Package 'RcometsAnalytics'

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Type Package

Title Comets Analytics for consortium based metabolomic analyses
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Description This R package support all cohort-specific analyses of the COMETS consortium. Data are not saved in the system but output must be downloaded and submitted for meta-analyses. This package can be used in several ways: supports the CBIIT implementation of comets-analytics, local shiny based add-in called shinycomets, or console based analysis. See example vignette. The version of the package is noted as: level 1 and 2 reflect the comets-analytics version, 3rd level reflects the number of major revision and 4th level for bug fixes.
Depends R (>= $3.5.0$)
Imports readxl, rio, dplyr, plyr, plotly, tidyr, heatmaply, stringr, data.table, caret, subselect, broom, psych, MASS, ppcor, survival
Suggests Hmisc, knitr, testthat, rmarkdown
VignetteBuilder knitr
License GPL-3
RoxygenNote 7.2.3
NeedsCompilation no
<pre>URL http://comets-analytics.org/</pre>
$\pmb{BugReports} \text{ https://github.com/CBIIT/nci-webtools-comets-analytics/issues}$
R topics documented:
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RcometsAnalytics-package

RcometsAnalytics R package

Description

This R package supports all cohort-specific analyses of the COMETS consortium https://www.comets-analytics.org/. Data are not saved in the system but output must be downloaded and submitted for meta-analyses.

Details

Functions for analysis:

runCorr (correlation analysis)

runModel (correlation, glm, lm, coxph, or clogit)

runAllModels (run models in batch mode from models sheet)

Functions for graphics:

plotVar (metabolite variance distribution plot)

plotMinvalues (distribution of missing values)

showHeatmap (heat map of metabolite correlations)

showHClust (interactive heat map with hierarchical clustering)

Functions for saving results to files:

OutputCSVResults (write to .csv file)

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```
OutputXLSResults (write to excel file)
OutputListToExcel (write list of data frames to excel file with multiple sheets)
Functions for meta-analysis:
runMeta (run a single meta-analysis)
runAllMeta (run multiple meta-analyses)
meta_calc (main calculation function for meta-analysis)
```

clogit.options

options list for clogit

Description

A list of 2:

- method One of: "exact", "approximate", "efron", "breslow". The default is "exact".
- weights A variable name to specify weights. The default is NULL.

Examples

```
model.options <- list(method="efron", weights="weightVarInData")</pre>
```

correlation.options

options list for model="correlation"

Description

A list of 1:

• method Correlation method to use. It must be one of "spearman", "pearson", "kendall". The default value is "spearman".

Examples

```
model.options <- list(method="pearson")</pre>
```

 $\verb|coxph.options| \\$

options list for coxph

Description

A list of 6:

- ties One of: "efron", "breslow", "exact". The default is "efron".
- robust TRUE or FALSE for computing a robust covariance matrix). The default is FALSE.
- weights A variable name to specify weights. The default is NULL.
- singular.ok See coxph. The default is TRUE.
- Surv. type See the type option in Surv. The default is NULL.

```
model.options <- list(robust=TRUE, weights="weightVarInData")</pre>
```

4 Effects

Effects Effects table

Description

The Effects data frame contains the estimates for each exposure, and will contain multiple rows for categorical exposure variables. Depending on the model run and options specified, all the below names may not appear in the data frame.

- corr The correlation between term and the outcome
- estimate The regression coefficient of term
- estimate.lower The lower confidence limit for term
- estimate.upper The upper confidence limit for term
- exp.estimate The exponentiated regression coefficient of term
- exp.estimate.lower The exponentiated lower confidence limit for term
- exp.estimate.upper The exponentiated upper confidence limit for term
- exp.std.error The standard error of exp.estimate from the delta method
- exposurespec Exposure variable
- model Model label from getModelData
- model_number Model number used in runAllModels
- outcomespec Outcome variable
- pvalue The p-value of the test
- run Run number that can be used to link with the ModelSummary table
- statistic The test statistic for term
- std.error The standard error of estimate
- stratavar Stratum variable(s)
- strata Stratum level(s)
- term Variable in the model

Details

Missing values will appear if a model did not converge, produced an error, or not run because of too many missing values in the outcome.

Errors_Warnings 5

	Errors_Warnings	Errors and Warnings table	
--	-----------------	---------------------------	--

Description

Columns in the Errors_Warnings table.

- type WARNING or ERROR
- object The object that produced the warning or error. This is typically a variable or a particular stratum.
- · message Message describing the warning or error
- model Model label from getModelData
- model_number Model number used in runAllModels

Details

The kinds of warnings and errors stored in this matrix are ones that apply to all models or all outcomes for an exposure variable. An error message for a particular exposure-outcome pair will be stored in the message column of the ModelSummary table.

filterCOMETSinput Function that subsets input data based on "where variable"

Description

Function that subsets input data based on "where variable"

Usage

