhouette width calculation.

pch, type Passed to plot.

# Details

Objects from this type are returned by the compounds method for makeHCluster.

# Value

cutTree and cutTreeDynamic return the modified compoundsCluster object.
getMCS returns an rcdk molecule object (IAtomContainer).

## Methods (by generic)

• clusters: Accessor method to the clusters slot. Returns a list that contains for each feature group an object as returned by hclust.

- cutClusters: Accessor method to the cutClusters slot. Returns a list that contains for each feature group a vector with cluster membership for each candidate (format as cutree).
- clusterProperties: Returns a list with properties on how the clustering was performed.
- groupNames: returns a character vector with the names of the feature groups for which data is present in this object.
- length: Returns the total number of clusters.
- lengths: Returns a vector with the number of clusters per feature group.
- show: Show summary information for this object.
- [: Subset on feature groups.
- treeCut: Manually (re-)cut a dendrogram that was generated for a feature group.
- treeCutDynamic: Automatically (re-)cut a dendrogram that was generated for a feature group using the cutreeDynamicTree function from dynamicTreeCut.
- plot: Plot the dendrogram for clustered compounds of a feature group. Clusters are highlighted using dendextend.
- getMCS: Calculates the maximum common substructure (MCS) for all candidate structures within a specified cluster. This method uses the get.mcs function from rcdk.
- plotStructure: Plots the maximum common substructure (MCS) for all candidate structures within a specified cluster.
- plotSilhouettes: Plots the average silhouette width when the clusters are cut by a sequence of k numbers. The k value with the highest value (marked in the plot) may be considered as the optimal number of clusters.

# Slots

clusters A list with hclust objects for each feature group.

dists A list with distance matrices for each feature group.

SMILES A list containing a vector with SMILES for all candidate structures per feature group.

cutClusters A list with assigned clusters for all candidates per feature group (same format as what cutree returns).

properties A list containing general properties and parameters used for clustering.

compoundsMF-class

Compounds list class for MetFrag results.

# Description

This class is derived from compounds and contains additional specific MetFrag data.

convertMSFiles 47

# Usage

```
## S4 method for signature 'compoundsMF'
settings(compoundsMF)
```

# Arguments

 ${\tt compoundsMF}$  A compoundsMF  ${\tt object}.$ 

# **Details**

Objects from this class are generated by generateCompoundsMetfrag

# Methods (by generic)

• settings: Accessor method for the settings slot.

#### Slots

settings A list with all general configuration settings passed to MetFrag. Feature specific items (e.g. spectra and precursor masses) are not contained in this list.

# S4 class hierarchy

- compounds
  - compoundsMF

# References

Ruttkies C, Schymanski EL, Wolf S, Hollender J, Neumann S (2016). "MetFrag relaunched: incorporating strategies beyond in silico fragmentation." *Journal of Cheminformatics*, 8(1). doi: 10.1186/s1332101601159.

# See Also

compounds and compound-generation

convertMSFiles

MS data conversion

# Description

Conversion of MS analysis files between several open and closed data formats.

48 convertMSFiles

# Usage

```
MSFileFormats(algorithm = "pwiz", vendor = FALSE)
convertMSFiles(
  files = NULL,
  outPath = NULL,
  dirs = TRUE,
  anaInfo = NULL,
  from = MSFileFormats(algorithm, vendor = algorithm != "openms"),
  to = "mzML",
  overWrite = FALSE,
  algorithm = "pwiz",
  centroid = algorithm != "openms",
  filters = NULL,
  extraOpts = NULL,
 logPath = file.path("log", "convert"),
 maxProcAmount = getOption("patRoon.maxProcAmount")
)
```

# **Arguments**

algorithm Either "pwiz" (implemented by msConvert of ProteoWizard), "openms"

(implemented by FileConverter of OpenMS) or "bruker" (implemented

by DataAnalysis).

vendor If TRUE only vendor formats are returned.

files, dirs The files argument should be a character vector with input files. If

files contains directories and dirs=TRUE then files from these directories are also considered. An alternative method to specify input files is by the

anaInfo argument. If the latter is specified files may be NULL.

outPath A character vector specifying directories that should be used for the out-

put. Will be re-cycled if necessary. If NULL, output directories will be

kept the same as the input directories.

anaInfo An analysis info table used to retrieve input files. Either this argument

or files (or both) should be set (i.e. not NULL).

from One or more input formats (see below). These are used to find analyses

when dirs=TRUE or anaInfo is set.

to Output format: "mzXML" or "mzML".

overWrite Should existing destination file be overwritten (TRUE) or not (FALSE)?

centroid Set to TRUE to enable centroiding (not supported if algorithm="openms").

In addition, when algorithm="pwiz" the value may be "vendor" to per-

form centroiding with the vendor algorithm.

filters When algorithm="pwiz": a character vector specifying one or more

filters. The elements of the specified vector are directly passed to the

--filter option (see here)

convertMSFiles 49

extraOpts A character vector specifying any extra commandline parameters passed

to msConvert or FileConverter. Set to NULL to ignore. For options: see

FileConverter and msConvert.

logPath Destination directory for log files with output from executed commands.

Will be created if non-existant. Set to NULL to disable logging.

maxProcAmount Maximum number of processes to run for parallelization. Usually a num-

ber close to the amount of physical cores yields most efficient results.

#### Details

MSFileFormats returns a character with all supported input formats (see below).

convertMSFiles converts the data format of an analysis to another. It uses tools from ProteoWizard (msConvert command), OpenMS (FileConverter command) or Bruker Data-Analysis to perform the conversion. Supported input and output formats include 'mzXML', '.mzML' and several vendor formats, depending on which algorithm is used.

#### Conversion formats

Possible output formats (to argument) are mzXML and mzML.

Possible input formats (from argument) depend on the algorithm that was chosen and may include:

- thermo: Thermo '.RAW' files (only algorithm="pwiz").
- bruker: Bruker '.d', '.yep', '.baf' and '.fid' files (only algorithm="pwiz" or algorithm="bruker").
- agilent: Agilent '.d' files (only algorithm="pwiz").
- ab: AB Sciex '.wiff' files (only algorithm="pwiz").
- waters Waters '.RAW' files (only algorithm="pwiz").
- mzXML/mzML: Open format '.mzXML'/'.mzML' files (only algorithm="pwiz" or algorithm="openms").

Note that the actual supported file formats of ProteoWizard depend on how it was installed (see <a href="here">here</a>).

# References

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50 feature-filtering

# Examples

feature-filtering

Filtering of grouped features

# Description

Basic rule based filtering of feature groups.

# Usage

```
## S4 method for signature 'featureGroups'
filter(
  obj,
  absMinIntensity = NULL,
  relMinIntensity = NULL,
  preAbsMinIntensity = NULL,
  preRelMinIntensity = NULL,
  absMinAnalyses = NULL,
  relMinAnalyses = NULL,
  absMinReplicates = NULL,
  relMinReplicates = NULL,
  absMinFeatures = NULL,
  relMinFeatures = NULL,
  absMinReplicateAbundance = NULL,
  relMinReplicateAbundance = NULL,
  maxReplicateIntRSD = NULL,
  blankThreshold = NULL,
  retentionRange = NULL,
 mzRange = NULL,
 mzDefectRange = NULL,
  chromWidthRange = NULL,
  rGroups = NULL,
  removeBlanks = FALSE,
  negate = FALSE
)
```

feature-filtering 51

## S4 method for signature 'featureGroups' replicateGroupSubtract(fGroups, rGroups, threshold = 0)

# **Arguments**

# absMinIntensity, relMinIntensity

Minimum absolute/relative intensity for features to be kept. The relative intensity is determined from the feature with highest intensity (of all features from all groups). Set to '0' or NULL to skip this step.

#### preAbsMinIntensity, preRelMinIntensity

As absMinIntensity/relMinIntensity, but applied before any other filters. This is typically used to speed-up subsequent filter steps. However, care must be taken that a sufficiently low value is choosen that is not expected to affect subsequent filtering steps. See below why this may be important.

## absMinAnalyses, relMinAnalyses

Feature groups are only kept when they contain data for at least this (absolute or relative) amount of analyses. Set to NULL to ignore.

#### absMinReplicates, relMinReplicates

Feature groups are only kept when they contain data for at least this (absolute or relative) amount of replicates. Set to NULL to ignore.

# absMinFeatures, relMinFeatures

Analyses are only kept when they contain at least this (absolute or relative) amount of features. Set to NULL to ignore.

#### absMinReplicateAbundance, relMinReplicateAbundance

Minimum absolute/relative abundance that a grouped feature should be present within a replicate group. If this mimimum is not met all features within the replicate group are removed. Set to NULL to skip this step.

# maxReplicateIntRSD

Maximum relative standard deviation (RSD) of intensity values for features within a replicate group. If the RSD is above this value all features within the replicate group are removed. Set to NULL to ignore.

blankThreshold Feature groups that are also present in blank analyses (see analysis info) are filtered out unless their relative intensity is above this threshold. For instance, a value of '5' means that only features with an intensity five times higher than that of the blank are kept. The relative intensity values between blanks and non-blanks are determined from the mean of all nonzero blank intensities. Set to NULL to skip this step.

# retentionRange, mzRange, mzDefectRange, chromWidthRange

Range of retention time (in seconds), m/z, mass defect (defined as the decimal part of m/z values) or chromatographic peak width (in seconds), respectively. Features outside this range will be removed. Should be a numeric vector with length of two containing the min/max values. The maximum can be Inf to specify no maximum range. Set to NULL to skip this step.

52 feature-filtering

rGroups A character vector of replicate groups that should be kept (filter) or

subtracted from (replicateGroupSubtract).

removeBlanks Set to TRUE to remove all analyses that belong to replicate groups that are

specified as a blank in the analysis-information. This is useful to simplify the analyses in the specified <code>featureGroups</code> object after blank subtraction. When both <code>blankThreshold</code> and this argument are set, blank subtraction

is performed prior to removing any analyses.

negate If set to TRUE then filtering operations are performed in opposite manner.

fGroups, obj featureGroups object to which the filter is applied.

threshold Minimum relative threshold (compared to mean intensity of replicate

group being subtracted) for a feature group to be not removed. When '0' a feature group is always removed when present in the given replicate

groups.

#### **Details**

filter performs common rule based filtering of feature groups such as blank subtraction, minimum intensity and minimum replicate abundance. Removing of features occurs by zeroing their intensity values. Furthermore, feature groups that are left completely empty (i.e. all intensities are zero) will be automatically removed.

replicateGroupSubtract removes feature groups present in a given set of replicate groups (unless intensities are above a given threshold). The replicate groups that are subtracted will be removed.

#### Value

A filtered featureGroups object. Feature groups that are filtered away have their intensity set to zero. In case a feature group is not present in any of the analyses anymore it will be removed completely.

## Filter order

When multiple arguments are specified to filter, multiple filters are applied in sequence. Since some of these filters may affect each other, choosing their order correctly may be important for effective data filtering. For instance, when an intensity filter removes features from blank analyses, a subsequent blank filter may not adequately perform blank subtraction. Similarly, when intensity and blank filters are executed after the replicate abundance filter it may be necessary to ensure minimum replicate abundance again as the intensity and blank filters may have removed some features within a replicate group.

With this in mind, filters (if specified) occur in the following order:

- 1. Pre-Intensity filters (*i.e.* preAbsMinIntensity and preRelMinIntensity).
- 2. Chromatography and mass filters (i.e retentionRange, mzRange, mzDefectRange and chromWidthRange).
- Replicate abundance filters (i.e. absMinReplicateAbundance, relMinReplicateAbundance and maxReplicateIntRSD).
- 4. Blank filter (i.e. blankThreshold).

- 5. Intensity filters (*i.e.* absMinIntensity and relMinIntensity).
- 6. Replicate abundance filters (2nd time, only if previous filters affected results).
- 7. General abundance filters (*i.e.* absMinAnalyses, relMinAnalyses, absMinReplicates, relMinReplicates, absMinFeatures and relMinFeatures).
- 8. Replicate group filter (i.e. rGroups) and blank analyses removal (i.e. if removeBlanks=TRUE).

If another filtering order is desired then filter should be called multiple times with only one filter argument at a time.

# See Also

```
featureGroups-class
feature-grouping
```

feature-finding

Finding features

# Description

Functions and classes for collection of features.

# Usage

```
findFeatures(analysisInfo, algorithm, ..., verbose = TRUE)
importFeatures(analysisInfo, type, ...)
findFeaturesBruker(
  analysisInfo,
 doFMF = "auto"
  startRange = 0,
 endRange = 0,
  save = TRUE,
 close = save,
  verbose = TRUE
)
findFeaturesEnviPick(analysisInfo, ..., verbose = TRUE)
importFeaturesEnviMass(analysisInfo, enviProjPath)
findFeaturesOpenMS(
  analysisInfo,
 noiseThrInt = 1000,
  chromSNR = 3,
  chromFWHM = 5,
```

```
mzPPM = 10,
 reEstimateMTSD = TRUE,
 traceTermCriterion = "sample_rate",
  traceTermOutliers = 5,
 minSampleRate = 0.5,
 minTraceLength = 3,
 maxTraceLength = -1,
 widthFiltering = "fixed",
 minFWHM = 3,
 maxFWHM = 60,
 traceSNRFiltering = FALSE,
 localRTRange = 10,
 localMZRange = 6.5,
  isotopeFilteringModel = "metabolites (5% RMS)",
 MZScoring13C = FALSE,
 useSmoothedInts = TRUE,
 extraOpts = NULL,
 intSearchRTWindow = 3,
 logPath = file.path("log", "openms"),
 maxProcAmount = getOption("patRoon.maxProcAmount"),
 verbose = TRUE
)
findFeaturesXCMS(analysisInfo, method = "centWave", ..., verbose = TRUE)
importFeaturesXCMS(xs, analysisInfo)
findFeaturesXCMS3(analysisInfo, param = xcms::CentWaveParam(), verbose = TRUE)
importFeaturesXCMS3(xdata, analysisInfo)
```

# Arguments

analysisInfo	Analysis info table.
algorithm	A character string describing the algorithm that should be used: "bruker", "openms", "xcms", "xcms3", "envipick"
	further parameters passed to xcmsSet (findFeaturesXCMS), enviPickwrap (featurefinderEnviPick) or to selected feature finding or importing algorithms (findFeatures and importFeatures).
verbose	If set to FALSE then no text output is shown.
type	What type of data should be imported: "xcms", "xcms3" or "envimass".
doFMF	Run the 'Find Molecular Features' algorithm before loading compounds. Valid options are: "auto" (run FMF automatically if current results indicate it is necessary) and "force" (run FMF always, even if cached results exist). Note that checks done if doFMF="auto" are fairly simplistic, hence set doFMF="force" if feature data needs to be updated.

#### startRange, endRange

Start/End retention range (seconds) from which to collect features. A 0 (zero) for endRange marks the end of the analysis.

close, save

If TRUE then Bruker files are closed and saved after processing with Data-Analysis, respectively. Setting close=TRUE prevents that many analyses might be opened simultaneously in DataAnalysis, which otherwise may use excessive memory or become slow. By default save is TRUE when close is TRUE, which is likely what you want as otherwise any processed data is lost.

enviProjPath The path of the enviMass project.

option.

chromSNR Minimum S/N of a mass trace. Sets algorithm:common:chrom\_peak\_snr

option.

chromFWHM Expected chromatographic peak width (in seconds). Sets algorithm:common:chrom\_fwhm

option.

mzPPM Allowed mass deviation (ppm) for trace detection. Sets algorithm: mtd: mass\_error\_ppm.

reEstimateMTSD If TRUE then enables dynamic re-estimation of m/z variance during mass

trace collection stage. Sets algorithm:mtd:reestimate\_mt\_sd.

traceTermCriterion, traceTermOutliers, minSampleRate

Termination criterion for the extension of mass traces. See Feature-FinderMetabo. Sets the algorithm:mtd:trace\_termination\_criterion,

algorithm:mtd:trace\_termination\_outliers and algorithm:mtd:min\_sample\_rate

options, respectively.

minTraceLength, maxTraceLength

Minimum/Maximum length of mass trace (seconds). Set negative value for maxlength to disable maximum. Sets algorithm:mtd:min\_trace\_length and algorithm:mtd:min\_trace\_length, respectively.

widthFiltering, minFWHM, maxFWHM

Enable filtering of unlikely peak widths. See FeatureFinderMetabo. Sets algorithm:epd:width\_filtering, algorithm:epd:min\_fwhm and algorithm:epd:max\_fwhm, respectively.

traceSNRFiltering

If TRUE then apply post-filtering by signal-to-noise ratio after smoothing. Sets the algorithm:epd:masstrace\_snr\_filtering option.

localRTRange, localMZRange

Retention/MZ range where to look for coeluting/isotopic mass traces. Sets the algorithm:ffm:local\_rt\_range and algorithm:ffm:local\_mz\_range options, respectively.

isotopeFilteringModel

Remove/score candidate assemblies based on isotope intensities. See FeatureFinderMetabo. Sets the algorithm:ffm:isotope\_filtering\_model option.