```
filterCOMETSinput(readData, where = NULL)
```

Arguments

readData list from readComets

where users can specify which subjects to perform the analysis by specifying this parameter. 'where' expects a vector with a variable name, a comparison operator ("<", ">", "=","<=",">="), and a value. For example, "where = c("Gender=Female")".

Value

filtered list

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getModelData

Prepares data for the models to be run as specified in the input. Can be run in interactive or batch mode. Each model is checked for validity (correlation between predictors, zero variance, etc.).

Description

Prepares data for the models to be run as specified in the input. Can be run in interactive or batch mode. Each model is checked for validity (correlation between predictors, zero variance, etc.).

Usage

```
getModelData(
  readData,
 modelspec = "Batch",
 modlabel = "",
 outcomes = "All metabolites",
  exposures = "",
  adjvars = NULL,
  strvars = NULL,
 wgtvar = NULL,
  offvar = NULL,
  timevar = NULL,
  groupvar = NULL,
 where = NULL,
  exposurerefs = NULL
)
```

Arguments

readData

modelspec	How model is specified (Interactive or Batch). The default is Batch
modlabel	If batch, chosen model specified by batch mode (the MODEL col

List from readCOMETSinput

L column in the

Models sheet). If interactive, then the model label.

If Interactive, a vector of outcome variables (see details), the default is All outcomes

metabolites)

If Interactive, a vector of exposure variables (see details) exposures If Interactive, a vector adjustment covariates (see details) adjvars If Interactive, stratification covariates (see details) strvars wgtvar If Interactive, a variable of weights (see details) offvar If Interactive, an offset variable (see details)

timevar If Interactive, time variable(s) for survival models (see details)

If Interactive, a group variable for conditional logistic models (see details) groupvar

users can specify which subjects to perform the analysis on by specifying this where

parameter. 'where' expects a vector of strings with a variable name, a comparison operator (e.g. "<", ">", "<=", ">=", "!=", "="), and a value. For example, where = c("age>50", "bmi > 22") uses all subjects with age > 50 AND bmi > 22. Note that when running in Batch mode, rules in the WHERE column of the

Models sheet must be separated by a comma.

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exposurerefs

If Interactive, a vector of exposure reference levels for categorical exposure variables. If specified, then this vector must have the same length as exposures.

Details

All metabolite variables specified should be listed in the metabolite_name column of the Metabolites sheet of the Excel file. All non-metabolite variables should be listed in the VARREFERENCE column of the VarMap sheet. The wgtvar, offvar, and timevar are only used for specific models. See the model option in options.

Value

a list comprising:

1: subset data: gdta

2: exposure variables: ccovs

3: outcome variables: rcovs

4: adjustment variables: acovs

5: stratification variable: scovs

6: model specification: modspec

7: model label: modlab

8: whether all metabolites vs all metabolites is run: allvsall

9: weight variables: wgtcov 10: offset variables: offcov

Examples

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)</pre>
csvfile <- file.path(dir, "cometsInputAge.xlsx")</pre>
exmetabdata <- readCOMETSinput(csvfile)</pre>
modeldata <- getModelData(exmetabdata,modlabel="1 Gender adjusted")</pre>
```

glm.options

options list for glm

Description

A list of 6:

- family One of: "binomial", "gaussian", "Gamma", "inverse.gaussian", "poisson", "quasi", "quasibinomial", "quasipoisson". The default is "gaussian".
- link NULL or a string for the link function to use (see family). The default is to use the canonical link for family.
- weights A variable name to specify weights. The default is NULL.
- offset A variable name to specify an offset. The default is NULL.
- control See glm. The default is glm.control.
- singular.ok See glm. The default is TRUE.

```
model.options <- list(family="binomial", weights="weightVarInData")</pre>
```

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Description

A list of 4:

- weights A variable name to specify weights. The default is NULL.
- offset A variable name to specify an offset. The default is NULL.
- tol See 1m. The default is 1e-7.
- singular.ok See lm. The default is TRUE.

Examples

```
model.options <- list(weights="weightVarInData")</pre>
```

mergeResultsFiles This function will combine output files assumed to be from the same cohort and same model.

Description

This function will combine output files assumed to be from the same cohort and same model.

Usage

```
mergeResultsFiles(filevec, out.file, op = NULL)
```

Arguments

filevec	Character vector of files that contain the output files from runModel or runAllModels.
	Valid file extensions are ".xlsx", and ".rda".
out.file	NULL or a file to save the results. The file extension must be either ".xlsx", or ".rda".
op	A list containing the options to use or NULL. The options are precedence and check.consistency with default values of "nobs" and TRUE respectively (see details). The default is NULL.

Details

This function will merge output files containing results from the same model and same cohort. Within a file, metabolites with missing results (estimate and std.error) will be excluded. The files can have different and overlapping metabolites. When there is an overlapping metabolite among the files, the option precedence="nobs" will choose the file with the largest number of subjects for that metabolite. With precedence="data", the first file in filevec that contains the metabolite will be chosen. The option check.consistency will check for the same outcome, exposure, and stratification variable names across the files.

Value

List of data frames containing the merged results

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MetaOutputColumns

Meta Analysis Output Columns

Description

The Results data frame contains the estimates from the meta-analyses. Depending on the model run and options specified, all the below names may not appear in the data frame returned from runMeta.

- outcome_uid The harmonized outcome variable
- exposure_uid The harmonized exposure variable
- term For a continuous exposure, this will be the same as exposure_uid. For a categorical exposure, it will be the dummy variable for the exposure.
- n. cohort The number of included cohorts for the estimates.
- n. sub Total number of subjects.
- fixed.pvalue P-value for the fixed-effects model.
- random.pvalue P-value for the random-effects model.
- fixed.estimate Estimate for the fixed-effects model.
- fixed.std.error Estimated standard error of fixed.estimate. This will not appear for correlation models.
- random.estimate Estimate for the random-effects model.
- random.std.error Estimated standard error of random.estimate. This will not appear for correlation models.
- fixed.estimate.L Lower 95 percent confidence limit for fixed.estimate.
- fixed.estimate.U Upper 95 percent confidence limit for fixed.estimate.
- $\bullet \ \ \text{random.estimate.L Dower 95 percent confidence limit for random.estimate}.$
- random.estimate.U Upper 95 percent confidence limit for random.estimate.
- het.pvalue P-value for Cochran's Q test of heterogeneity.
- stratavar Stratum variable(s)
- strata Stratum level(s)
- strata.fixed.het.pvalue P-value for Cochran's Q test of heterogeneity across the strata using the fixed-effects meta-analysis estimates.
- strata.fixed.het.df Degrees of freedom for the above test.
- strata.random.het.pvalue P-value for Cochran's Q test of heterogeneity across the strata using the random-effects meta-analysis estimates.
- strata.random.het.df Degrees of freedom for the above test.

Details

Correlation models will not contain columns for fixed.std.error and random.std.error. Instead, there will be columns for lower and upper confidence limits of fixed.estimate and random.estimate.

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meta_calc	Main function that performs the meta-analysis calculations.

Description

Main function that performs the meta-analysis calculations.

Usage

```
meta_calc(beta, se)
```

Arguments

beta matrix or vector of betas. If a matrix, then the rows represent the metabolites

and the columns represent the cohorts.

se matrix or vector of the standard errors for beta. This object must be in the same

order and have the same dimension as beta.

Value

List containing the results from fixed-effect and random-effect meta-analyses along with Cochran's Q test for heterogeneity.

meta_opfile	Options file for meta-analyses	
-------------	--------------------------------	--

Description

An Excel file containing models and options for the runAllMeta function

Details

The file should contain sheets **META_MODELS** and **META_TYPES**. Each sheet is optional. The **META_MODELS** sheet should have a column called MODEL containing the models for meta-analysis. This list of models can be a subset of models defined by the input files. This sheet can also have a optional column called MODEL_TYPE that links to the **META_TYPES** sheet defining the options for each model. See the example file in /inst/extdata/cometsMetaInput.xlsx.

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meta_options	Meta-analysis options	

Description

A list of options for the runMeta function

Details

- min.n.cohort Minimum number of cohorts to include when meta-analyzing each metabolite. The default is 2.
- min.nsub.cohort Minimum number of subjects in a cohort for a metabolite to be included from that cohort. The default is 25.
- min.nsub.total Minimum number of subjects in all cohorts for a metabolite to be metaanalyzed. The default is 50.
- cohorts.include Character vector of cohorts to include. The default is NULL.
- cohorts.exclude Character vector of cohorts to exclude. The default is NULL.
- output.type Type of output file, either "xlsx" for an Excel worksheet or "rda" for an R object file created with the save() function. The default is "xlsx".
- strata.exclude.het.test A list of stratification levels to be excluded from the test for heterogeneity. This list has the form list(var1=vec1, var2=vec2, ...), where var1, var2, ... are stratification variables, and vec1, vec2, ... are vectors of stratification levels to be removed from the test. The default is NULL.