MZScoring13C Use the 13C isotope as the expected shift for isotope mass traces. See FeatureFinderMetabo. Sets algorithm:ffm:mz\_scoring\_13C.

useSmoothedInts

If TRUE then use LOWESS intensities instead of raw intensities. Sets the

algorithm:ffm:use\_smoothed\_intensities option.

extraOpts Named list containing extra options that will be passed to FeatureFinderMetabo.

Any options specified here will override any of the above. Example: extraOpts=list("-algorithm:common:noise\_threshold\_int"=1000) (cor-

responds to setting noiseThrInt=1000). Set to NULL to ignore.

intSearchRTWindow

Retention time window (in seconds, +/- feature retention time) that is used to find the closest data point to the retention time to obtain the intensity of a feature (this is needed since OpenMS does not provide this

data).

logPath Destination directory for log files with output from executed commands.

Will be created if non-existant. Set to NULL to disable logging.

maxProcAmount Maximum number of processes to run for parallelization. Usually a num-

ber close to the amount of physical cores yields most efficient results.

method The method setting used by XCMS peak finding, see xcms::findPeaks

An xcmsSet object.

param The method parameters used by XCMS peak finding, see xcms::findChromPeaks

xdata An XCMSnExp object.

#### **Details**

Several functions exist to collect features (*i.e.* retention and MS information that represent potential compounds) from a set of analyses. All 'feature finders' return an object derived from the **features** base class. The next step in a general workflow is to group and align these features across analyses by feature groupers. Note that some feature finders have a plethora of options which sometimes may have a large effect on the quality of results. Fine-tuning parameters is therefore important, and the optimum is largely dependent upon applied analysis methodology and instrumentation.

findFeatures is a generic function that will find features using one of the supported algorithms. The actual functionality is provided by algorithm specific functions such as findFeaturesOpenMS and findFeaturesBruker. While these functions may be called directly, findFeatures provides a generic interface and is therefore usually preferred.

importFeatures is a generic function to import feature groups produced by other software. The actual functionality is provided by specific functions such as importFeaturesXCMS and importFeaturesEnviMass.

find FeaturesBruker uses the 'Find Molecular Features' (FMF) algorithm of Bruker Data-Analysis vendor software to find features. The resulting 'compounds' are then transferred from Data-Analysis and stored as features.

findFeaturesEnviPick uses the enviPickwrap. function from the enviPick R package to extract features.

importFeaturesEnviMass imports features from a project generated by the enviMass package. NOTE: this functionality has only been tested with older versions of enviMass.

findFeatureSOpenMS uses the FeatureFinderMetabo TOPP tool (see http://www.openms.de).

findFeaturesXCMS uses the xcmsSet function from the xcms package to find features.

importFeaturesXCMS converts features from an existing xcmsSet object (obtained with the xcms package) to a new features object.

findFeaturesXCMS3 uses the new xcms3 interface from the xcms package to find features.

importFeaturesXCMS3 converts features from an existing XCMSnExp object (obtained with the xcms package) to a new features object.

## Value

An object of a class which is derived from features.

### Note

The file format of analyses for findFeaturesXCMS and findFeaturesXCMS3 must be mzML or mzXMI

findFeaturesBruker only works with Bruker data files (.d extension) and requires Bruker DataAnalysis and the **RDCOMClient** package to be installed. Furthermore, DataAnalysis combines multiple related masses in a feature (e.g. isotopes, adducts) but does not report the actual (monoisotopic) mass of the feature. Therefore, it is simply assumed that the feature mass equals that of the highest intensity mass peak.

If any errors related to DCOM appear it might be necessary to terminate DataAnalysis (note that DataAnalysis might still be running as a background process). The ProcessCleaner application installed with DataAnalayis can be used for this.

findFeaturesEnviPick Requires analysis files to be in the mzXML format.

The file format of analyses for findFeaturesOpenMS must be 'mzML'. This functionality has been tested with OpenMS version i = 2.0. Please make sure it is installed and its binaries are added to the PATH environment variable or the patRoon.path.OpenMS option is set.

# References

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pugixml (via Rcpp) is used to process OpenMS XML output.

Dirk Eddelbuettel and Romain Francois (2011). Rcpp: Seamless R and C++ Integration. Journal of Statistical Software, 40(8), 1-18. URL http://www.jstatsoft.org/v40/i08/.

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H. Paul Benton, Elizabeth J. Want and Timothy M. D. Ebbels Correction of mass calibration gaps in liquid chromatography-mass spectrometry metabolomics data Bioinformatics, 26:2488 (2010)

# See Also

features-class and analysis-information

feature-grouping

Grouping of features

# Description

Functions and classes for grouping of features across analyses.

# Usage

```
## S4 method for signature 'features'
groupFeatures(feat, algorithm, ..., verbose = TRUE)
importFeatureGroups(path, type, ...)
importFeatureGroupsBrukerPA(
   path,
   feat,
   rtWindow = 12,
   mzWindow = 0.005,
   intWindow = 5,
```

```
warn = TRUE
)
importFeatureGroupsEnviMass(path, feat, positive)
groupFeaturesOpenMS(
  feat,
  rtalign = TRUE,
  QT = FALSE,
 maxAlignRT = 30,
 maxAlignMZ = 0.005,
 maxGroupRT = 12,
 maxGroupMZ = 0.005,
  extraOptsRT = NULL,
  extraOptsGroup = NULL,
  verbose = TRUE
)
groupFeaturesXCMS(
  feat,
  rtalign = TRUE,
  exportedData = TRUE,
  groupArgs = list(mzwid = 0.015),
  retcorArgs = list(method = "obiwarp"),
  verbose = TRUE
)
importFeatureGroupsXCMS(xs, analysisInfo)
groupFeaturesXCMS3(
  feat,
  rtalign = TRUE,
  groupParam = xcms::PeakDensityParam(sampleGroups = analysisInfo(feat)$group),
  retAlignParam = xcms::ObiwarpParam(),
  verbose = TRUE
)
importFeatureGroupsXCMS3(xdata, analysisInfo)
```

# Arguments

. . .

The features to be grouped. importFeatureGroupsBrukerPA and importFeatureGroupsEnviMass only support features generated by findFeaturesBruker and importFeaturesEnviMass, respectively.

A character string describing the algorithm that should be used: "openms",

"xcms", "xcms3"

Any parameters to be passed to the selected grouping/importing algo-

rithm.

verbose if FALSE then no text output will be shown.

path The path that should be used for importing. For importFeatureGroupsBrukerPA

an exported 'bucket table' '.txt' file from Bruker ProfileAnalysis, for importFeatureGroupsBrukerTASQ an exported global result table (converted to '.csv') and for importFeatureGroupsEnviMass the path of the

enviMass project.

type Which file type should be imported or exported: "brukerpa" (Bruker Pro-

fileAnalysis), "brukertasq" (Bruker TASQ), envimass (enviMass, only

import) or "mzmine" (MZMine, only export).

rtWindow, mzWindow, intWindow

Search window values for retention time (seconds), m/z (Da) and intensity used to find back features within feature groups from PA (+/- the

retention/mass/intensity value of a feature).

warn Warn about missing or duplicate features when relating them back from

grouped features.

positive Whether data from positive (TRUE) or negative (FALSE) should be loaded.

rtalign Enable retention time alignment.

 ${\tt QT} \hspace{1.5cm} \textbf{If } enabled, use {\tt FeatureLinkerUnlabeledQT} instead of {\tt FeatureLinkerUnlabeled}$ 

for feature grouping.

maxAlignRT, maxAlignMZ

Used for retention alignment. Maximum retention time or m/z difference

(seconds/Dalton) for feature pairing. Sets -algorithm:pairfinder:distance\_RT:max\_difference and -algorithm:pairfinder:distance\_MZ:max\_difference otpions, respec-

tively.

maxGroupRT, maxGroupMZ

 $as \verb| maxAlignRT| and \verb| maxAlignMZ|, but for grouping of features. Sets \verb| -algorithm: distance_RT: max\_distance\_RT | and maxAlignMZ|, but for grouping of features. Sets \verb| -algorithm: distance\_RT: max\_distance\_RT | and maxAlignMZ|, but for grouping of features. Sets \verb| -algorithm: distance\_RT: max\_distance\_RT | and maxAlignMZ|, but for grouping of features. Sets \verb| -algorithm: distance\_RT: max\_distance\_RT: max\_distance\_RT:$ 

and -algorithm:distance\_MZ:max\_difference options, respectively.

extraOptsRT, extraOptsGroup

 $Named \ \textbf{list} \ containing \ extra \ options \ that \ will \ be \ passed \ to \ \textbf{MapAlignerPoseClustering}$ 

or FeatureLinkerUnlabeledQT/FeatureLinkerUnlabeled, respectively. Any

options specified here will override any of the above. Example: extraOptsGroup=list("-algorithms) options specified here will override any of the above.

(corresponds to setting maxGroupRT=12). Set to NULL to ignore.

exportedData Set to TRUE if analyses were exported as mzXML or mzML files.

groupArgs, retcorArgs

named character vector that can contain extra parameters to be used

by xcms::group and xcms::retcor, respectively.

xs An xcmsSet object.

analysisInfo A data.frame with analysis info.

 ${\tt groupParam, retAlignParam}$ 

parameter object that is directly passed to xcms::groupChromPeaks and

xcms::adjustRtime, respectively.

xdata An XCMSnExp object.

#### **Details**

After features have been found the logical next step is to align and group them across analyses. This process is necessary to allow comparison of features between multiple analyses, which otherwise would be difficult due to small deviations in retention and mass data. Thus, algorithms of 'feature groupers' are used to collect features with similar retention and mass data. In addition, advanced retention time alignment algorithms exist to enhance grouping of features even with relative large retention time deviations (e.g. possibly observed from analyses collected over a long period). Like finding of features, various algorithms are supported which may have many parameters that can be fine-tuned. This fine-tuning is likely to be necessary, since optimal settings often depend on applied methodology and instrumentation.

groupFeatures is a generic function that will group features using one of the supported algorithms. The actual functionality is provided by algorithm specific functions such as groupFeaturesOpenMS and groupFeaturesXCMS3. While these functions may be called directly, groupFeatures provides a generic interface and is therefore usually preferred.

importFeatureGroups is a generic function to import feature groups produced by other software. The actual functionality is provided by specific functions such as importFeatureGroupsBrukerPA and importFeatureGroupsEnviMass.

importFeatureGroupsBrukerPA imports grouped features generated with Bruker Profile-Analysis (PA). To do so, a 'bucket table' should be generated using PA and exported as '.txt' file. Please note that this function only supports features generated by findFeaturesBruker and it is crucial that DataAnalysis files remain unchanged when features are collected and the bucket table is generated. Furthermore, please note that PA does not retain information about originating features for generated buckets. For this reason, this function tries to find back the original features and care must be taken to correctly specify search parameters (rtWindow, mzWindow, intWindow).

importFeatureGroupsEnviMass imports grouped features ('profiles') generated with envi-Mass. Note that this function *only* imports 'raw' profiles, *not* any results from further componentization steps performed in enviMass. Furthermore, this functionality has only been tested with older versions of enviMass. Finally, please note that this function only supports features imported by importFeaturesEnviMass (obviously, the same project should be used for both importing functions).

groupFeaturesOpenMS uses the OpenMS tools for grouping of features (see <a href="http://www.openms.de">http://www.openms.de</a>). Retention times may be aligned by the <a href="MapAlignerPoseClustering">MapAlignerPoseClustering</a> TOPP tool. Grouping is achieved by either the <a href="FeatureLinkerUnlabeled">FeatureLinkerUnlabeled</a> Or <a href="FeatureLinkerUnlabeled">FeatureLinkerUnlabeled</a> OT TOPP tools.

groupFeaturesXCMS uses the xcms package for grouping of features. Grouping of features and alignment of their retention times are performed with the xcms::group and xcms::retcor functions, respectively. Both functions have an extensive list of parameters to modify their behaviour and may therefore be used to potentially optimize results.

importFeatureGroupsXCMS converts grouped features from an xcmsSet object (from the xcms package).

groupFeaturesXCMS3 uses the new interface from the xcms package for grouping of features. Grouping of features and alignment of their retention times are performed with the xcms::groupChromPeaks and xcms::adjustRtime functions, respectively. Both of these

functions support an extensive amount of parameters that modify their behaviour and may therefore require optimization.

importFeatureGroupsXCMS3 converts grouped features from an XCMSnExp object (from the xcms package).

#### Value

An object of a class which is derived from featureGroups.

#### References

Rost HL, Sachsenberg T, Aiche S, Bielow C, Weisser H, Aicheler F, Andreotti S, Ehrlich H, Gutenbrunner P, Kenar E, Liang X, Nahnsen S, Nilse L, Pfeuffer J, Rosenberger G, Rurik M, Schmitt U, Veit J, Walzer M, Wojnar D, Wolski WE, Schilling O, Choudhary JS, Malmstrom L, Aebersold R, Reinert K, Kohlbacher O (2016). "OpenMS: a flexible open-source software platform for mass spectrometry data analysis." *Nature Methods*, **13**(9), 741–748. doi: 10.1038/nmeth.3959.

pugixml (via Rcpp) is used to process OpenMS XML output.

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feature-optimization 63

# See Also

featureGroups-class

feature-optimization Optimization of feature finding and grouping parameters

# Description

Automatic optimization of feature finding and grouping parameters through Design of Experiments (DoE).

# Usage

```
optimizeFeatureGrouping(
  features,
  algorithm,
  templateParams = list(),
  paramRanges = list(),
 maxIterations = 50,
  maxModelDeviation = 0.1
)
generateFGroupsOptPSet(algorithm, ...)
getDefFGroupsOptParamRanges(algorithm)
optimizeFeatureFinding(
  anaInfo,
  algorithm,
  . . . ,
  templateParams = list(),
  paramRanges = list(),
  isoIdent = if (algorithm == "openms") "OpenMS" else "IPO",
  checkPeakShape = "none",
  CAMERAOpts = list(),
 maxIterations = 50,
  maxModelDeviation = 0.1
)
generateFeatureOptPSet(algorithm, ...)
getDefFeaturesOptParamRanges(algorithm, method = "centWave")
```

64 feature-optimization

## Arguments

features A features object with the features that should be used to optimize

grouping.

algorithm The algorithm used for finding or grouping features (see findFeatures

and groupFeatures).

.. One or more lists with parameter sets (see below) (for optimizeFeatureFinding

and optimizeFeatureGrouping). Alternatively, named arguments that set (and possibly override) the parameters that should be returned from

 ${\tt generateFeatureOptPSet} \ {\tt or} \ {\tt generateFGroupsOptPSet}.$ 

templateParams Template parameter set (see below).

paramRanges A list with vectors containing absolute parameter ranges (minimum/maximum)

that constrain numeric parameters choosen during experiments. See the  ${\tt getDefFeaturesOptParamRanges}$  and  ${\tt getDefFGroupsOptParamRanges}$  functions for defaults. Values should be  ${\tt Inf}$  when no limit should be used.

maxIterations Maximum number of iterations that may be performed to find optimimum

values. Used to restrict neededless long optimization procedures. In IPO

this was fixed to '50'.

maxModelDeviation

See the Potential suboptimal results by optimization model section below.

anaInfo Analysis info table (passed to findFeatures).

isoIdent Sets the algorithm used to identify isotopes. Valid values are: "IPO",

"CAMERA" and "OpenMS". The latter can only be used when OpenMS is

used to find features, and is highly recommended in this situation.

checkPeakShape Additional peak shape checking of isotopes. Only used if isoIdent="IPO".

Valid values: "none", "borderIntensity", "sinusCurve" or "normalDistr".

CAMERAOpts A list with additional arguments passed to CAMERA::findIsotopes when

isoIdent="CAMERA".

method Method used by XCMS to find features (only if algorithm="xcms").

#### Details

Many different parameters exist that may affect the output quality of feature finding and grouping. To avoid time consuming manual experimentation, functionality is provided to largely automate the optimization process. The methodology, which uses design of experiments (DoE), is based on the excellent Isotopologue Parameter Optimization (IPO) R package. The functionality of this package is directly integrated in patRoon. Some functionality was added or changed, however, the principle algorithm workings are nearly identical.

Compared to IPO, the following functionality was added or changed:

- The code was made more generic in order to include support for other feature finding/grouping algorithms (e.g. OpenMS, enviPick, XCMS3).
- The methodology of FeatureFinderMetabo (OpenMS) may be used to find isotopes.

- The maxModelDeviation parameter was added to potentially avoid suboptimal results (issue discussed here).
- The use of multiple 'parameter sets' (discussed below) which, for instance, allow optimizing qualitative paremeters more easily (see examples).
- More consistent optimization code for feature finding/grouping.
- More consistent output using S4 classes (*i.e.* optimizationResult class).
- Experiments are not (yet) executed in parallel (although feature finding or grouping may be if the algorithm supports it).

## Value

The optimizeFeatureFinding and optimizeFeatureGrouping return their results in a optimizationResult object.