ModelSummary table

Description

The ModelSummary data frame contains one row of model summary results for each exposure/outcome combination. Depending on the model run and options specified, all the below names may not appear in the data frame.

- adjspec Original adjustment variables specified
- adjvars Adjustment variables included in the model
- adjvars.removed Adjustment variables removed from the model
- adj_uid Adjustment variable universal ids
- adj.r.squared Adjusted R-squared
- aic Akaike information criterion
- bic Bayesian information criterion
- cohort String passed into runModel
- converged TRUE or FALSE for model convergence
- · deviance Deviance of the fitted model
- df.null NULL model degrees of freedom

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- df.residual Residual degrees of freedom
- exposure Exposure variable
- exposure_uid Exposure universal id
- exposurespec Exposure variable
- loglik Log-likelihood of the fitted model
- message Error message produced from the modeling function
- model Model label from getModelData
- model_function Model function used in runModel
- model_number Model number used in runAllModels
- · nobs Number of observations used
- null.deviance Deviance of the NULL model
- outcome Outcome variable
- outcomespec Outcome variable
- outcome_uid Outcome universal id
- run Run number that can be used to link with the Effects table
- runmode "Batch" or "Interactive"
- r. squared R-squared, the fraction of variance explained by the model
- sigma Square root of the estimated variance of the random error
- stratavar Stratum variable(s)
- strata Stratum level(s)
- term Variable in the model
- wald.pvalue P-value from the Wald test of the exposure variable. Note that this test may be a multi-df test if the exposure is categorical.

Details

Missing values will appear if a model did not converge, produced an error, or not run because of too many missing values in the outcome.

options

options list

Description

A list of 19:

- check.cor.cutoff Cutoff value to remove highly correlated columns in the design matrix.
 The default value is 0.97.
- check.cor.method Correlation method to remove highly correlated columns in the design matrix. It must be one of "spearman", "pearson", "kendall". The default value is "spearman".
- check.design TRUE or FALSE to check the design matrix for linearly dependent columns, highly correlated columns, or for being ill-conditioned whenever it is updated. The default is TRUE.

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 check.illCond TRUE or FALSE to check for an ill-conditioned design matrix. The default is TRUE.

- check.nsubjects Minimum number of subjects. The default is 25.
- max.npairwise The maximum number of metabolites to process the "all pairwise correlations" model. The default is 100.
- max.nstrata The maximum number of strata for a stratified analysis. The default is 10.
- model String for the model function. Currently, it must be one of "correlation", "lm", "glm", "coxph", or "clogit". The default is "correlation".
- model.options List of options specific for the model. See correlation.options, glm.options, lm.options, coxph.options and clogit.options for options specific to model="correlation", "lm", "glm", "coxph", "clogit" respectively. The default is NULL.
- output.ci_alpha Confidence interval level for estimated from glm models. This option must be a number >= 0 and < 1, where 0 is for not creating confidence intervals. The default value is 0.95.
- output. Effects A string to define the terms output in the returned Effects and ModelSummary data frames. Currently, it must be "exposure" or "all". If set to "all", then summary statistics for the exposure and adjustment variables will be output. Otherwise, only summary statistics for the exposure will be output. This option is ignored with model = "correlation". The default is "exposure".
- output.exp_parms TRUE, FALSE or NULL to exponentiate parameter estimates. Standard errors are obtained from the delta method. The default is NULL, so that estimates from logistic regression and survival models will be exponentiated, and not otherwise.
- output.metab.cols Character vector of column names in the METABOLITES sheet to be output in the ModelSummary and Effects data frames. Metabolite ids are matched first using the outcomespec column and then using the exposurespec column. The default is "metabolite name".
- output. ModelSummary A string to defines the columns output in the returned ModelSummary data frame. Currently, it must be "anova" or "all". This option is ignored with model = "correlation". The default is "anova".
- output.type "rda" or "xlsx" to define the type of output file(s) when runAllModels is called. See output.common.cols and output.merge.

 The default is "xlsx".
- output.merge One of the following strings: "all", "by_function", "by_model_type" or "none". This option is used to merge model results together in order to reduce the number of output files. Setting to "all" will merge all model results together and output them to a single file. Setting to "by_function" will merge results from the same model function together and output to a file with the model function contained in the output file name. Similarly for "by_model_type", where the MODEL_TYPE column in the MODELS sheet of the input Excel file is used to identify the models that will be merged together. Setting to "none" will not merge results. The default is "none".
- chemEnrich 0 or 1 to run a chemical class enrichment (0=no, 1=yes) using RaMP. The default is 0.
- chemEnrich.adjPvalue The BH-adjusted p-value cutoff to select metabolites for chemical class enrichment. The default is 0.05.

Details

Before any analysis is performed, an initial design matrix is constructed using the above options as follows:

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1. Adjustment variables with less than two distinct non-missing values, or with less than check.nsubjects non-missing values are removed.

- 2. The design matrix is created from the remaining adjustment variables and any linearly dependent columns are removed.
- 3. If check.cor.cutoff > 0, then highly correlated columns are removed by computing the correlation matrix cor_matrix = cor(design_matrix, method=check.cor.method).
- 4. If check.illCond is TRUE, then the function subselect::trim.matrix is applied to the correlation matrix to determine if additional columns will be removed.

If check.design is TRUE, then steps 2-4 are repeated each time an exposure variable is added to the design matrix or when rows of the design matrix are removed due to missing values in an outcome variable.

Examples

```
# Logistic regression with all default options
model.op <- list(family="binomial")
op <- list(model="glm", model.options=model.op)
# Compute Pearson correlations requiring at least 100 subjects
model.op <- list(method="pearson")
op <- list(model="correlation", check.nsubjects=100, model.options=model.op)</pre>
```

OutputCSVResults

Create output CSV file

Description

Create output CSV file

Usage

```
OutputCSVResults(filename, dataf, cohort = "")
```

Arguments

filename name of CSV file and can include path dataf correlation output (from function runCorr())

cohort cohort name

Value

the filename of the CSV file with results named with cohort

```
## Not run:
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata,exposures="age",modlabel="1 Gender adjusted",
outcomes=c("lactose","lactate"))
corrmatrix <-runCorr(modeldata,exmetabdata,"DPP")</pre>
```

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```
# Get correlation results
OutputCSVResults(filename="corr",dataf=corrmatrix,cohort="DPP")
# Get harmonization results
OutputCSVResults(filename="harmonization",dataf=exmetabdata$metab,cohort="DPP")
## End(Not run)
```

OutputListToExcel

Create an excel xlsx file from a list of data frames

Description

Create an excel xlsx file from a list of data frames

Usage

```
OutputListToExcel(filename, obj)
```

Arguments

filename Name of file and can include path. It must have a ".xlsx" extension.

obj List of data frames or matrices

Description

Create output XLSX file

Usage

```
OutputXLSResults(filename, datal, cohort = "")
```

Arguments

filename name of file and can include path

data list to output (each item on list outputs to a worksheet)

cohort cohort name

Value

the filename of the XLSX file with results named with cohort

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Examples

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata,exposures="age",modlabel="1 Gender adjusted",
outcomes=c("lactose","lactate"))
# Get descriptive data
descdata <-runDescrip(exmetabdata)
OutputXLSResults(filename="corr",datal=descdata,cohort="DPP")</pre>
```

plotMinvalues

Plot the distribution of the number of missing values for each metabo-

Description

Plot the distribution of the number of missing values for each metabolite

Usage

```
plotMinvalues(
  cometsdata,
  title = "Distribution of the Number/Missing Values",
  xlabel = "Number of minimum/missing values",
  ylabel = "Frequency",
  xylabelsize = 12,
  titlesize = 16
)
```

Arguments

```
cometsdata output of readCOMETSinput function

title main title for the plot (default is "Distribution of the Number/Missing Values")

xlabel x-axis label (default is "Number of minimum/missing values")

ylabel y-axis label (default is "Frequency")

xylabelsize size of x and y labels (default=8)

titlesize size of title (default, 20)
```

Value

a distribution plot

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
plotMinvalues(exmetabdata)</pre>
```

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plotVar

Plot the variance distribution of transformed metabolite abundances

Description

Plot the variance distribution of transformed metabolite abundances

Usage

```
plotVar(
  cometsdata,
  title = "Distribution of Variance",
  titlesize = 16,
  xlabel = "Variance of transformed metabolite abundances",
  ylabel = "Frequency",
  xylabelsize = 12
)
```

Arguments

cometsdata output of readCOMETSinput function

title main title for the plot (default is "Distribution of Variance")

titlesize size of title (default, 20)

xlabel x-axis label (default is "Variance of transformed metabolite abundances")

ylabel y-axis label (default is "Frequency")

xylabelsize size of x and y labels (default=8)

Value

a distribution plot

Examples

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
plotVar(exmetabdata)</pre>
```

 ${\tt readCOMETSinput}$

Read in Excel file that contains metabolite data, covariate data, models, and model options.