# Parameter sets

Which parameters should be optimized is determined by a parameter set. A set is defined by a named list containing the minimum and maximum starting range for each parameter that should be tested. For instance, the set list(chromFWHM = c(5,10), mzPPM = c(5,15)) specifies that the chromFWHM and mzPPM parameters (used by OpenMS feature finding) should be optimized within a range of '5'-'10' and '5'-'15', respectively. Note that this range may be increased or decreased after a DoE iteration in order to find a better optimum. The absolute limits are controlled by the paramRanges function argument.

Multiple parameter sets may be specified (*i.e.* through the ... function argument). In this situation, the optimization algorithm is repeated for each set, and the final optimum is determined from the parameter set with the best response. The templateParams function argument may be useful in this case to define a template for each parameter set. Actual parameter sets are then constructed by joining each parameter set with the set specified for templateParams. When a parameter is defined in both a regular and template set, the parameter in the regular set takes precedence.

Parameters that should not be optimized but still need to be set for the feature finding/grouping functions should also be defined in a (template) parameter set. Which parameters should be optimized is determined whether its value is specified as a vector range or a single fixed value. For instance, when a set is defined as list(chromFWHM = c(5,10),mzPPM = 5), only the chromFWHM parameter is optimized, whereas mzPPM is kept constant at '5'.

Using multiple parameter sets with differing fixed values allows optimization of qualitative values (see examples below).

The parameters specified in parameter sets are directly passed through the findFeatures or groupFeatures functions. Hence, grouping and retention time alignment parameters used by XCMS should (still) be set through the groupArgs and retcorArgs parameters.

**NOTE:** For XCMS3, which normally uses parameter classes for settings its options, the parameters must be defined in a named list like any other algorithm. The set parameters are then used to automatically constructor of the right parameter class object (e.g. CentWaveParam, ObiwarpParam). For grouping/alignment sets, these parameters need to be specified in nested lists called groupParams and retAlignParams, respectively (similar to groupArgs/retcorArgs for algorithm="xcms"). Finally, the underlying XCMS method to

66 feature-optimization

be used should be defined in the parameter set (*i.e.* by setting the method field for feature parameter sets and the groupMethod and retAlignMethod for grouping/aligning parameter sets). See the examples below for more details.

**NOTE:** Similar to IPO, the peakwidth and prefilter parameters for XCMS feature finding should be split in two different values:

- The minimum and maximum ranges for peakwidth are optimized by setting min\_peakwidth and max\_peakwidth, respectively.
- The k and I parameters contained in prefilter are split in prefilter and value\_of\_prefilter, respectively.

#### **Functions**

The optimizeFeatureFinding and optimizeFeatureGrouping are the functions to be used to optimize parameters for feature finding and grouping, respectively. These functions are analogous to optimizeXcmsSet and optimizeRetGroup from **IPO**.

The generateFeatureOptPSet and generateFGroupsOptPSet functions may be used to generate a parameter set for feature finding and grouping, respectively. Some algorithm dependent default parameter optimization ranges will be returned. These functions are analogous to getDefaultXcmsSetStartingParams and getDefaultRetGroupStartingParams from IPO. However, unlike their IPO counterparts, these functions will not output default fixed values. The generateFGroupsOptPSet will only generate defaults for density grouping if algorithm="xcms".

The getDefFeaturesOptParamRanges and getDefFGroupsOptParamRanges return the default absolute optimization parameter ranges for feature finding and grouping, respectively. These functions are useful if you want to set the paramRanges function argument.

# Potential suboptimal results by optimization model

After each experiment iteration an optimimum parameter set is found by generating a model containing the tested parameters and their responses. Sometimes the actual response from the parameters derived from the model is actually significantly lower than expected. When the response is lower than the maximum reponse found during the experiment, the parameters belonging to this experimental maximum may be choosen instead. The maxModelDeviation argument sets the maximum deviation in response between the modelled and experimental maxima. The value is relative: '0' means that experimental values will always be favored when leading to improved responses, whereas 1 will effectively disable this procedure (and return to 'regular' IPO behaviour).

# Source

The code and methodology is a direct adaptation from the IPO R package.

#### References

Libiseller G, Dvorzak M, Kleb U, Gander E, Eisenberg T, Madeo F, Neumann S, Trausinger G, Sinner F, Pieber T, Magnes C (2015). "IPO: a tool for automated optimization of XCMS parameters." *BMC Bioinformatics*, **16**(1). doi: 10.1186/s1285901505628, https://doi.org/10.1186/s12859-015-0562-8.

# Examples

```
# example data from patRoonData package
dataDir <- patRoonData::exampleDataPath()</pre>
anaInfo <- generateAnalysisInfo(dataDir)</pre>
anaInfo <- anaInfo[1:2, ] # only focus on first two analyses (e.g. training set)
# optimize mzPPM and chromFWHM parameters
ftOpt <- optimizeFeatureFinding(anaInfo, "openms", list(mzPPM = c(5, 10), chromFWHM = c(4, 8)))
# optimize chromFWHM and isotopeFilteringModel (a qualitative parameter)
ftOpt2 <- optimizeFeatureFinding(anaInfo, "openms",
                                  list(isotopeFilteringModel = "metabolites (5% RMS)"),
                                  list(isotopeFilteringModel = "metabolites (2% RMS)"),
                                  templateParams = list(chromFWHM = c(4, 8)))
# perform grouping optimization with optimized features object
fgOpt <- optimizeFeatureGrouping(optimizedObject(ftOpt), "xcms",</pre>
                                  list(groupArgs = list(bw = c(22, 28)),
                                       retcorArgs = list(method = "obiwarp")))
# same, but using the XCMS3 interface
fgOpt2 <- optimizeFeatureGrouping(optimizedObject(ftOpt), "xcms3",</pre>
                         list(groupMethod = "density", groupParams = list(bw = c(22, 28)),
                                        retAlignMethod = "obiwarp"))
# plot contour of first parameter set/DoE iteration
plot(ftOpt, paramSet = 1, DoEIteration = 1, type = "contour")
# generate parameter set with some predefined and custom parameters to be
# optimized.
pSet <- generateFeatureOptPSet("openms", chromSNR = c(3, 9),</pre>
                                useSmoothedInts = FALSE)
```

featureGroups-class Base class

Base class for grouped features.

# Description

This class holds all the information for grouped features.

# Usage

```
## S4 method for signature 'featureGroups'
names(x)

## S4 method for signature 'featureGroups'
analyses(obj)
```

```
## S4 method for signature 'featureGroups'
replicateGroups(obj)
## S4 method for signature 'featureGroups'
groupNames(obj)
## S4 method for signature 'featureGroups'
length(x)
## S4 method for signature 'featureGroups'
show(object)
## S4 method for signature 'featureGroups'
groups(object, areas = FALSE)
## S4 method for signature 'featureGroups'
analysisInfo(obj)
## S4 method for signature 'featureGroups'
groupInfo(fGroups)
## S4 method for signature 'featureGroups'
featureTable(obj)
## S4 method for signature 'featureGroups'
getFeatures(obj)
## S4 method for signature 'featureGroups'
groupFeatIndex(fGroups)
## S4 method for signature 'featureGroups, ANY, ANY, missing'
x[i, j, ..., rGroups, drop = TRUE]
## S4 method for signature 'featureGroups, ANY, ANY'
x[[i, j]]
## S4 method for signature 'featureGroups'
## S4 method for signature 'featureGroups'
export(fGroups, type, out)
## S4 method for signature 'featureGroups'
as.data.table(
  average = FALSE,
  areas = FALSE,
```

```
features = FALSE,
  regression = FALSE
)
## S4 method for signature 'featureGroups, ANY'
plot(
 х,
  colourBy = c("none", "rGroups", "fGroups"),
  onlyUnique = FALSE,
  retMin = FALSE,
  showLegend = TRUE,
  col = NULL,
  pch = NULL,
)
## S4 method for signature 'featureGroups'
plotInt(obj, average = FALSE, pch = 20, type = "b", lty = 3, col = NULL, ...)
## S4 method for signature 'featureGroups'
plotChord(
  obj,
  addSelfLinks = FALSE,
  addRetMzPlots = TRUE,
  average = FALSE,
 outerGroups = NULL,
  addIntraOuterGroupLinks = FALSE,
)
## S4 method for signature 'featureGroups'
plotEIC(
  obj,
  rtWindow = 30,
  mzWindow = 0.005,
  retMin = FALSE,
  topMost = NULL,
  EICs = NULL,
  showPeakArea = FALSE,
  showFGroupRect = TRUE,
  title = NULL,
  colourBy = c("none", "rGroups", "fGroups"),
  showLegend = TRUE,
  onlyPresent = TRUE,
  annotate = c("none", "ret", "mz"),
  showProgress = FALSE,
  xlim = NULL,
  ylim = NULL,
```

```
## S4 method for signature 'featureGroups'
plotVenn(obj, which = NULL, ...)

## S4 method for signature 'featureGroups'
plotUpSet(obj, which = NULL, nsets = length(which), nintersects = NA, ...)

## S4 method for signature 'featureGroups'
unique(x, which, relativeTo = NULL, outer = FALSE)

## S4 method for signature 'featureGroups'
overlap(fGroups, which, exclusive = FALSE)
```

# Arguments

areas If set to TRUE then areas are considered instead of peak intensities.

fGroups, obj, x, object

featureGroups object to be accessed.

i, j A numeric or character value which is used to select analyses/feature groups by their index or name, respectively (for the order/names see analyses()/names()).

For [: Can also be logical to perform logical selection (similar to regular vectors). If missing all analyses/feature groups are selected.

For [[: should be a scalar value. If j is not specified, i selects by feature

groups instead.

... Ignored for "[" operator or passed to plot (plot and plotEIC), lines

(plotInt), VennDiagram plotting functions (plotVenn), chordDiagram

(plotChord) or upset (plotUpSet).

rGroups An optional character vector: if specified only keep results for the given

replicate groups (equivalent to the rGroups argument to filter).

drop ignored.

name The feature group name (partially matched).

out The destination file for the exported data.

average data within replicate groups.

features If TRUE then feature specific data will be added. If average=TRUE this

data will be averaged for each feature group.

regression Set to TRUE to add regression data for each feature group. For this a

linear model is created (intensity/area [depending on areas argument] vs concentration). The model concentrations (e.g. of a set of standards) is derived from the conc column of the analysis information. From this model the intercept, slope and R2 is added to the output. In addition, when features=TRUE, concentrations for each feature are added. Note

that no regression information is added when no conc column is present in the analysis information or when less than two concentrations are specified

(i.e. the minimum amount).

colourBy Sets the automatic colour selection: "none" for a single colour or "rGroups"/"fGroups"

for a distinct colour per replicate/feature group.

onlyUnique If TRUE and colourBy="rGroups" then only feature groups that are unique

to a replicate group are plotted.

retMin Plot retention time in minutes (instead of seconds).

showLegend If TRUE a legend will be shown with either replicate groups (colourBy ==

"rGroups") or feature groups (colourBy == "fGroups", only for plotEIC).

If colourBy is "none" no legend will be shown.

col Colour(s) used. If col=NULL then colours are automatically generated.

pch, type, lty Common plotting parameters passed to e.g. plot. For plot: if pch=NULL

then values are automatically assigned.

addSelfLinks If TRUE then 'self-links' are added which represent non-shared data.

addRetMzPlots Set to TRUE to enable m/z vs retention time scatter plots.

outerGroups Character vector of names to be used as outer groups. The values in the

specified vector should be named by analysis names (average set to FALSE)
or replicate group names (average set to TRUE), for instance: c(analysis1
= "group1",analysis2 = "group1",analysis3 = "group2"). Set to NULL

to disable outer groups.

addIntraOuterGroupLinks

If TRUE then links will be added within outer groups.

rtWindow Retention time (in seconds) that will be subtracted/added to respectively

the minimum and maximum retention time of the plotted feature groups. Thus, setting this value to a positive value will 'zoom out' on the retention

time axis.

mzWindow The m/z value (in Da) which will be subtracted/added to a feature group

m/z value to determine the width of its EIC.

topMost Only plot EICs from features within this number of top most intense

analyses. If NULL then all analyses are used for plotted.

EICS Internal parameter for now and should be kept at NULL (default).

showPeakArea Set to TRUE to display integrated chromatographic peak ranges by filling

(shading) their areas.

showFGroupRect Set to TRUE to mark the full retention/intensity range of all features within

a feature group by drawing a rectangle around it.

title Character string used for title of the plot. If NULL a title will be automat-

ically generated.

onlyPresent If TRUE then EICs will only be generated for analyses in which a particular

feature group was detected. Disabling this option might be useful to see

if any features were 'missed'.

annotate If set to "ret" and/or "mz" then retention and/or m/z values will be

drawn for each plotted feature group.

showProgress if set to TRUE then a text progressbar will be displayed when all EICs are

being plot. Set to "none" to disable any annotation.

xlim, ylim Sets the plot size limits used by plot. Set to NULL for automatic plot

sizing.

which A character vector with replicate groups used for comparison. For plotting

functions: set to NULL for all replicate groups.

nsets, nintersects

See upset.

relativeTo A character vector with replicate groups that should be used for unique

comparison. If NULL then all replicate groups are used for comparison.

Replicate groups specified in which are ignored.

outer If TRUE then only feature groups are kept which do not overlap between

the specified replicate groups for the which parameter.

exclusive If TRUE then all feature groups are removed that are not unique to the

given replicate groups.

#### **Details**

The featureGroup class is the workhorse of **patRoon**: almost all functionality operate on its instantiated objects. The class holds all information from grouped features (obtained from features). This class itself is virtual, hence, objects are not created directly from it. Instead, 'feature groupers' such as groupFeaturesXCMS return a featureGroups derived object after performing the actual grouping of features across analyses.

# Value

plotVenn (invisibly) returns a list with the following fields:

- gList the gList object that was returned by the utilized VennDiagram plotting function.
- areas The total area for each plotted group.
- intersectionCounts The number of intersections between groups.

The order for the areas and intersectionCounts fields is the same as the parameter order from the used plotting function (see *e.g.* draw.pairwise.venn and draw.triple.venn).

# Methods (by generic)

- names: Obtain feature group names.
- analyses: returns a character vector with the names of the analyses for which data is present in this object.
- replicateGroups: returns a character vector with the names of the replicate groups for which data is present in this object.
- groupNames: Same as names. Provided for consistency to other classes.
- length: Obtain number of feature groups.
- show: Shows summary information for this object.

featureGroups-class 73

- groups: Accessor for groups slot.
- analysisInfo: Obtain analysisInfo (see analysisInfo slot in features).
- groupInfo: Accessor for groupInfo slot.
- featureTable: Obtain feature information (see features).
- getFeatures: Accessor for features slot.
- groupFeatIndex: Accessor for ftindex slot.
- [: Subset on analyses/feature groups.
- [[: Extract intensity values.
- \$: Extract intensity values for a feature group.
- export: Exports feature groups to a '.csv' file that is readable to Bruker ProfileAnalysis (a 'bucket table'), Bruker TASQ (an analyte database) or that is suitable as input for the Targeted peak detection functionality of MZmine.
- as.data.table: Obtain a summary table (a data.table) with retention, m/z, intensity and optionally other feature data.
- plot: Generates an m/z vs retention time plot for all feature groups. Optionally highlights unique/overlapping presence amongst replicate groups.
- plotInt: Generates a line plot for the (averaged) intensity of feature groups within all analyses
- plotChord: Generates a chord diagram which can be used to visualize shared presence of feature groups between analyses or replicate groups. In addition, analyses/replicates sharing similar properties (e.g. location, age, type) may be grouped to enhance visualization between these 'outer groups'.
- ploteic: Plots extracted ion chromatograms (EICs) of feature groups.
- plotVenn: plots a Venn diagram (using VennDiagram) outlining unique and shared feature groups between up to five replicate groups.
- plotUpSet: plots an UpSet diagram (using the upset function) outlining unique and shared feature groups between given replicate groups.
- unique: Obtain a subset with unique feature groups present in one or more specified replicate group(s).
- overlap: Obtain a subset with feature groups that overlap between a set of specified replicate group(s).

#### Slots

- groups Matrix (data.table) with intensities for each feature group (columns) per analysis (rows). Access with groups method.
- analysisInfo, features Analysis info and features class associated with this object. Access with analysisInfo and featureTable methods, respectively.
- groupInfo data.frame with retention time (rts column, in seconds) and m/z (mzs column) for each feature group. Access with groupInfo method.
- ftindex Matrix (data.table) with feature indices for each feature group (columns) per analysis (rows). Each index corresponds to the row within the feature table of the analysis (see featureTable).

### S4 class hierarchy

- workflowStep
  - featureGroups
    - \* featureGroupsBruker
    - \* featureGroupsConsensus
    - \* featureGroupsEnviMass
    - \* featureGroupsOpenMS
    - \* featureGroupsScreening
    - \* featureGroupsBrukerTASQ
    - \* featureGroupsXCMS
    - \* featureGroupsXCMS3

#### References

Gu, Z. (2014) circlize implements and enhances circular visualization in R. Bioinformatics. Conway JR, Lex A, Gehlenborg N (2017). "UpSetR: an R package for the visualization of intersecting sets and their properties." *Bioinformatics*, **33**(18), 2938-2940. doi: 10.1093/bioinformatics/btx364, http://dx.doi.org/10.1093/bioinformatics/btx364.