Description

Read in Excel file that contains metabolite data, covariate data, models, and model options.

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Usage

readCOMETSinput(file)

Arguments

file

path of Excel file to be read in. This file must contain sheets with names **Metabolites**, **SubjectMetabolites**, **SubjectData**, **VarMap**, and optionally **Models**, **Model_Types** (see details).

Details

Additional information regarding each sheet in the input Excel file is given below.

Metabolites

A table with the columns METABID, METABOLITE_NAME, and possibly other columns of information about the metabolites. The METABID column is used for harmonizing the metabolite names across different cohorts when meta-analyses are performed.

SubjectMetabolites

A table with the subject ids in the first column and metabolites as the other columns.

SubjectData

A table with the subject ids in the first column and covariates as the other columns.

VarMap

A table with at least the required columns VARREFERENCE, COHORTVARIABLE, VARTYPE, VARDEFINITION, and optionally ACCEPTED_VALUES. The COHORTVARIABLE column must contain names that match the column names in the **SubjectData** table. These names will be renamed to their corresponding name in the VARREFERENCE column. The VARTYPE column should have values continuous or categorical for each row. The ACCEPTED_VALUES column defines the allowed values that the variable should have, and an error will be thrown if the variable is outside of the accepted values. For a categorical variable, ACCEPTED_VALUES should be a comma separated list of values such as '1, 2, 3'. For a continuous variable, ACCEPTED_VALUES should be a range of the form: (a, b), (a, b], [a, b), or [a, b], where parentheses denote exclusion of the value, and brackets denote inclusion of the value. Use Inf or -Inf to denote infinity or minus infinity.

Models

A table where each row represents a model to be run, and with columns MODEL, OUTCOMES, EXPOSURE, ADJUSTMENT, STRATIFICATION, WHERE, and optionally MODEL_TYPE, TIME, GROUP, and EXPOSURE_REFERENCE. All variable names in this table must match variable names in the VARREFERENCE column of the VarMap sheet. The MODEL column is a label for the model. The OUTCOMES and EXPOSURE columns define the outcome and exposure variables for the model. Use All metabolites to specify that all metabolite variables are to be included as outcomes or exposures, otherwise use a space separated list of variable names. For any categorical exposure variable, the EXPOSURE_REFERENCE column is required to specify the reference level. The reference level must match one of the ACCEPTED_VALUES in the VarMap sheet. The ADJUSTMENT column contains a space separated list of covariate adjustment variables; use an empty cell for no covariate adjustment. The STRATIFICATION column is used for stratified analyses, with a space separated list of stratification variables. If more than one stratification variable is specified, then the strata are defined by all unique combinations of the stratification variables that appear in the data. The WHERE column is used to define a subset of subjects to include in the analysis, and has the form variable operator value, where operator can be one of the following >, <, >=, <= !=, =. An example WHERE condition is age > 50, which will include all subjects older than 50 in the analysis. Multiple WHERE conditions must be separated by a comma and are logically connected with the & operator. For example, the WHERE condition age > 50, bmi >= 22 will include the subjects older than 50 AND with bmi >= 22. Values in the MODEL_TYPE column must match with the MODEL_TYPE column in the **Model_Types** sheet. The TIME column is only required when survival models are run. This column can contain a single time variable or two

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time variables separated by a space. The GROUP column is only required when conditional logistic regression models are run. This column can contain only a single variable that defines the groups (sets, strata). This sheet is not required when running in interactive mode, but is required when running in batch mode.

Model_Types

A table where each row specifies an option and has columns MODEL_TYPE, FUNCTION, OPTION, and VALUE. For an example sheet and additional information about this sheet, see the Excel file /extdata/cometsInput.xlsx. This sheet is optional, but is required when the **Models** sheet contains the column MODEL_TYPE.

Value

a list comprising of data and information needed for getModelData.