Lex A, Gehlenborg N, Strobelt H, Vuillemot R, Pfister H (2014). "UpSet: Visualization of Intersecting Sets." *IEEE Transactions on Visualization and Computer Graphics*, **20**(12), 1983–1992. doi: 10.1109/tvcg.2014.2346248, https://doi.org/10.1109/tvcg.2014.2346248.

featureGroups-compare Comparing feature groups

### Description

Functionality to compare feature groups and make a consensus.

### Usage

```
## S4 method for signature 'featureGroups'
comparison(..., groupAlgo, groupArgs = list(rtalign = FALSE))
## S4 method for signature 'featureGroupsComparison,ANY'
plot(x, retMin = TRUE, ...)
## S4 method for signature 'featureGroupsComparison'
plotVenn(obj, which = NULL, ...)
## S4 method for signature 'featureGroupsComparison'
plotUpSet(obj, which = NULL, ...)
```

```
## S4 method for signature 'featureGroupsComparison'
plotChord(obj, addSelfLinks = FALSE, addRetMzPlots = TRUE, ...)

## S4 method for signature 'featureGroupsComparison'
consensus(
  obj,
  absMinAbundance = NULL,
  relMinAbundance = NULL,
  uniqueFrom = NULL,
  uniqueOuter = FALSE
)
```

#### Arguments

. . .

For comparison: featureGroups objects that should be compared. If the arguments are named  $(e.g. \, \text{myGroups} = \text{fGroups})$  then these are used for labelling, otherwise objects are automatically labelled by their algorithm. For plot, plotVenn, plotChord: further options passed to plot, VennDiagram plotting functions  $(e.g. \, \text{draw.pairwise.venn})$  and chordDiagram respectively.

For plotUpSet: any further arguments passed to the plotUpSet method defined for featureGroups.

groupAlgo

The feature grouping algorithm that should be used for grouping *pseudo* features (see details). Valid values are: "xcms" or "openms". Note: xcms3 is not (yet) supported.

groupArgs

A list containing further parameters for feature grouping.

x, obj

The featureGroupsComparison object.

retMin

If TRUE retention times are plotted as minutes (seconds otherwise).

which

A character vector specifying one or more labels of compared feature

groups. For plotVenn: if NULL then all compared groups are used.

addSelfLinks

If TRUE then 'self-links' are added which represent non-shared data.

 ${\it addRetMzPlots}$ 

Set to TRUE to enable m/z vs retention time scatter plots.

absMinAbundance, relMinAbundance

Minimum absolute or relative ('0-1') abundance across objects for a result to be kept. For instance, relMinAbundance=0.5 means that a result should be present in at least half of the number of compared objects. Set to 'NULL' to ignore and keep all results. Limits cannot be set when uniqueFrom is not NULL.

uniqueFrom

Set this argument to only retain feature groups that are unique within one or more of the objects for which the consensus is made. Selection is done by setting the value of uniqueFrom to a logical (values are recycled), numeric (select by index) or a character (as obtained with algorithm(obj)). For logical and numeric values the order corresponds to the order of the objects given for the consensus. Set to NULL to ignore.

uniqueOuter

If uniqueFrom is not NULL and if uniqueOuter=TRUE: only retain data that are also unique between objects specified in uniqueFrom.

#### **Details**

Feature groups objects originating from differing feature finding and/or grouping algorithms (or their parameters) may be compared to assess their output and generate a consensus.

The comparison method generates a featureGroupsComparison object from given feature groups objects, which in turn may be used for (visually) comparing presence of feature groups and generating a consensus. Internally, this function will collapse each feature groups object to pseudo features objects by averaging their retention times, m/z values and intensities, where each original feature groups object becomes an 'analysis'. All pseudo features are then grouped using regular feature grouping algorithms so that a comparison can be made.

plot generates an m/z vs retention time plot.

plotVenn plots a Venn diagram outlining unique and shared feature groups between up to five compared feature groups.

plotUpSet plots an UpSet diagram outlining unique and shared feature groups.

plotChord plots a chord diagram to visualize the distribution of feature groups.

consensus combines all compared feature groups and averages their retention, m/z and intensity data.

#### Value

comparison returns a featureGroupsComparison object.

plotVenn (invisibly) returns a list with the following fields:

- gList the gList object that was returned by the utilized VennDiagram plotting function.
- areas The total area for each plotted group.
- intersectionCounts The number of intersections between groups.

The order for the areas and intersectionCounts fields is the same as the parameter order from the used plotting function (see e.g. draw.pairwise.venn and draw.triple.venn).

consensus returns a featureGroups object with a consensus from the compared feature groups.

featureGroupsComparison-class

Feature groups comparison class

### Description

This class is used for comparing different featureGroups objects.

### Usage

```
## $4 method for signature 'featureGroupsComparison'
names(x)

## $4 method for signature 'featureGroupsComparison'
length(x)

## $4 method for signature 'featureGroupsComparison,ANY,missing,missing'
x[i, j, ..., drop = TRUE]

## $4 method for signature 'featureGroupsComparison,ANY,missing'
x[[i, j]]

## $4 method for signature 'featureGroupsComparison'
x$name
```

### Arguments

X	m A featureGroupsComparison $ m object.$			
i	A numeric or character value which is used to select labels by their index or name, respectively (for the order/names see names()).			
	For [: Can also be logical to perform logical selection (similar to regular vectors). If missing all labels are selected.			
	For [[: should be a scalar value.			
	Ignored.			
drop, j	ignored.			
name	The label name (partially matched).			

### Details

Objects from this class are returned by comparison.

## Methods (by generic)

- names: Obtain the labels that were given to each compared feature group.
- length: Number of feature groups objects that were compared.
- [: Subset on labels that were assigned to compared feature groups.
- [[: Extract a featureGroups object by its label.
- \$: Extract a compound table for a feature group.

## Slots

```
fGroupsList A list of featureGroups object that were compared comparedFGroups A pseudo featureGroups object containing grouped feature groups.
```

78 features-class

features-class

Base features class

# Description

Holds information for all features present within a set of analysis.

## Usage

```
## S4 method for signature 'features'
length(x)
## S4 method for signature 'features'
show(object)
## S4 method for signature 'features'
featureTable(obj)
## S4 method for signature 'features'
analysisInfo(obj)
## S4 method for signature 'features'
analyses(obj)
## S4 method for signature 'features'
replicateGroups(obj)
## S4 method for signature 'features'
as.data.table(x)
## S4 method for signature 'features'
filter(
  obj,
  absMinIntensity = NULL,
  relMinIntensity = NULL,
  retentionRange = NULL,
 mzRange = NULL,
 mzDefectRange = NULL,
  chromWidthRange = NULL,
  negate = FALSE
)
## S4 method for signature 'features, ANY, missing, missing'
x[i, j, ..., drop = TRUE]
## S4 method for signature 'features, ANY, missing'
x[[i]]
```

features-class 79

```
## S4 method for signature 'features'
x$name

## S4 method for signature 'featuresXCMS,ANY,missing,missing'
x[i, j, ..., drop = TRUE]

## S4 method for signature 'featuresXCMS'
filter(obj, ...)

## S4 method for signature 'featuresXCMS3,ANY,missing,missing'
x[i, j, ..., drop = TRUE]

## S4 method for signature 'featuresXCMS3'
filter(obj, ...)
```

### **Arguments**

obj, x, object features object to be accessed
absMinIntensity, relMinIntensity

Minimum absolute/relative intensity for features to be kept. The relative intensity is determined from the feature with highest intensity (within the same analysis). Set to '0' or NULL to skip this step.

retentionRange, mzRange, mzDefectRange, chromWidthRange

Range of retention time (in seconds), m/z, mass defect (defined as the decimal part of m/z values) or chromatographic peak width (in seconds), respectively. Features outside this range will be removed. Should be a numeric vector with length of two containing the min/max values. The maximum can be Inf to specify no maximum range. Set to NULL to skip this step.

negate

If set to TRUE then filtering operations are performed in opposite manner.

i

A numeric or character value which is used to select analyses by their index or name, respectively (for the order/names see analyses()).

For [: Can also be logical to perform logical selection (similar to regular vectors). If missing all analyses are selected.

For [[: should be a scalar value.

... Ignored. drop, j ignored.

name

The analysis name (partially matched).

#### **Details**

This class provides a way to store intensity, retention times, m/z and other data for all features in a set of analyses. The class is virtual and derived objects are created by 'feature finders' such as findFeaturesOpenMS, findFeaturesXCMS and findFeaturesBruker.

80 features-class

### Value

featureTable: A list containing a data.table for each analysis with feature data analysisInfo: A data.frame containing a column with analysis name (analysis), its path (path), and other columns such as replicate group name (group) and blank reference (blank).

### Methods (by generic)

- length: Obtain total number of features.
- show: Shows summary information for this object.
- featureTable: Get table with feature information
- analysisInfo: Get analysis information
- analyses: returns a character vector with the names of the analyses for which data is present in this object.
- replicateGroups: returns a character vector with the names of the replicate groups for which data is present in this object.
- as.data.table: Returns all feature data in a table.
- filter: Performs common rule based filtering of features. Note that this (and much more) functionality is also provided by the filter method defined for featureGroups. However, filtering a features object may be useful to avoid grouping large amounts of features.
- [: Subset on analyses.
- [[: Extract a feature table for an analysis.
- \$: Extract a feature table for an analysis.

### Slots

features List of features per analysis file. Use the featureTable method for access. analysisInfo Analysis group information. Use the analysisInfo method for access.

## S4 class hierarchy

- workflowStep
  - features
    - \* featuresFromFeatGroups
    - \* featuresConsensus
    - \* featuresBruker
    - \* featuresEnviPick
    - \* featuresOpenMS
    - \* featuresBrukerTASQ
    - \* featuresXCMS
    - \* featuresXCMS3

#### See Also

feature-finding

formula-generation

Automatic chemical formula generation

## Description

Functionality to automatically calculate chemical formulae for all feature groups.

## Usage

```
## S4 method for signature 'featureGroups'
generateFormulas(fGroups, algorithm, ...)
generateFormulasDA(
  fGroups,
  precursorMzSearchWindow = 0.002,
 MSMode = "both",
  adduct,
  featThreshold = 0.75,
  save = TRUE,
  close = save
)
generateFormulasGenForm(
  fGroups,
 MSPeakLists,
  relMzDev = 5,
  adduct = "[M+H]+",
  elements = "CHNOP",
  hetero = TRUE,
  oc = FALSE,
  extraOpts = NULL,
  calculateFeatures = TRUE,
  featThreshold = 0.75,
 MSMode = "both",
  isolatePrec = TRUE,
  timeout = 120,
  topMost = 50,
  maxProcAmount = getOption("patRoon.maxProcAmount"),
  batchSize = 8
)
generateFormulasSIRIUS(
  fGroups,
 MSPeakLists,
  relMzDev = 5,
  adduct = "[M+H]+",
  elements = "CHNOP",
```

```
profile = "qtof",
  database = NULL,
  noise = NULL,
  cores = NULL,
  topMost = 100,
  extraOptsGeneral = NULL,
  extraOptsFormula = NULL,
  calculateFeatures = TRUE,
  featThreshold = 0.75,
  verbose = TRUE,
  SIRBatchSize = 0,
 logPath = file.path("log", "sirius_formulas"),
 maxProcAmount = getOption("patRoon.maxProcAmount")
)
formulaScorings()
```

#### Arguments

**fGroups** 

featureGroups object for which formulae should be generated. This should be the same or a subset of the object that was used to create the specified MSPeakLists (only relevant for algorithms using MSPeakLists). In the case of a subset only the remaining feature groups in the subset are considered.

algorithm

A character string describing the algorithm that should be used: "bruker", "genform", "sirius"

Any parameters to be passed to the selected formula generation algorithm. precursorMzSearchWindow

> Search window for m/z values (+/- the feature m/z) used to find back feature data of precursor/parent ions from MS/MS spectra (this data is not readily available from SmartFormula3D results).

MSMode

Whether formulae should be generated only from MS data ("ms"), MS/MS data ("msms") or both ("both").

For GenForm selecting "both" will fall back to formula calculation with only MS data in case no MS/MS data is available.

For calulation with Bruker DataAnalysis selecting "both" will calculate formulae from MS data and MS/MS data and combines the results (duplicated formulae are removed). This is useful when poor MS/MS data would exclude proper candidates.

adduct

An adduct object (or something that can be converted to it with as.adduct). Examples: "[M-H]-", "[M+Na]+".

featThreshold

If calculateFeatures=TRUE: minimum presence ('0-1') of a formula in all features before it is considered as a candidate for a feature group. For instance, featThreshold dictates that a formula should be present in at least 75 feature group.

close, save

If TRUE then Bruker files are closed and saved after processing with Data-Analysis, respectively. Setting close=TRUE prevents that many analyses

might be opened simultaneously in DataAnalysis, which otherwise may use excessive memory or become slow. By default save is TRUE when close is TRUE, which is likely what you want as otherwise any processed data is lost.

MSPeakLists

An MSPeakLists object that was generated for the supplied fGroups.

relMzDev

Maximum relative deviation between the measured and candidate formula m/z values (in ppm). Sets the 'ppm' and '--ppm-max' commandline options for GenForm and SIRIUS, respectively.

elements

Elements to be considered for formulae calculation. This will heavily affects the number of candidates! Always try to work with a minimal set by excluding elements you don't expect. For generateFormulasSIRIUS, the minimum/maximum number of elements can also be specified, for example: a value of "C[5]H[10-15]0" will only consider formulae with up to five carbon atoms, between ten and fifteen hydrogen atoms and any amount of oxygen atoms. Sets the 'el' and '--elements' commandline options for GenForm and SIRIUS, respectively.

hetero

Only consider formulae with at least one hetero atom. Sets the 'het' commandline option.

ОС

Only consider organic formulae (i.e. with at least one carbon atom). Sets the 'oc' commandline option.

extraOpts

An optional character vector with any other commandline options that will be passed to GenForm or SIRIUS. See the GenForm options section/SIRIUS manual for all available commandline options.

calculateFeatures

If TRUE fomulae are first calculated for all features prior to feature group assignment (see details).

isolatePrec

Settings used for isolation of precursor mass peaks and their isotopes. This isolation is highly important for accurate isotope scoring of candidates, as non-relevant mass peaks will dramatically decrease the score. The value of isolatePrec should either be a list with parameters (see the filter method for MSPeakLists for more details), TRUE for default parameters (the z parameter is automatically deduced from the adduct argument) or FALSE for no isolation (e.g. when you already performed isolation with the filter method).

timeout

Maximum time (in seconds) that a GenForm command is allowed to execute. If this time is exceeded a warning is emitted and the command is terminated. See the notes section for more information on the need of timeouts.

topMost

Only keep this number of candidates (per feature group) with highest score. For SIRIUS: Sets the '--candidates' commandline option.

maxProcAmount

Maximum number of processes to run for parallelization. Usually a number close to the amount of physical cores yields most efficient results.

batchSize

Maximum number of GenForm commands that should be run sequentially in each parallel process. Combining commands with short runtimes (such as GenForm) can significantly increase parallel performance. For more information see executeMultiProcess.

profile Name of the configuration profile, for example: "qtof", "orbitrap",

"fticr". Sets the '--profile' commandline option.

database If not NULL, use a database for retrieval of formula candidates. Possible

values are: "pubchem", "bio", "kegg", "hmdb". Sets the '--database'

commandline option.

noise Median intensity of the noise (NULL ignores this parameter). Sets the

'--noise' commandline option.

cores The number of cores SIRIUS will use. If NULL then the default of all cores

will be used.

extraOptsGeneral, extraOptsFormula

a character vector with any extra commandline parameters for SIRIUS. For SIRIUS versions <4.4 there is no distinction between general and formula options. Otherwise commandline options specified in extraOptsGeneral are added prior to the formula command, while options specified in extraOptsFormula are added in afterwards. See the SIRIUS manual for

more details. Set to NULL to ignore.

verbose If TRUE then more output is shown in the terminal.

SIRBatchSize The maximum number of calculations done by SIRIUS. If this number is

less than the amount of features to be calculated then calculations will be evenly split over multiple SIRIUS calls (which may be run in parallel if maxProcAmount>1). If SIRBatchSize=0 then all feature calculations are

performed from a single SIRIUS exection, which is often the fastest.

logPath Destination directory for log files with output from executed commands.

Will be created if non-existant. Set to NULL to disable logging.

### **Details**

Several algorithms are provided to automatically generate formulae for given feature groups. All tools use the accurate mass of a feature to back-calculate candidate formulae. Depending on the algorithm and data availability, other data such as isotopic pattern and MS/MS fragments may be used to further improve formula assignment and ranking.

When DataAnalysis is used for formula generation or calculateFeatures=TRUE formulae are first calculated for each feature. The results are then combined for final assignment of candidate formulae for each feature group. If a formula was found in multiple features within the group, the reported scorings and mass errors are averaged and other numeric values are those from the feature in the analysis of the "analysis" column. The calculation of formulae on 'feature level' might result in a more thorough formula search and better removal of outliers (controlled by featThreshold argument). In contrast, when calculations occur on 'feature group level' (i.e. calculateFeatures=FALSE), formulae are directly assigned to each feature group (by using group averaged peak MS lists), which significantly reduces processing time is, especially with many analyses. Note that in both situations subsequent algorithms that use formula data (e.g. addFormulaScoring and reporting functions) only use formula data that was eventually assigned to feature groups. Furthermore, please note that calculation of formulae with DataAnalysis always occurs on 'feature level'.

generateFormulas is a generic function that will generate formulae using one of the supported algorithms. The actual functionality is provided by algorithm specific functions

such as generateFormulasDA and generateFormulasGenForm. While these functions may be called directly, generateFormulas provides a generic interface and is therefore usually preferred.

generateFormulasDA uses Bruker DataAnalysis to generate chemical formulae. This method supports scoring based on overlap between measured and theoretical isotopic patterns (both MS and MS/MS data) and the presence of 'fitting' MS/MS fragments. The method will iterate through all features (or "Compounds" in DataAnalysis terms) and call SmartFormula (and SmartFormula3D if MS/MS data is available) to generate all formulae. Parameters affecting formula calculation have to be set in advance within the DataAnalysis method for each analysis (e.g. by setDAMethod). This method requires that features were obtained with findFeaturesBruker. Unlike other algorithms, there is no prior need to generate MS peak lists.

generateFormulasGenForm uses GenForm to generate chemical formulae. When MS/MS data is available it will be used to score candidate formulae by presence of 'fitting' fragments.

generateFormulasSIRIUS uses SIRIUS to generate chemical formulae. Similarity of measured and theoretical isotopic patterns will be used for scoring candidates. Note that SIRIUS requires availability of MS/MS data.

formulaScorings returns a data.frame with information on which scoring terms are used and what their algorithm specific name is.

#### Value

A formulas object containing all generated formulae.

#### **Scorings**

Each algorithm implements their own scoring system. Their names have been harmonized where possible. An overview is obtained with the formulaScorings function:

name	${f genform}$	sirius	bruker	description
combMatch	$comb\_match$	-	-	MS and MS/MS combined match value
$frag_mSigma$	-	-	mSigma (SmartFormula3D)	Deviation of isotopic pattern of fragment
$frag\_score$	-	-	Score (SmartFormula3D)	MS/MS fragment score
isoScore	$MS\_match$	isoScore	-	How well the isotopic pattern matches
mSigma	-	-	mSigma	Deviation of the isotopic pattern
MSMSScore	$MSMS\_match$	treeScore	-	How well MS/MS data matches
score	-	score	Score	Overall MS formula score

### GenForm options

Below is a list of options (generated by running GenForm without commandline options) which can be set by the extraOpts parameter.

```
Formula calculation from MS and MS/MS data as described in Meringer et al (2011) MATCH Commun Math Comput Chem 65: 259-290 Usage: GenForm ms=<filename> [msms=<filename>] [out=<filename>] [exist[=mv]] [m=<number>] [ion=-e|+e|-H|+H|+Na] [cha=<number>] [ppm=<number>] [msmv=ndp|nsse|nsae] [acc=<number>] [rej=<number>]
```

[thms=<number>] [thmsms=<number>] [thcomb=<number>] [sort[=ppm|msmv|msmsmv|combmv]] [el=<elements> [oc]] [ff=<fuzzy formula>] [vsp[=<even|odd>]] [vsm2mv[=<value>]] [vsm2ap2[=<value>]] [hcf] [wm[=lin|sqrt|log]] [wi[=lin|sqrt|log]] [exp=<number>] [oei] [dbeexc=<number>] [ivsm2mv=<number>] [vsm2ap2=<number>] [oms[=<filename>]] [omsms[=<filename>]] [oclean[=<filename>]] [analyze [loss] [intens]] [dbe] [cm] [pc] [sc] Explanation: : filename of MS data (\*.txt) ms msms : filename of MS/MS data (\*.txt) : output generated formulas out : allow only molecular formulas for that at least one exist structural formula exists; overrides vsp, vsm2mv, vsm2ap2; argument mv enables multiple valencies for P and S m : experimental molecular mass (default: mass of MS basepeak) ion : type of ion measured (default: M+H) : accuracy of measurement in parts per million (default: 5) ppm : MS match value based on normalized dot product, normalized msmv sum of squared or absolute errors (default: nsae) acc : allowed deviation for full acceptance of MS/MS peak in ppm (default: 2) : allowed deviation for total rejection of MS/MS peak in ppm rej (default: 4) : threshold for the MS match value thms thmsms : threshold for the MS/MS match value thcomb : threshold for the combined match value : sort generated formulas according to mass deviation in ppm, sort MS match value, MS/MS match value or combined match value : used chemical elements (default: CHBrClFINOPSSi) el ОС : only organic compounds, i.e. with at least one C atom ff : overwrites el and oc and uses fuzzy formula for limits of element multiplicities het : formulas must have at least one hetero atom : valency sum parity (even for graphical formulas) vsp : lower bound for valency sum - 2 \* maximum valency (>=0 for graphical formulas) vsm2ap2: lower bound for valency sum - 2 \* number of atoms + 2(>=0 for graphical connected formulas) hcf : apply Heuerding-Clerc filter : m/z weighting for MS/MS match value wm : intensity weighting for MS/MS match value wi : exponent used, when wi is set to log exp : allow odd electron ions for explaining MS/MS peaks dbeexc : excess of double bond equivalent for ions ivsm2mv : lower bound for valency sum - 2 \* maximum valency for fragment ions ivsm2ap2: lower bound for valency sum - 2 \* number of atoms + 2 for fragment ions

oms : write scaled MS peaks to output omsms : write weighted MS/MS peaks to output oclean : write explained MS/MS peaks to output

analyze : write explanations for MS/MS peaks to output

loss : for analyzing MS/MS peaks write losses instead of fragments

intens : write intensities of MS/MS peaks to output
dbe : write double bond equivalents to output
cm : write calculated ion masses to output

pc : output match values in percent

sc : strip calculated isotope distributions

noref : hide the reference information

#### Note

If any errors related to DCOM appear it might be necessary to terminate DataAnalysis (note that DataAnalysis might still be running as a background process). The ProcessCleaner application installed with DataAnalysis can be used for this.

generateFormulasGenForm always sets the 'exist' and 'oei' GenForm commandline options.

Formula calculation with GenForm may produce an excessive number of candidates for high m/z values (e.g. above 600) and/or many elemental combinations (set by elements). In this scenario formula calculation may need a very long time. Timeouts are used to avoid excessive computational times by terminating long running commands (set by the timeout argument).

For annotations performed with SIRIUS it is often the fastest to keep the default SIRBatchSize=0. In this case, the maxProcAmount argument will be ignored and all SIRIUS output will be printed to the terminal (unless verbose=FALSE).

#### References

Meringer M, Reinker S, Zhang J, Muller A (2011). "MS/MS Data Improves Automated Determination of Molecular Formulas by Mass Spectrometry." *MATCH Commun. Math. Comput. Chem.*, **65**(2), 259–290.

Duhrkop K, Fleischauer M, Ludwig M, Aksenov AA, Melnik AV, Meusel M, Dorrestein PC, Rousu J, Bocker S (2019). "SIRIUS 4: a rapid tool for turning tandem mass spectra into metabolite structure information." *Nature Methods*, **16**(4), 299–302. doi: 10.1038/s41592-01903448, https://doi.org/10.1038/s41592-019-0344-8.

Duhrkop K, Bocker S (2015). "Fragmentation Trees Reloaded." In Przytycka TM (ed.), Research in Computational Molecular Biology, 65–79. ISBN 978-3-319-16706-0.

Duhrkop K, Shen H, Meusel M, Rousu J, Bocker S (2015). "Searching molecular structure databases with tandem mass spectra using CSI:FingerID." *Proceedings of the National Academy of Sciences*, **112**(41), 12580–12585. doi: 10.1073/pnas.1509788112.

Bocker S, Letzel MC, Liptak Z, Pervukhin A (2008). "SIRIUS: decomposing isotope patterns for metabolite identification." *Bioinformatics*, **25**(2), 218–224. doi: 10.1093/bioinformatics/btn603.

## See Also

formulas-class. The GenForm manual (also known as MOLGEN-MSMS).

formulas-class

Formula lists class

# Description

Contains data of generated chemical formulae for given feature groups.

## Usage

```
## S4 method for signature 'formulas'
formulaTable(obj, features = FALSE)
## S4 method for signature 'formulas'
algorithm(obj)
## S4 method for signature 'formulas'
analyses(obj)
## S4 method for signature 'formulas'
groupNames(obj)
## S4 method for signature 'formulas'
length(x)
## S4 method for signature 'formulas'
show(object)
## S4 method for signature 'formulas, ANY, missing, missing'
x[i, j, ..., drop = TRUE]
## S4 method for signature 'formulas, ANY, ANY'
x[[i, j]]
## S4 method for signature 'formulas'
x$name
## S4 method for signature 'formulas'
as.data.table(
  Χ,
  fGroups = NULL,
  average = FALSE,
  countElements = NULL,
  countFragElements = NULL,
  OM = FALSE,
```

```
maxFormulas = NULL,
 maxFragFormulas = NULL,
 normalizeScores = "none",
  excludeNormScores = NULL
## S4 method for signature 'formulas'
filter(
  obj,
 minExplainedPeaks = NULL,
  elements = NULL,
  fragElements = NULL,
  lossElements = NULL,
  topMost = NULL,
  scoreLimits = NULL,
  OM = FALSE,
  negate = FALSE
)
## S4 method for signature 'formulas'
annotatedPeakList(
  obj,
  precursor,
  groupName,
  analysis = NULL,
 MSPeakLists,
  onlyAnnotated = FALSE
)
## S4 method for signature 'formulas'
plotScores(
  obj,
  precursor,
  groupName,
  analysis = NULL,
  normalizeScores = "max",
  excludeNormScores = NULL,
  useGGPlot2 = FALSE
## S4 method for signature 'formulas'
plotSpec(
  obj,
  precursor,
 groupName,
  analysis = NULL,
 MSPeakLists,
  title = NULL,
```

```
useGGPlot2 = FALSE,
     xlim = NULL,
     ylim = NULL,
   )
   ## S4 method for signature 'formulas'
   plotVenn(obj, ..., labels = NULL, vennArgs = NULL)
    ## S4 method for signature 'formulas'
   plotUpSet(
     obj,
      . . . ,
      labels = NULL,
      nsets = length(list(...)) + 1,
     nintersects = NA,
      upsetArgs = NULL
   )
   ## S4 method for signature 'formulas'
   consensus(
     obj,
      absMinAbundance = NULL,
     relMinAbundance = NULL,
     uniqueFrom = NULL,
      uniqueOuter = FALSE,
      rankWeights = 1,
      labels = NULL
   )
Arguments
   obj, x, object, formulas
                    The formulas object.
                    If TRUE returns formula data for features, otherwise for feature groups.
   features
    i, j
                    A numeric or character value which is used to select analyses/feature
                    groups by their index or name, respectively (for the order/names see
                    analyses()/groupNames()).
                    For [: Can also be logical to perform logical selection (similar to reg-
                    ular vectors). If missing all analyses/feature groups are selected.
                    For [[: should be a scalar value. If j is not specified, i selects by feature
                    groups instead.
                    For plotSpec: Further arguments passed to plot.
                    Others: Any further (and unique) formulas objects.
                    ignored.
   drop
```

name The feature group name (partially matched).

The featureGroups object that was used to generate this object. If not **fGroups** 

NULL it is used to add feature group information (retention and m/z val-

If set to TRUE an 'average formula' is generated for each feature group by average

combining all elements from all candidates and averaging their amounts. This obviously leads to non-existing formulae, however, this data may be useful to deal with multiple candidate formulae per feature group when

performing elemental characterization.

countElements, countFragElements

A character vector with elements that should be counted for each MS(/MS) formula candidate. For instance, c("C", "H") adds columns for both carbon and hydrogen amounts of each formula. Note that the neutral formula (neutral\_formula column) is used to count elements of non-fragmented formulae, whereas the charged formula of fragments (frag\_formula col-

umn) is used for fragments. Set to NULL to not count any elements. For as.data.table: if set to TRUE several columns with information rel-

> evant for organic matter (OM) characterization will be added (e.g. elemental ratios, classification). This will also make sure that countElements

contains at least C, H, N, O, P and S.

For filter: If TRUE then several filters are applied to exclude unlikely formula candidates present in organic matter (OM). See Source section

for details.

maxFormulas, maxFragFormulas

Maximum amount of unique candidate formulae (or fragment formulae) per feature group. Set to NULL to ignore.

normalizeScores

A character that specifies how normalization of compound scorings occurs. Either "none" (no normalization), "max" (normalize to max value) or "minmax" (perform min-max normalization). Note that normalization of negative scores (e.g. output by SIRIUS) is always performed as min-max. Furthermore, currently normalization takes the original scoring min/max values into account when candidates were generated. Thus, normalization is not affected when candidate results were removed after they were generated (e.q. by use of filter).

excludeNormScores

A character vector specifying any compound scoring names that should not be normalized. Set to NULL to normalize all scorings. Note that whether any normalization occurs is set by the excludeNormScores argu-

For compounds: By default score and individual MoNAScore are set to mimic the behaviour of the MetFrag web interface.

minExplainedPeaks

Minimum number of fragment peaks that are explained. Setting this to '1' will remove any MS only formula results. Set to NULL to ignore.

elements Only retain candidate formulae (neutral form) that match a given elemental restriction. The format of elements is a character string with

OM

elements that should be present where each element is followed by a valid amount or a range thereof. If no number is specified then '1' is assumed. For instance, elements="C1-10H2-2000-2P", specifies that '1-10', '2-20', '0-2' and '1' carbon, hydrogen, oxygen and phosphorus atoms should be present, respectively. When length(elements)>1 formulas are tested to follow at least one of the given elemental restrictions. For instance, elements=c("P", "S") specifies that either one phosphorus or one sulphur atom should be present. Set to NULL to ignore this filter.

fragElements, lossElements

topMost

scoreLimits

Specifies elemental restrictions for fragment or neutral loss formulae (charged form). Candidates are retained if at least one of the fragment formulae follow (or not follow if negate=TRUE) the given restrictions. See elements for the used format.

Retain no more than this amount of best ranked (or worst ranked if negate=TRUE) candidates for each feature group.

Filter results by their scores. Should be a named list that contains two-sized numeric vectors with the minimum/maximum value of a score (use -Inf/Inf for no limits). The names of each element should follow the val-

ues returned by formulaScorings()\$name. For instance, scoreLimits=list(isoScore=c(0.5,Inf specifies that the isotopic match score should be at least '0.5'. More details of scorings can be obtained with formulaScorings. Note that a result without a specified scoring is never removed. Set to NULL to skip

this filter.

negate If TRUE then filters are applied in opposite manner.

precursor The formula of the precursor (in ionic form, *i.e.* as detected by the MS).

groupName The name of the feature group to which the candidate belongs.

analysis A character specifying the analysis for which the annotated spectrum

should be plotted. If  $\mathsf{NULL}$  then annotation results for the complete feature

group will be plotted.

MSPeakLists The MSPeakLists object that was used to generate the candidate onlyAnnotated Set to TRUE to filter out any peaks that could not be annotated.

useGGPlot2 If TRUE then ggplot2 is used for plotting, otherwise base plot used. For

plotSpec, ggplot2 allows nicely repelled text for annotation. However,

base plot is generally faster.

title The title of the plot. Set to NULL for an automatically generated title.

xlim, ylim Sets the plot size limits used by plot. Set to NULL for automatic plot

sizing.

labels A character with names to use for labelling. If NULL labels are automat-

ically generated.

vennArgs A list with further arguments passed to VennDiagram plotting functions.

Set to NULL to ignore.

nsets, nintersects

See upset.

upsetArgs A list with any further arguments to be passed to upset. Set to NULL to ignore.

absMinAbundance, relMinAbundance

Minimum absolute or relative ('0-1') abundance across objects for a result to be kept. For instance, relMinAbundance=0.5 means that a result should be present in at least half of the number of compared objects. Set to 'NULL' to ignore and keep all results. Limits cannot be set when uniqueFrom is

not NULL.

uniqueFrom Set this argument to only retain formulas that are unique within one

> or more of the objects for which the consensus is made. Selection is done by setting the value of uniqueFrom to a logical (values are recycled), numeric (select by index) or a character (as obtained with algorithm(obj)). For logical and numeric values the order corresponds to the order of the objects given for the consensus. Set to NULL to ignore.

If uniqueFrom is not NULL and if uniqueOuter=TRUE: only retain data that uniqueOuter

are also unique between objects specified in uniqueFrom.

A numeric vector with weights of to calulcate the mean ranking score rankWeights

for each candidate. The value will be re-cycled if necessary, hence, the default value of '1' means equal weights for all considered objects.

#### Details

formulas objects are obtained from formula generators.