Examples

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)</pre>
```

runAllMeta

This function allows users to run meta-analyses on all models or a subset of models

Description

This function allows users to run meta-analyses on all models or a subset of models

Usage

```
runAllMeta(filesFolders, out.dir, opfile = NULL)
```

Arguments

filesFolders	Character vector of files and/or folders that contain the output files from runAllModels. Valid file extensions are ".xlsx", ".rda", ".zip", ".tar", and ".tar.gz". Zip and tar files must contain files with extensions ".xlsx" or ".rda".
out.dir	Output directory to save the results for each model.
opfile	Excel file containing the models and options. See meta_opfile. The default is NULL.

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runAllModels	This function allows users to run all models that are provided in the
	"Models" sheet of the input Excel file.

Description

This function allows users to run all models that are provided in the "Models" sheet of the input Excel file.

Usage

```
runAllModels(readData, cohortLabel = "", writeTofile = T)
```

Arguments

readData list from readCOMETSinput

cohortLabel cohort label (e.g. DPP, NCI, Shanghai)

writeTofile T/F (whether or not to write results for each model into separate xlsx files). Files

are written to current directory. Default is TRUE.

Value

A list of return objects from runModel or runCorr. The ith element in this list is the output from the ith model run.

Examples

```
## Not run:
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
allmodeloutput <- runAllModels(exmetabdata)
## End(Not run)</pre>
```

runCorr

Calculate correlations for input model.

Description

Calculate correlations for input model.

Usage

```
runCorr(modeldata, metabdata, cohort = "")
```

Arguments

modeldata list from function getModelData

metabdata metabolite data list from readCOMETSinput cohort cohort label (e.g DPP, NCI, Shanghai)

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Details

This function is a special case of runModel with the option op\$model = "correlation", however for backwards compatibility, it returns a data frame as in the original version of the **COMETS** R package.

Value

data frame with each row representing the correlation for each combination of outcomes and exposures represented as specified in the model (*spec), label (*lab), and universal id (*_uid) with additional columns for n, pvalue, method of model specification (Interactive or Batch), universal id for outcomes (outcome_uid) and exposures (exposure_uid) name of the cohort, adjustment (adjvars) and stratification (stratavar,strata) variables. Attribute of dataframe includes ptime for processing time of model run.

Examples

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata,exposures="age",modlabel="1 Gender adjusted",
outcomes=c("lactose","lactate"), modelspec="Interactive")
corrmatrix <- runCorr(modeldata,exmetabdata, "DPP")</pre>
```

runDescrip

This function provides a description of the input data (for categorical data, the number of samples of each type; for continous data, the median and other statistics for each variable)

Description

This function provides a description of the input data (for categorical data, the number of samples of each type; for continous data, the median and other statistics for each variable)

Usage

```
runDescrip(readData)
```

Arguments

readData list from readComets

Value

a list with 2 data frames, continuous and categorical summaries. Type of variable is defined in varmap

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Examples

```
## Not run:
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
allmodeloutput <- runAllModels(exmetabdata)
# Get descriptive data
descdata <-runDescrip(exmetabdata)
OutputXLSResults(filename="corr",datal=descdata,cohort="DPP")
## End(Not run)</pre>
```

runMeta

This function allows users to run a single meta-analysis

Description

This function allows users to run a single meta-analysis

Usage

```
runMeta(filevec, op = NULL)
```

Arguments

filevec Character vector of files that contain the output files from runModel or runAllModels.

Valid file extensions are ".xlsx", and ".rda".

op A list containing the options to use. See meta_options. The default is NULL.

Value

List of data frames containing the results and information

runModel

Main function for running the models

Description

Main function for running the models

Usage

```
runModel(modeldata, metabdata, cohortLabel = "", op = NULL, out.file = NULL)
```

Arguments

modeldata list from function getModelData

metabdata metabolite data list from readCOMETSinput cohortLabel cohort label (e.g DPP, NCI, Shanghai)

op list of options when running in Interactive mode (see options).

out.file NULL or the name of an output file to save the results. The file extension must

be ".xlsx" or ".rda".

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Details

This function will check for stratification variables, and if present run within each stratum. The design matrix is checked for validity (see options). When running in Batch mode, the options are obtained from the Options sheet in the excel file.

Value

A list of objects with names ModelSummary, Effects, Errors_Warnings, Table1, Info. Important: check the adjvars.removed column in the ModelSummary data frame to see if any adjustment variables were dropped from the model, and use caution interpreting results when variables are removed. The Errors_Warnings object may also contain additional variables removed. Attribute of this list includes ptime for processing time of model run.