#### Value

formula Table returns a list containing for each feature group (or feature if features=TRUE) a data.table with an overview of all generated formulae and other data such as candidate scoring and MS/MS fragments.

as.data.table returns a data.table.

filter returns a filtered formulas object.

plotSpec will return a ggplot object if useGGPlot2 is TRUE.

plotVenn (invisibly) returns a list with the following fields:

- gList the gList object that was returned by the utilized VennDiagram plotting function.
- areas The total area for each plotted group.
- intersectionCounts The number of intersections between groups.

The order for the areas and intersectionCounts fields is the same as the parameter order from the used plotting function (see e.g. draw.pairwise.venn and draw.triple.venn).

consensus returns a formulas object that is produced by merging results from multiple formulas objects.

## Methods (by generic)

- formulaTable: Accessor method to obtain generated formulae.
- algorithm: Accessor method for the algorithm (a character string) used to generate formulae.
- analyses: returns a character vector with the names of the analyses for which data is present in this object.
- groupNames: returns a character vector with the names of the feature groups for which data is present in this object.
- length: Obtain total number of formulae entries.
- show: Show summary information for this object.
- [: Subset on feature groups.
- [[: Extract a formula table. If both arguments (i and j) are specified, the feature specific formula table belonging to the analysis (i)/feature group (j) is returned. Otherwise the formula table for the feature group specified by j is returned.
- \$: Extract a formula table for a feature group.
- as.data.table: Generates a table with all candidate formulae for each feature group and other information such as element counts.
- filter: Performs rule based filtering on formula results.
- annotatedPeakList: Returns an MS/MS peak list annotated with data from a given candidate formula.
- plotScores: Plots a barplot with scoring of a candidate compound.
- plotSpec: Plots an annotated spectrum for a given candidate formula of a feature or feature group.
- plotVenn: plots a Venn diagram (using VennDiagram) outlining unique and shared formula candidates of up to five different formulas objects.
- plotUpSet: plots an UpSet diagram (using the upset function) outlining unique and shared formula candidates between different formula objects.
- consensus: Generates a consensus of results from multiple objects. In order to rank the consensus candidates, first each of the candidates are scored based on their original ranking (the scores are normalized and the highest ranked candidate gets value '1'). The (weighted) mean is then calculated for all scorings of each candidate to derive the final ranking (if an object lacks the candidate its score will be '0'). The original rankings for each object is stored in the rank columns.

### Slots

formulas, featureFormulas Lists of all generated formulae. Use the formulaTable method for access.

scoreRanges The original min/max values of all scorings when candidate results were generated. This is used for normalization.

#### Source

Calculation of the aromaticity index (AI) and related double bond equivalents (DBE\_AI) is performed as described in Koch 2015. Formula classification is performed by the rules described in Abdulla 2013. Filtering of OM related molecules is performed as described in Koch 2006 and Kujawinski 2006. (see references).

Subscripting of formulae for plots generated by plotSpec is based on the chemistry2expression function from the ReSOLUTION package.

### S4 class hierarchy

- workflowStep
  - formulas

#### Note

filter does not modify any formula results for features (if present).

#### References

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Conway JR, Lex A, Gehlenborg N (2017). "UpSetR: an R package for the visualization of intersecting sets and their properties." *Bioinformatics*, **33**(18), 2938-2940. doi: 10.1093/bioinformatics/btx364, http://dx.doi.org/10.1093/bioinformatics/btx364.

Lex A, Gehlenborg N, Strobelt H, Vuillemot R, Pfister H (2014). "UpSet: Visualization of Intersecting Sets." *IEEE Transactions on Visualization and Computer Graphics*, **20**(12), 1983–1992. doi: 10.1109/tvcg.2014.2346248, https://doi.org/10.1109/tvcg.2014.2346248.

generics

 $Miscellaneous\ generics$ 

# Description

Various (S4) generic functions providing a common interface for common tasks such as plotting and filtering data. The actual functionality and function arguments are often specific for the implemented methods, for this reason, please refer to the linked method documentation for each generic.

## Usage

```
algorithm(obj)
analysisInfo(obj)
analyses(obj)
annotatedPeakList(obj, ...)
clusterProperties(obj)
clusters(obj)
cutClusters(obj)
consensus(obj, ...)
featureTable(obj)
filter(obj, ...)
getFeatures(obj)
getMCS(obj, ...)
groupNames(obj)
plotChord(obj, addSelfLinks = FALSE, addRetMzPlots = TRUE, ...)
plotEIC(obj, ...)
plotInt(obj, ...)
plotScores(obj, ...)
plotSilhouettes(obj, kSeq, ...)
```

```
plotSpec(obj, ...)
plotStructure(obj, ...)
plotVenn(obj, ...)
plotUpSet(obj, ...)
replicateGroups(obj)
treeCut(obj, k = NULL, h = NULL, ...)
treeCutDynamic(
   obj,
   maxTreeHeight = 1,
   deepSplit = TRUE,
   minModuleSize = 1, ...
)
```

### Arguments

obj The object the generic should be applied to. Any further method specific arguments. See method documentation for . . . details. addSelfLinks If TRUE then 'self-links' are added which represent non-shared data. Set to TRUE to enable m/z vs retention time scatter plots. addRetMzPlots kSeq An integer vector containing the sequence that should be used for average silhouette width calculation. Desired numbers of clusters. See cutree. k, h maxTreeHeight, deepSplit, minModuleSize Arguments used by cutreeDynamicTree.

## Details

algorithm returns the algorithm that was used to generate the object.

Methods are defined for: compounds; formulas; optimizationResult; workflowStep.

analysisInfo returns the analysis information from an object.

• Methods are defined for: featureGroups; features.

analyses returns a character vector with the analyses for which data is present in this object.

• Methods are defined for: featureGroups; features; formulas; MSPeakLists.

annotatedPeakList returns an annotated MS peak list.

• Methods are defined for: compounds; formulas.

clusterProperties Obtain a list with properties of the generated cluster(s).

• Methods are defined for: componentsIntClust; compoundsCluster.

clusters Obtain clustering object(s).

• Methods are defined for: componentsIntClust; compoundsCluster.

cutClusters Returns assigned cluster indices of a cut cluster.

• Methods are defined for: componentsIntClust; compoundsCluster.

consensus combines and merges data from various algorithms to generate a consensus.

• Methods are defined for: components; compounds; featureGroupsComparison; formulas.

featureTable returns feature information.

• Methods are defined for: featureGroups; features.

filter provides various functionality to do post-filtering of data.

Methods are defined for: components; compounds; featureGroups; features; featuresXCMS; featuresXCMS3; formulas; MSPeakLists.

getFeatures returns the object's features object.

• Methods are defined for: featureGroups.

getMCS Calculcates the maximum common substructure.

• Methods are defined for: compounds; compoundsCluster.

groupNames returns a character vector with the names of the feature groups for which data is present in this object.

• Methods are defined for: components; compounds; compoundsCluster; featureGroups; formulas; MSPeakLists.

plotChord plots a Chord diagram to assess overlapping data.

• Methods are defined for: featureGroups; featureGroupsComparison.

plotEIC plots extracted ion chromatogram(s).

• Methods are defined for: components; featureGroups.

plotInt plots the intensity of all contained features.

• Methods are defined for: componentsIntClust; featureGroups.

plotScores plots candidate scorings.

• Methods are defined for: compounds; formulas.

plotSilhouettes plots silhouette widths to evaluate the desired cluster size.

• Methods are defined for: componentsIntClust; compoundsCluster.

plotSpec plots a (annotated) spectrum.

• Methods are defined for: components; compounds; formulas; MSPeakLists.

plotStructure plots a chemical structure.

• Methods are defined for: compounds; compoundsCluster.

plotVenn plots a Venn diagram to assess unique and overlapping data.

• Methods are defined for: compounds; featureGroups; featureGroupsComparison; formulas.

plotUpSet plots an UpSet diagram to assess unique and overlapping data.

• Methods are defined for: compounds; featureGroups; featureGroupsComparison; formulas.

replicateGroups returns a character vector with the analyses for which data is present in this object.

• Methods are defined for: featureGroups; features.

treeCut Manually cut a cluster.

• Methods are defined for: componentsIntClust; compoundsCluster.

treeCutDynamic Automatically cut a cluster.

• Methods are defined for: componentsIntClust; compoundsCluster.

### Other generics

Below are methods that are defined for existing generics (e.g. defined in base). Please see method specific documentation for more details.

[ Subsets data within an object.

Methods are defined for: components, ANY, ANY, missing; compounds, ANY, missing, missing; compoundsCluster, ANY, missing, missing; featureGroups, ANY, ANY, missing; featureGroupsComparison, ANY, features, ANY, missing, missing; featuresXCMS, ANY, missing, missing; featuresXCMS3, ANY, missing, missing; formulas, ANY, missing, missing; MSPeakLists, ANY, ANY, missing.

[[ Extract data from an object.

Methods are defined for: components, ANY, ANY; compounds, ANY, missing; featureGroups, ANY, ANY; featureGroupsComparison, ANY, missing; features, ANY, missing; formulas, ANY, ANY; MSPeakLists, ANY, ANY.

- \$ Extract data from an object.
  - Methods are defined for: components; compounds; featureGroups; featureGroupsComparison; features; formulas; MSPeakLists.

as.data.table Converts an object to a table (data.table).

• Methods are defined for: components; compounds; featureGroups; features; formulas; MSPeakLists; workflowStep.

as.data.frame Converts an object to a table (data.frame).

• Methods are defined for: workflowStep.

length Returns the length of an object.

 Methods are defined for: components; compounds; compoundsCluster; featureGroups; featureGroupsComparison; features; formulas; MSPeakLists; optimizationResult.

lengths Returns the lengths of elements within this object.

• Methods are defined for: compoundsCluster; optimizationResult.

names Return names for this object.

• Methods are defined for: components; featureGroups; featureGroupsComparison.

plot Generates a plot for an object.

• Methods are defined for: componentsIntClust, ANY; compoundsCluster, ANY; featureGroups, ANY; featureGroupsComparison, ANY; optimizationResult, ANY.

show Prints information about this object.

• Methods are defined for: adduct; components; compounds; compoundsCluster; featureGroups; features; formulas; MSPeakLists; optimizationResult; workflowStep.

getXCMSSet 101

getXCMSSet

Conversion to xcmsSet objects

### Description

Converts a features or featureGroups object to an xcmsSet object.

## Usage

```
getXCMSSet(obj, ..., verbose = TRUE)
## S4 method for signature 'features'
getXCMSSet(obj, exportedData, verbose)

## S4 method for signature 'featuresOpenMS'
getXCMSSet(obj, exportedData, verbose = FALSE)

## S4 method for signature 'featuresXCMS'
getXCMSSet(obj, exportedData, verbose)

## S4 method for signature 'featureGroups'
getXCMSSet(obj, exportedData, verbose = TRUE)

## S4 method for signature 'featureGroupsXCMS'
getXCMSSet(obj, exportedData, verbose)
```

## Arguments

obj The object that should be converted.

verbose If FALSE then no text output is shown.

exportedData, ...

Set to TRUE if analyses were exported as mzXML or mzML files (ignored for

featuresOpenMS and featuresXCMS methods).

GUI-utils

Interactive GUI utilities

### Description

Interactive utilities using shiny to provide a graphical user interface (GUI).

102 GUI-utils

#### Usage

```
## S4 method for signature 'featureGroups'
checkChromatograms(fGroups, mzWindow = 0.005, enabledFGroups = NULL)
newProject(destPath = NULL)
## S4 method for signature 'featureGroups, MSPeakLists, compounds'
compoundViewer(fGroups, MSPeakLists, compounds)
```

### Arguments

fGroups A featureGroups object.

mzWindow Default m/z window to be used for creating extracted ion chromatograms

(EICs).

enabledFGroups A logical vector that states for each feature group whether it should be

kept (TRUE) or not (FALSE). The order is the same as the fGroups param-

eter. If NULL then all feature groups are considered to be kept.

destPath Set destination path value to this value (useful for debugging). Set to

NULL for a default value.

MSPeakLists A MSPeakLists object. compounds A compounds object.

#### **Details**

checkChromatograms is used to review chromatographic information for feature groups. This is especially useful to get a visual impression of the quality of detected features. In addition, this function may be used to remove unwanted (e.g. outlier) features. Better performance is often obtained when an external browser is used to use this Shiny application. Furthermore, when a large featureGroups object is used it is recommended to limit the number of analyses/feature groups by subsetting the object.

The newProject function is used to quickly generate a processing R script. This tool allows the user to quickly select the targeted analyses, workflow steps and configuring some of their common parameters. This function requires to be run within a RStudio session. The resulting script is either added to the current open file or to a new file. The analysis information will be written to a '.csv' file so that it can easily be modified afterwards.

The compoundViewer method is used to view compound identification results. It will display available candidate information such as scorings and identifiers, MS/MS spectra with explained peaks and chemical structures.

## Value

checkChromatograms returns a logical vector for all feature groups that were selected to be kept (TRUE) or not (FALSE). This result can be passed to the enabledFGroups parameter for subsequent calls to checkChromatograms in order to restore the keep/not keep state from a previous call. To actually remove unwanted feature groups the object should be subset by the subsetting ([) operator to which the return value should be passed as the second parameter.

MSPeakLists-class

Class containing MS Peak Lists

## Description

Contains all MS (and MS/MS where available) peak lists for a featureGroups object.

## Usage

```
## S4 method for signature 'MSPeakLists'
peakLists(obj)
## S4 method for signature 'MSPeakLists'
averagedPeakLists(obj)
## S4 method for signature 'MSPeakLists'
analyses(obj)
## S4 method for signature 'MSPeakLists'
groupNames(obj)
## S4 method for signature 'MSPeakLists'
length(x)
## S4 method for signature 'MSPeakLists'
show(object)
## S4 method for signature 'MSPeakLists, ANY, ANY, missing'
x[i, j, ..., reAverage = TRUE, drop = TRUE]
## S4 method for signature 'MSPeakLists, ANY, ANY'
x[[i, j]]
## S4 method for signature 'MSPeakLists'
x$name
## S4 method for signature 'MSPeakLists'
as.data.table(x, fGroups = NULL, averaged = TRUE)
## S4 method for signature 'MSPeakLists'
filter(
  obj,
  absMSIntThr = NULL,
  absMSMSIntThr = NULL,
  relMSIntThr = NULL,
  relMSMSIntThr = NULL,
  topMSPeaks = NULL,
```

```
topMSMSPeaks = NULL,
      isolatePrec = NULL,
      deIsotopeMS = FALSE,
      deIsotopeMSMS = FALSE,
     withMSMS = FALSE,
      retainPrecursorMSMS = TRUE,
     negate = FALSE
   )
   ## S4 method for signature 'MSPeakLists'
   plotSpec(
      obj,
      groupName,
      analysis = NULL,
     MSLevel = 1,
      title = NULL,
      useGGPlot2 = FALSE,
      xlim = NULL,
     ylim = NULL,
   )
   getDefIsolatePrecParams(...)
Arguments
   obj, x, object The MSPeakLists object to access.
    i, j
                     A numeric or character value which is used to select analyses/feature
                    groups by their index or name, respectively (for the order/names see
                    analyses()/groupNames()).
                    For [: Can also be logical to perform logical selection (similar to reg-
                    ular vectors). If missing all analyses/feature groups are selected.
                    For [[: should be a scalar value. If j is not specified, i selects by feature
                    groups instead.
                     Further arguments passed to plot.
                    Set to TRUE to regenerate averaged MS peak lists after subsetting analyses.
    reAverage
    drop
                    ignored.
                    The feature group name (partially matched).
    name
   fGroups
                    The featureGroups object that was used to generate this object. If not
                    NULL it is used to add feature group information (retention and m/z val-
                     ues).
                     If TRUE then feature group averaged peak list data is used.
    averaged
    absMSIntThr, absMSMSIntThr, relMSIntThr, relMSMSIntThr
                     Absolute/relative intensity threshold for MS or MS/MS peak lists. NULL
```

for none.

topMSPeaks, topMSMSPeaks

Only consider this amount of MS or MS/MS peaks with highest intensity.

NULL to consider all.

ing the precursor and its isotopes in MS peak lists (see Isolating precursor data). Alternatively,  ${\sf TRUE}$  to apply the filter with default settings (as

given with getDefIsolatePrecParams).

deIsotopeMS, deIsotopeMSMS

Remove any isotopic peaks in MS or MS/MS peak lists. This may improve data processing steps which do not assume the presence of isotopic peaks (e.g. MetFrag for MS/MS). Note that getMzRPeakLists does not (yet)

support flagging of isotopes.

with MSMS If set to TRUE then only results will be retained for which MS/MS data is

available. if  $\mathsf{negate} = \mathsf{TRUE}$  then only results  $\mathit{without}$  MS/MS data will be

 ${\it retained}.$ 

retainPrecursorMSMS

If TRUE then precursor peaks will never be filtered out from MS/MS peak lists (note that precursors are never removed from MS peak lists). The

negate argument does not affect this setting.

negate If TRUE then filters are applied in opposite manner.

groupName The name of the feature group for which a plot should be made.

analysis The name of the analysis for which a plot should be made. If NULL then

data from the feature group averaged peak list is used.

MSLevel The MS level: '1' for regular MS, '2' for MSMS.

title The title of the plot. If NULL a title will be automatically made.

useGGPlot2 If TRUE then ggplot2 is used for plotting, otherwise base plot used. For

plotSpec, ggplot2 allows nicely repelled text for annotation. However,

base plot is generally faster.

xlim, ylim Sets the plot size limits used by plot. Set to NULL for automatic plot

sizing.

#### **Details**

Objects for this class are returned by MS peak lists generators.

The getDefIsolatePrecParams is used to create a parameter list for isolating the precursor and its isotopes (see Isolating precursor data).

### Value

peakLists returns a nested list containing MS (and MS/MS where available) peak lists per feature group and per analysis. The format is: [[analysis]][[featureGroupName]][[MSType]][[PeakLists]] where MSType is either "MS" or "MSMS" and PeakLists a data.table containing all m/z values (mz column) and their intensities (intensity column). In addition, the peak list tables may contain a cmp column which contains an unique alphabatical identifier to which isotopic cluster (or "compound") a mass belongs (only supported by MS peak lists generated by Bruker tools at the moment).

averagedPeakLists returns a nested list of feature group averaged peak lists in a similar format as peakLists.

plotSpec will return a ggplot object if useGGPlot2 is TRUE.

## Methods (by generic)

- peakLists: Accessor method to obtain the MS peak lists.
- averagedPeakLists: Accessor method to obtain the feature group averaged MS peak lists
- analyses: returns a character vector with the names of the analyses for which data is present in this object.
- groupNames: returns a character vector with the names of the feature groups for which data is present in this object.
- length: Obtain total number of m/z values.
- show: Shows summary information for this object.
- [: Subset on analyses/feature groups.
- [[: Extract a list with MS and MS/MS (if available) peak lists. If the second argument (j) is not specified the averaged peak lists for the group specified by the first argument (i) will be returned.
- \$: Extract group averaged MS peaklists for a feature group.
- as.data.table: Returns all MS peak list data in a table.
- filter: provides post filtering of generated MS peak lists, which may further enhance quality of subsequent workflow steps (e.g. formulae calculation and compounds identification) and/or speed up these processes.
- plotSpec: Plots a spectrum using MS or MS/MS peak lists for a given feature group.

#### Slots

peakLists Contains a list of all MS (and MS/MS) peak lists. Use the peakLists method for access.

metadata Metadata for all spectra used to generate peak lists. Follows the format of the peakLists slot.

averagedPeakLists A list with averaged MS (and MS/MS) peak lists for each feature group.

avgPeakListArgs A list with arguments used to generate feature group averaged MS(/MS) peak lists.

## Isolating precursor data

Formula calculation typically relies on evaluating the measured isotopic pattern from the precursor to score candidates. Some algorithms (currently only GenForm) penalize candidates if mass peaks are present in MS1 spectra that do not contribute to the isotopic pattern. Since these spectra are typically very 'noisy' due to background and co-eluting ions, an additional filtering step may be recommended prior to formula calculation. During this precursor isolation step all mass peaks are removed that are (1) not the precursor and

- (2) not likely to be an isotopologue of the precursor. To determine potential isotopic peaks the following parameters are used:
  - maxIsotopes The maximum number of isotopes to consider. For instance, a value of '5' means that M+0 (i.e. the monoisotopic peak) till M+5 is considered. All mass peaks outside this range are removed.
  - mzDefectRange A two-sized vector specifying the minimum (can be negative) and maximum m/z defect deviation compared to the precursor m/z defect. When chlorinated, brominated or other compounds with strong m/z defect in their isotopologues are to be considered a higher range may be desired. On the other hand, for natural compounds this range may be tightened. Note that the search range is propegated with increasing distance from the precursor, e.g. the search range is doubled for M+2, tripled for M+3 etc.
  - intRange A two-sized vector specifying the minimum and maximum relative intensity range compared to the precursor. For instance, c(0.001,2) removes all peaks that have an intensity below 0.1% or above 200% of that of the precursor.
  - z The z value (*i.e.* absolute charge) to be considerd. For instance, a value of 2 would look for M+0.5, M+1 etc. Note that the mzDefectRange is adjusted accordingly (*e.g.* halved if z=2).
  - maxGap The maximum number of missing adjacent isotopic peaks ('gaps'). If the (rounded) m/z difference to the previous peak exceeds this value then this and all next peaks will be removed. Similar to z, the maximum gap is automatically adjusted for charge.

These parameters should be in a list that is passed to the isolatePrec argument to filter. The default values can be obtained with the getDefIsolatePrecParams function:

maxIsotopes=5; mzDefectRange=c(-0.01,0.01); intRange=c(0.001,2); z=1; maxGap=2

# S4 class hierarchy

workflowStep

- MSPeakLists

MSPeakLists-generation

Generation of MS Peak Lists

### Description

Functionality to generate MS peak lists.

### Usage

```
## S4 method for signature 'featureGroups'
generateMSPeakLists(fGroups, algorithm, ...)
generateMSPeakListsDA(
  fGroups,
  bgsubtr = TRUE,
 maxMSRtWindow = 5,
 minMSIntensity = 500,
 minMSMSIntensity = 500,
  clear = TRUE,
 close = TRUE,
  save = close,
 MSMSType = "MSMS",
  avgFGroupParams = getDefAvgPListParams()
)
generateMSPeakListsDAFMF(
  fGroups,
 minMSIntensity = 500,
 minMSMSIntensity = 500,
  close = TRUE,
  save = close,
  avgFGroupParams = getDefAvgPListParams()
)
generateMSPeakListsMzR(
  fGroups,
 maxMSRtWindow = 5,
  precursorMzWindow = 4,
  topMost = NULL,
  avgFeatParams = getDefAvgPListParams(),
  avgFGroupParams = getDefAvgPListParams()
)
getDefAvgPListParams(...)
```

# Arguments

fGroups	The featureGroups object from which MS peak lists should be extracted.
algorithm	A character string describing the algorithm that should be used: "bruker", "brukerfmf", "mzr" $$
• • •	For generateMSPeakLists: Any parameters to be passed to the selected MS peak lists generation algorithm.
	For ${\tt getDefAvgPListParams:}$ Optional named arguments that over ride defaults.
bgsubtr	If TRUE background will be subtracted using the 'spectral' algorithm.

maxMSRtWindow Maximum chromatographic peak window used for spectrum averaging (in

seconds, +/- retention time). If NULL all spectra from a feature will be

taken into account. Lower to decrease processing time.

minMSIntensity, minMSMSIntensity

Minimum intensity for peak lists obtained with DataAnalysis. Highly recommended to set '>0' as DA tends to report many very low intensity

peaks.

clear Remove any existing chromatogram traces/mass spectra prior to making

new ones.

close, save If TRUE then Bruker files are closed and saved after processing with Data-

Analysis, respectively. Setting close=TRUE prevents that many analyses might be opened simultaneously in DataAnalysis, which otherwise may use excessive memory or become slow. By default save is TRUE when close is TRUE, which is likely what you want as otherwise any processed

data is lost.

MSMSType The type of MS/MS experiment performed: "MSMS" for MRM/AutoMSMS

or "BBCID" for broadband CID.

precursorMzWindow

The m/z window (in Da) to find MS/MS spectra of a precursor. This is typically used for Data-Dependent like MS/MS data and should correspond to the isolation m/z window (i.e. +/- the precursor m/z) that was used to collect the data. For Data-Independent MS/MS experiments, where precursor ions are not isolated prior to fragmentation (e.g. bbCID,

MSe, all-ion, ...) the value should be NULL.

topMost Only extract MS peak lists from a maximum of topMost analyses with

highest intensity. If NULL all analyses will be used.

avgFeatParams, avgFGroupParams

A list with parameters used for averaging of peak lists for individual

features and feature groups, respectively (see below).

## **Details**

Formula calculation and identification tools rely on mass spectra that belong to features of interest. For processing, MS (and MS/MS) spectra are typically reduced to a table with a column containing measured m/z values and a column containing their intensities. These 'MS peak lists' can then be used for formula generation and compound generation.

MS and MS/MS peak lists are first generated for all features (or a subset, if the topMost argument is set). During this step multiple spectra over the feature elution profile are averaged. Subsequently, peak lists will be generated for each feature group by averaging peak lists of the features within the group. Functionality that uses peak lists will either use data from individual features or from group averaged peak lists. For instance, the former may be used by formulae calculation, while compound identification and plotting functionality typically uses group averaged peak lists.

Several functions exist to automatically extract MS peak lists for feature groups.

generateMSPeakLists is a generic function that will generate MS peak lists using one of the supported algorithms. The actual functionality is provided by algorithm specific functions

such as generateMSPeakListsMzR and generateMSPeakListsDA. While these functions may be called directly, generateMSPeakLists provides a generic interface and is therefore usually preferred.

generateMSPeakListsDA uses Bruker DataAnalysis to generate MS peak lists. Naturally, this only works with analyses in the Bruker data format ('.d'). This function leverages DataAnalysis functionality to support averaging of spectra, background subtraction and identification of isotopes. In order to obtain mass spectra TICs will be added of the MS and relevant MS/MS signals.

generateMSPeakListsDAFMF is similar to generateMSPeakListsDA, but uses compounds that were generated by the Find Molecular Features (FMF) algorithm to extract MS peak lists. This is generally much faster than generateMSPeakListsDA, however, it only works when features were obtained using the findFeaturesBruker function. Since all MS spectra are generated in advance by Bruker DataAnalysis, no further parameters exist to customize its operation.

generateMSPeakListsMzR uses the mzR package to extract MS peak lists. For this analyses should be either in '.mzXML' or '.mzML' format. This function averages multiple spectra over a chromatgraphic peak to improve accuracy.

The getDefAvgPListParams is used to create a parameter list for peak list averaging (discussed below).

#### Value

A MSPeakLists object that can be used for formulae calculation and compound identification.

## Peak list averaging parameters

The parameters set used for averaging peak lists are set by the avgFeatParams and avgFGroupParams arguments. This should be a named list with the following values:

- clusterMzWindow m/z window (in Da) used for clustering m/z values when spectra are averaged. For method="hclust" this corresponds to the cluster height, while for method="distance" this value is used to find nearby masses (+/- window). Too small windows will prevent clustering m/z values (thus erroneously treating equal masses along spectra as different), whereas too big windows may cluster unrelated m/z values from different or even the same spectrum together.
- topMost Only retain this maximum number of MS peaks when generating averaged spectra. Lowering this number may exclude more irrelevant (noisy) MS peaks and decrease processing time, whereas higher values may avoid excluding lower intense MS peaks that may still be of interest.
- minIntensityPre MS peaks with intensities below this value will be removed (applied prior to selection by topMost) before averaging.
- minIntensityPost MS peaks with intensities below this value will be removed after averaging.
- avgFun Function that is used to calculate average m/z values.

- method Method used for producing averaged MS spectra. Valid values are "hclust", used for hierarchical clustering (using the fastcluster package), and "distance", to use the between peak distance. The latter method may reduces processing time and memory requirements, at the potential cost of reduced accuracy.
- pruneMissingPrecursorMS For MS data only: if TRUE then peak lists without a precursor peak are removed. Note that even when this is set to FALSE, functionality that relies on MS (not MS/MS) peak lists (e.g. formulae calulcation) will still skip calculation if a precursor is not found.
- retainPrecursorMSMS For MS/MS data only: if TRUE then always retain the precursor mass peak even if is not amongst the topMost peaks. Note that MS precursor mass peaks are always kept. Furthermore, note that precursor peaks in both MS and MS/MS data may still be removed by intensity thresholds (this is unlike the filter method function).

Note that when Bruker algorithms are used these parameters only control generation of feature groups averaged peak lists: how peak lists for features are generated is controlled by DataAnalysis.

The getDefAvgPListParams function can be used to generate a default parameter list. The current defaults are:

clusterMzWindow=0.005; topMost=50; minIntensityPre=500; minIntensityPost=500; avgFun=mean; method="hclust"; pruneMissingPrecursorMS=TRUE; retainPrecursorMSMS=TRUE

#### Source

Averaging of mass spectra algorithms used by are based on the msProcess R package (now archived on CRAN).

### Note

generateMSPeakListsDA requires that the 'Component' column is active (Method-¿Parameters-¿Layouts-¿Mass List Layout) in order to add isotopologue information.

If any errors related to DCOM appear it might be necessary to terminate DataAnalysis (note that DataAnalysis might still be running as a background process). The ProcessCleaner application installed with DataAnalayis can be used for this.

# References

A cross-platform toolkit for mass spectrometry and proteomics Chambers, Matthew C. and Maclean, Brendan and Burke, Robert and Amodei, Dario and Ruderman, Daniel L. and Neumann, Steffen and Gatto, Laurent and Fischer, Bernd and Pratt, Brian and Egertson, Jarrett and Hoff, Katherine and Kessner, Darren and Tasman, Natalie and Shulman, Nicholas and Frewen, Barbara and Baker, Tahmina A. and Brusniak, Mi-Youn and Paulse, Christopher and Creasy, David and Flashner, Lisa and Kani, Kian and Moulding, Chris and Seymour, Sean L. and Nuwaysir, Lydia M. and Lefebvre, Brent and Kuhlmann, Frank and Roark, Joe and Rainer, Paape and Detlev, Suckau and Hemenway, Tina and Huhmer, Andreas and Langridge, James and Connolly, Brian and Chadick, Trey and Holly, Krisztina and Eckels, Josh and Deutsch, Eric W. and Moritz, Robert L. and Katz, Jonathan E. and

Agus, David B. and MacCoss, Michael and Tabb, David L. and Mallick, Parag Nat Biotechnol. 2012 NOct;30(10):918-920.

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Nat Biotechnol. 2004 Nov;22(11):1459-66. A common open representation of mass spectrometry data and its application to proteomics research. Pedrioli PG, Eng JK, Hubley R, Vogelzang M, Deutsch EW, Raught B, Pratt B, Nilsson E, Angeletti RH, Apweiler R, Cheung K, Costello CE, Hermjakob H, Huang S, Julian RK, Kapp E, McComb ME, Oliver SG, Omenn G, Paton NW, Simpson R, Smith R, Taylor CF, Zhu W, Aebersold R.

Mol Syst Biol. 2005;1:2005.0017. Epub 2005 Aug 2. A uniform proteomics MS/MS analysis platform utilizing open XML file formats. Keller A, Eng J, Zhang N, Li XJ, Aebersold R.

Bioinformatics. 2008 Nov 1;24(21):2534-6. Epub 2008 Jul 7. ProteoWizard: open source software for rapid proteomics tools development. Kessner D, Chambers M, Burke R, Agus D, Mallick P.

Daniel Müllner (2013). fastcluster: Fast Hierarchical, Agglomerative Clustering Routines for R and Python. Journal of Statistical Software, 53(9), 1-18. URL http://www.jstatsoft.org/v53/i09/.

## See Also

MSPeakLists-class

optimizationResult-class

Class containing optimization results.

## Description

Objects from this class contain optimization results resulting from design of experiment (DoE).

## Usage

```
## S4 method for signature 'optimizationResult'
algorithm(obj)
## S4 method for signature 'optimizationResult'
length(x)
## S4 method for signature 'optimizationResult'
lengths(x, use.names = FALSE)
## S4 method for signature 'optimizationResult'
show(object)
## S4 method for signature 'optimizationResult, ANY'
plot(
 Х,
 paramSet,
 DoEIteration,
  paramsToPlot = NULL,
 maxCols = NULL,
  type = "contour",
  image = TRUE,
  contours = "colors",
)
## S4 method for signature 'optimizationResult'
optimizedParameters(object, paramSet = NULL, DoEIteration = NULL)
## S4 method for signature 'optimizationResult'
optimizedObject(object, paramSet = NULL)
## S4 method for signature 'optimizationResult'
scores(object, paramSet = NULL, DoEIteration = NULL)
## S4 method for signature 'optimizationResult'
experimentInfo(object, paramSet, DoEIteration)
```

## **Arguments**

obj, x, object An optimizationResult object.

use.names Ignored.

paramSet Numeric index of the parameter set (i.e. the first parameter set gets index

'1'). For some methods optional: if NULL the best will be selected.

DoEIteration Numeric index specifying the DoE iteration within the specified paramSet.

For some methods optional: if NULL the best will be selected.

paramstoPlot Which parameters relations should be plot. If NULL all will be plot. Alter-

natively, a list containing one or more character vectors specifying each

	two parameters that should be plotted. Finally, if only one pair should be plotted, can be a character vector specifying both parameters.
maxCols	Multiple parameter pairs are plotted in a grid. The maximum number of columns can be set with this argument. Set to NULL for no limit.
type	The type of plots to be generated: "contour", "image" or "persp". The equally named functions will be called for plotting.
image	Passed to contour (if type="contour").
contours	Passed to persp (if type="persp").
•••	Further arguments passed to contour, image or persp (depending on type).

### **Details**

Objects from this class are returned by optimizeFeatureFinding and optimizeFeatureGrouping.