Examples

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata,exposures="age",modlabel="1 Gender adjusted",
outcomes=c("lactose","lactate"))
obj <- runModel(modeldata,exmetabdata, cohortLabel="DPP")</pre>
```

showCorr

Function that returns top N lines of the runCorr output

Description

Function that returns top N lines of the runCorr output

Usage

```
showCorr(corr, nlines = 50)
```

Arguments

corr returned object from runCorr

nlines number of lines to return (default 50)

Value

first 50 lines of output

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata,modlabel="1 Gender adjusted")
corrmatrix <- runCorr(modeldata,exmetabdata,"DPP")
showCorr(corrmatrix)</pre>
```

24 showHClust

showHClust	Show interactive heatmap using heatmaply_cor with hierarchical clustering

Description

This function outputs a heatmap with hierarchical clustering. It thus requires you to have at least 2 outcome and 2 exposure variables in your models.

Usage

```
showHClust(
  ccorrList,
  strata = NULL,
  clust = TRUE,
  colscale = "RdYlBu",
  showticklabels = TRUE
)
```

Arguments

ccorrList correlation object (output of runCorr)

strata Only valid if ccorrList is from a stratified analysis. If NULL, then results from the first stratum will be used in the plot.

clust TRUE or FALSE to show hierarchical clustering. The default is TRUE.

colscale colorscale, can be custom or named ("Hots", "Greens", "Blues", "Greys", "Purples") see RColorBrewer_colors

showticklabels TRUE or FALSE to show axis labels. The default is TRUE.

Value

a heatmap with outcomes as rows and exposures in columns.

References

For colorscale reference: RColorBrewer_colors

```
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata, modelspec="Interactive",
exposures=c("age","bmi_grp"))
corrmatrix <-runCorr(modeldata,exmetabdata,"DPP")
showHClust(corrmatrix)</pre>
```

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showHeatmap

Show interactive heatmap using plot_ly

Description

Show interactive heatmap using plot_ly

Usage

```
showHeatmap(
  ccorrList,
  strata = NULL,
  rowsortby = "estimate",
  plothgt = 700,
  plotwid = 800,
  colscale = "RdYlBu"
)
```

Arguments

```
ccorrList correlation object (output of runCorr)

strata Only valid if ccorrList is from a stratified analysis. If NULL, then results from the first stratum will be used in the plot.

rowsortby How row labels are sorted

plothgt Plot height default 700

plotwid Plot width default 800

colscale colorscale, can be custom or named ("Hots", "Greens", "Blues", "Greys", "Purples")

see https://plot.ly/ipython-notebooks/color-scales/
```

Value

a heatmap with outcomes as rows and exposures in columns.

References

For colorscale reference: https://plot.ly/ipython-notebooks/color-scales/

```
## Not run:
dir <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata <- getModelData(exmetabdata,modlabel="1 Gender adjusted")
corrmatrix <-runCorr(modeldata,exmetabdata,"DPP")
showHeatmap(corrmatrix)
## End(Not run)</pre>
```

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showModel	Function that displays the first N rows of each data frame in the the
	runModel output.

Description

Function that displays the first N rows of each data frame in the the runModel output.

Usage

```
showModel(obj, nlines = 10)
```

Arguments

```
obj returned object from runModel
nlines number of lines to display (default 10)
```

Examples

```
dir      <- system.file("extdata", package="RcometsAnalytics", mustWork=TRUE)
csvfile      <- file.path(dir, "cometsInputAge.xlsx")
exmetabdata <- readCOMETSinput(csvfile)
modeldata      <- getModelData(exmetabdata,modlabel="1 Gender adjusted")
result      <- runModel(modeldata,exmetabdata, cohortLabel="DPP")
showModel(result)</pre>
```

Table1

Non-metabolite Variable Summary Table

Description

Columns in Table1. Depending on the model run and options specified, all the below names may not appear in the data frame.

- category Category for categorical variables only
- in.model How variable enters the model (outcome, exposure, adjustment, time, group, weight, offset)
- max Maximum value
- mean Mean value
- median Median value
- min Minimum value
- n Number of non-missing observations
- n.missing Number of missing observations
- n.outcome Equal0 Number of non-missing observations with outcome = 0
- n.outcomeEqual1 Number of non-missing observations with outcome = 1
- n.unique Number of unique non-missing observations

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- quartile1 25th percentile
- quartile3 75th percentile
- stratavar Stratum variable(s)
- strata Stratum level(s)
- type Either continuous or categorical
- variable Variable name in the model

Details

The columns \max , mean, median, \min , n.missing, n.unique, quartile1, and quartile3 are for continuous variables only.

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