# Methods (by generic)

- algorithm: Returns the algorithm that was used for finding features.
- length: Obtain total number of experimental design iterations performed.
- lengths: Obtain number of experimental design iterations performed for each parameter set.
- show: Shows summary information for this object.
- plot: Generates response plots for all or a selected set of parameters.
- optimizedParameters: Returns parameter set yielding optimal results. The paramSet and DoEIteration arguments can be NULL.
- optimizedObject: Returns the object (*i.e.* a features or featureGroups object) that was generated with optimized parameters. The paramSet argument can be NULL.
- scores: Returns optimization scores. The paramSet and DoEIteration arguments can be NULL.
- experimentInfo: Returns a list with optimization information from an DoE iteration.

## Slots

```
algorithm A character specifying the algorithm that was optimized.

paramSets A list with detailed results from each parameter set that was tested.

bestParamSet Numeric index of the parameter set yielding the best response.
```

## Examples

```
## Not run:
# ftOpt is an optimization object.

# plot contour of all parameter pairs from the first parameter set/iteration.
plot(ftOpt, paramSet = 1, DoEIteration = 1)
# as above, but only plot two parameter pairs
```

reporting

Report feature group data

# Description

Functionality to report data produced by most workflow steps such as features, feature groups, calculated chemical formulae and tentatively identified compounds.

# Usage

```
## S4 method for signature 'featureGroups'
reportCSV(
  fGroups,
  path = "report",
  reportFGroupsAsRows = TRUE,
  reportFGroupsAnalysisInfo = TRUE,
  reportFGroupsRetMz = TRUE,
  reportFeatures = FALSE,
  formulas = NULL,
  formulasNormalizeScores = "max",
  formulasExclNormScores = NULL,
  compounds = NULL,
  compoundsNormalizeScores = "max",
  compoundsExclNormScores = c("score", "individualMoNAScore"),
  compsCluster = NULL,
  components = NULL,
  retMin = TRUE,
 clearPath = FALSE
)
## S4 method for signature 'featureGroups'
reportPDF(
  fGroups,
  path = "report",
  reportFGroups = TRUE,
  formulas = NULL,
  formulasTopMost = 5,
  formulasNormalizeScores = "max",
  formulasExclNormScores = NULL,
```

```
reportFormulaSpectra = TRUE,
  compounds = NULL,
  compoundsNormalizeScores = "max",
  compoundsExclNormScores = c("score", "individualMoNAScore"),
  compoundsOnlyUsedScorings = TRUE,
  compoundsTopMost = 5,
  compsCluster = NULL,
  components = NULL,
 MSPeakLists = NULL,
 retMin = TRUE,
 EICGrid = c(2, 1),
 EICRtWindow = 20,
 EICMzWindow = 0.005,
 EICTopMost = NULL,
 EICOnlyPresent = TRUE,
  clearPath = FALSE
)
## S4 method for signature 'featureGroups'
reportHTML(
  fGroups,
  path = "report",
  reportPlots = c("chord", "venn", "upset", "eics", "formulas"),
  formulas = NULL,
  formulasTopMost = 5,
  formulasNormalizeScores = "max",
  formulasExclNormScores = NULL,
  compounds = NULL,
  compoundsNormalizeScores = "max",
  compoundsExclNormScores = c("score", "individualMoNAScore"),
  compoundsOnlyUsedScorings = TRUE,
  compoundsTopMost = 5,
  compsCluster = NULL,
  includeMFWebLinks = "compounds",
  components = NULL,
  interactiveHeat = FALSE,
 MSPeakLists = NULL,
  retMin = TRUE,
 EICRtWindow = 20,
 EICMzWindow = 0.005,
 EICTopMost = NULL,
 EICOnlyPresent = TRUE,
  selfContained = TRUE,
 optimizePng = FALSE,
 maxProcAmount = getOption("patRoon.maxProcAmount"),
  clearPath = FALSE,
  openReport = TRUE,
  noDate = FALSE
```

)

# Arguments

fGroups The featureGroups object that should be used for reporting data.

path The destination file path for files generated during reporting. Will be

generated if needed.

reportFGroupsAsRows

Report feature groups as rows (instead of columns) within the resulting

'.csv' file.

reportFGroupsAnalysisInfo

Include analyses information (reference and replicate groups) in the re-

ported feature groups table '.csv' file.

reportFGroupsRetMz

Include feature group information (retention time and m/z) within the reported feature groups table '.csv' file.

reportFeatures If set to TRUE then for each analysis a '.csv' file will be generated with information about its detected features.

formulas, compounds, compsCluster, components

Further objects (formulas, compounds, compoundsCluster, components) that should be reported. Specify NULL to skip reporting a particular ob-

ject.

compoundsNormalizeScores, formulasNormalizeScores

A character that specifies how normalization of compound scorings occurs. Either "none" (no normalization), "max" (normalize to max value) or "minmax" (perform min-max normalization). Note that normalization of negative scores (e.g. output by SIRIUS) is always performed as min-max. Furthermore, currently normalization takes the original scoring min/max values into account when candidates were generated. Thus, normalization is not affected when candidate results were removed after they were generated (e.g. by use of filter).

compoundsExclNormScores, formulasExclNormScores

A character vector specifying any compound scoring names that should not be normalized. Set to NULL to normalize all scorings. Note that

 $whether \ any \ normalization \ occurs \ is \ set \ by \ the \ {\tt compoundsExclNormScores}, for {\tt mulasExclNormScores} and {\tt compoundsExclNormScores}, for {\tt mulasExclNormScores}, for {\tt$ 

argument.

For compounds: By default score and individualMoNAScore are set to

mimic the behaviour of the MetFrag web interface.

retMin If TRUE then report retention times in minutes (otehrwise seconds).

clearPath If TRUE then the destination path will be (recursively) removed prior to

reporting.

formulasTopMost, compoundsTopMost

Only this amount of top ranked candidate formulae/compounds are reported. Lower values may significantly speed up reporting. Set to NULL to ignore.

reportFormulaSpectra

If TRUE then explained MS/MS spectra (if available) for candidate formulae will be reported. Specifying formulas and setting this argument to FALSE still allows further annotation of compound MS/MS spectra.

compoundsOnlyUsedScorings

If TRUE then only scorings are plotted that actually have been used to rank data (see the scoreTypes argument to generateCompoundsMetfrag for more details).

MSPeakLists A MSPeakLists object that is mandatory when spectra for formulae and/or compounds will be reported.

**EICGrid** An integer vector in the form c(columns, rows) that is used to determine the plotting grid when reporting EICs in PDF files.

EICRtWindow, EICMzWindow, EICTopMost, EICOnlyPresent

Plotting parameters passed to plotEIC (i.e. rtWindow, mzWindow, topMost and onlyPresent arguments).

reportPlots A character vector specifying what should be plotted. Valid options are: "chord", "venn", "upset" (plot a chord, Venn and UpSet diagram, respectively), "eics" (plot EICs for individual feature groups) and "formulas" (plot annotated formula spectra). Set to "none" to plot none of these.

includeMFWebLinks

A character specifying to which feature groups a web link should be added in the annotation page to MetFragWeb. Options are: "compounds" (only to those with compounds results), "MSMS" (only to those with MSMS peak lists) or "none".

interactiveHeat

If TRUE an interactive heatmap HTML widget will be generated to display hierarchical clustering results. Set to FALSE for a 'regular' static plot.

selfContained If TRUE the output will be a standalone HTML file which contains all graphics and script dependencies. When FALSE, the latter will be placed in an additional directory ('report\_files') which should remain present when viewing the output file. Especially on Windows, a non-self contained output might be desirable when reporting large amounts of data

to prevent pandoc from running out of memory.

If TRUE then pngquant is used to reduce the size of generated graphics. A optimizePng signficant reduction in disk space usage may be seen, however, at the cost

additional processing time.

Maximum amount of pngquant commands to run in parallel. Higher maxProcAmount

numbers will decrease processing time, with an optimum usually close to

the amount of CPU cores.

openReport If set to TRUE then the output report file will be opened with the system

browser.

noDate If TRUE then the current date is not added to the report. This is mainly used for testing and its main purpose is to guarentees equal report files

when 'reportHTML()' is called multiple times with equal arguments.

suspect-screening 119

### **Details**

These functions are usually called at the very end of the workflow. It is used to report various data on features and feature groups. In addition, these functions may be used for reporting formulae and/or compounds that were generated for the specified feature groups. Data can be reported in tabular form (i.e. '.csv' files) by reportCSV or graphically by reportPDF and reportHTML. The latter functions will plot for instance chromatograms and annotated mass spectra, which are useful to get a graphical overview of results.

All functions have a wide variety of arguments that influence the reporting process. Nevertheless, most parameters are optional and only required to be given for fine tuning. In addition, only those objects (e.g. formulae, compounds, clustering) that are desired to be reported need to be specified.

reportCSV generates tabular data (i.e. '.csv' files) for given data to be reported. This may also be useful to allow import by other tools for post processing.

reportPDF will report graphical data (e.g. chromatograms and mass spectra) within PDF files. Compared to reportHTML this function may be faster and yield smaller report files, however, its functionality is a bit more basic and generated data is more 'scattered' around.

reportHTML will report graphical data (e.g. chromatograms and mass spectra) and summary information in an easy browsable HTML file using rmarkdown, flexdashboard and knitr.

### Note

Any formulae and compounds for feature groups which are not present within fGroups (*i.e.* because it has been subset afterwards) will not be reported.

### References

Creating MetFrag landing page URLs based on code from MetFamily R package.

Yihui Xie (2015) Dynamic Documents with R and knitr. 2nd edition. Chapman and Hall/CRC. ISBN 978-1498716963

Yihui Xie (2014) knitr: A Comprehensive Tool for Reproducible Research in R. In Victoria Stodden, Friedrich Leisch and Roger D. Peng, editors, Implementing Reproducible Computational Research. Chapman and Hall/CRC. ISBN 978-1466561595

suspect-screening

Target and suspect screening

## Description

Utilities to screen for analytes with known or suspected identity.

120 suspect-screening

# Usage

```
screenSuspects(
  obj,
  suspects,
  rtWindow = 12,
 mzWindow = 0.005,
  adduct = NULL,
  skipInvalid = TRUE
)
## S4 method for signature 'features'
screenSuspects(
 obj,
  suspects,
  rtWindow = 12,
 mzWindow = 0.005,
 adduct = NULL,
  skipInvalid = TRUE
)
## S4 method for signature 'featureGroups'
screenSuspects(
  obj,
  suspects,
  rtWindow = 12,
 mzWindow = 0.005,
  adduct = NULL,
  skipInvalid = TRUE
)
## S4 method for signature 'featureGroups'
groupFeaturesScreening(fGroups, scr)
importFeatureGroupsBrukerTASQ(path, analysisInfo, clusterRTWindow = 12)
```

# Arguments

obj

The object that should be screened (i.e. features or featureGroups).

suspects

A data.frame that must contain a "name" column (the analyte name) and at least a "mz", "neutralMass", "formula", "SMILES", "InChI" column (with the ionized m/z value, the neutral monoisotopic mass or the chemical formula/SMILES/InChI character string for the molecule, respectively). If an ion mass needs to be calculated (i.e. no valid data is available in the mz column) then data is tried to be used from the columns in the aforementioned order. Furthermore, if ion masses need to be calculated then the adduct must be specified either with the adduct function argument or by an "adduct" column containing a character that can be converted with as adduct (e.g. "[M+H]+"). In addition, a column "rt"

suspect-screening 121

can be included to specify the retention time (if unspecified no retention times are checked).

rtWindow, mzWindow

The retention time window (in seconds) and m/z window that will be

used for matching a suspect (+/- feature data).

adduct An adduct object (or something that can be converted to it with as.adduct).

Examples: "[M-H]-", "[M+Na]+". Can be NULL if either a "mz" or "adduct"

column is present in the suspects argument.

skipInvalid If set to TRUE then suspects with invalid data (e.q. missing names or other

missing data) will be ignored with a warning. Similarly, any suspects for which mass calculation failed (when no mz column is present in the suspect list), for instance, due to invalid SMILES, will be ignored with a warning.

fGroups The featureGroups object that should be transformed (and was used to

obtain the screening results).

scr The screening results table returned by screenSuspects.

path The file path to an Excel export of the Global results table from TASQ,

converted to '.csv' format.

analysisInfo A table with analysis information.

clusterRTWindow

This retention time window (in seconds) is used to group hits across anal-

yses together. See also the details section.

### **Details**

Besides 'full non-target analysis', where compounds may be identitified with little to no prior knowledge, a common strategy is to screen for compounds with known or suspected identity. This may be a generally favourable approach if possible, as it can significantly reduce the load on data interpretation.

screenSuspects will screen a set of suspects (provided as a data.frame) within an features or featureGroups object.

groupFeaturesScreening uses results from screenSuspects to transform an existing featureGroups object by (1) renaming any matched feature groups by the respective name of the suspect and (2) filtering out any feature groups that were not matched. A common workflow is to first obtain and group features (with e.g. findFeatures and groupFeatures), screen them with screenSuspects, convert the featureGroups object that was used for screening with this method function and continue any further workflow steps such as compound identification as with 'regular' featureGroups.

importFeatureGroupsBrukerTASQ will convert screening results from Bruker TASQ to a featureGroups object. The feature groups across analyses are formed based on the name of suspects and their closeness in retention time. The latter is necessary because TASQ does not necessarily perform checks on retention times and may therefore assign a suspect to peaks with different retention times across analyses (or within a single analysis). Hence, suspects with equal names are hierarchically clustered on their retention times (using fastcluster) to form the feature groups. The cut-off value for this is specified by the clusterRTWindow argument. The input for this function is obtained by generating an Excel

122 verifyDependencies

export of the 'global' results and subsequently converting the file to '.csv' format. Similar to groupFeaturesScreening, this method will return an object that is suitable for any further workflow processes.

### Value

screenSuspects will return a table (a data.table) with detected suspects and details such as retention and m/z values. If a suspect is matched on multiple features/feature groups then each hit is reported as a separate row.

groupFeaturesScreening returns a modified featureGroups object in which those feature groups that were not matched by any suspects are removed and others renamed by the respective suspect name. In case of duplicate suspect results, feature group names are made unique with make.unique.

importFeatureGroupsBrukerTASQ returns a new featureGroups object containing converted screening results from Bruker TASQ.

#### Note

Both groupFeaturesScreening and importFeatureGroupsBrukerTASQ use names from targets/suspects as feature group names, therefore, it is important that these are file-compatible names when reporting data 'csv' or 'pdf' data.

For screenSuspects in some cases you may need to install OpenBabel (e.g. when only InChI data is available for mass calculation).

Please note that groupFeaturesScreening method can only transform the featureGroups object that was used to obtain the given screening results.

importFeatureGroupsBrukerTASQ will use estimated min/max values for retention times and dummy min/max m/z values for conversion to features, since this information is not (readily) available. Hence, when plotting, for instance, extracted ion chromatograms (with plotEIC) the integrated chromatographic peak range shown is incorrect.

## References

Daniel Müllner (2013). fastcluster: Fast Hierarchical, Agglomerative Clustering Routines for R and Python. Journal of Statistical Software, 53(9), 1-18. URL http://www.jstatsoft.org/v53/i09/.

verifyDependencies Verifies if all dependencies are installed properly and instructs the user if this is not the case.

## Description

Verifies if all dependencies are installed properly and instructs the user if this is not the case.

### Usage

verifyDependencies()

workflowStep-class 123

workflowStep-class

(Virtual) Base class for all workflow objects.

# Description

All workflow objects (e.g. featureGroups, compounds, etc) are derived from this class. Objects from this class are never created directly.

# Usage

```
## S4 method for signature 'workflowStep'
algorithm(obj)

## S4 method for signature 'workflowStep'
as.data.table(x, keep.rownames = FALSE, ...)

## S4 method for signature 'workflowStep'
as.data.frame(x, row.names = NULL, optional = FALSE, ...)

## S4 method for signature 'workflowStep'
show(object)
```

# Arguments

```
obj, x, object An object (derived from) this class.
keep.rownames Ignored.
... Method specific arguments. Please see the documentation of the derived classes.
row.names, optional Ignored.
```

## Methods (by generic)

- algorithm: Returns the algorithm that was used to generate an object.
- as.data.table: Summarizes the data in this object and returns this as a data.table.
- as.data.frame: This method simply calls as.data.table and converts the result to a classic a data.frame.
- show: Shows summary information for this object.

## Slots

algorithm The algorithm that was used to generate this object. Use the algorithm method for access.

# S4 class hierarchy

- workflowStep
  - features
    - \* featuresFromFeatGroups
    - \* featuresConsensus
    - \* featuresBruker
    - \* featuresEnviPick
    - \* featuresOpenMS
    - \* featuresBrukerTASQ
    - \* featuresXCMS
    - \* featuresXCMS3
  - featureGroups
    - \* featureGroupsBruker
    - \* featureGroupsConsensus
    - \* featureGroupsEnviMass
    - \* featureGroupsOpenMS
    - \* featureGroupsScreening
    - \* featureGroupsBrukerTASQ
    - \* featureGroupsXCMS
    - \* featureGroupsXCMS3
  - components
    - \* componentsReduced
    - \* componentsCamera
    - \* componentsIntClust
    - \* componentsNT
    - \* componentsRC
  - compounds
    - \* compoundsConsensus
    - \* compoundsMF
  - formulas
  - MSPeakLists