# Package 'ISAnalytics'

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**Title** Analyze gene therapy vector insertion sites data identified from genomics next generation sequencing reads for clonal tracking studies

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Description In gene therapy, stem cells are modified using viral vectors to deliver the therapeutic transgene and replace functional properties since the genetic modification is stable and inherited in all cell progeny. The retrieval and mapping of the sequences flanking the virushost DNA junctions allows the identification of insertion sites (IS), essential for monitoring the evolution of genetically modified cells in vivo. A comprehensive toolkit for the analysis of IS is required to foster clonal tracking studies and supporting the assessment of safety and long term efficacy in vivo. This package is aimed at (1) supporting automation of IS workflow, (2) performing base and advance analysis for IS tracking (clonal abundance, clonal expansions and statistics for insertional mutagenesis, etc.), (3) providing basic biology insights of transduced stem cells in vivo.

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URL https://calabrialab.github.io/ISAnalytics,
 https://github.com//calabrialab/isanalytics

BugReports https://github.com/calabrialab/ISAnalytics/issues

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aggregate\_metadata

Performs aggregation on metadata contained in the association file.

## **Description**

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[Maturing] Groups metadata by the specified grouping keys and returns a summary of info for each group. For more details on how to use this function: vignette("Working with aggregate functions", package = "ISAnalytics")

# Usage

```
aggregate_metadata(
  association_file,
  grouping_keys = c("SubjectID", "CellMarker", "Tissue", "TimePoint"),
  aggregating_functions = default_meta_agg(),
  import_stats = lifecycle::deprecated()
)
```

# Arguments

association\_file

The imported association file (via linkimport\_association\_file)

grouping\_keys A character vector of column names to form a group
aggregating\_functions

A data frame containing specifications of the functions to be applied to columns in the association file during aggregation. It defaults to default\_meta\_agg. The structure of this data frame should be maintained if the user wishes to change the defaults.

import\_stats

[**Deprecated**] The import of VISPA2 stats has been moved to its dedicated function, see import\_Vispa2\_stats.

#### Value

An aggregated data frame

#### See Also

```
Other Aggregate functions: aggregate_values_by_key(), default_meta_agg()
```

#### **Examples**

```
aggregate_values_by_key
```

Aggregates matrices values based on specified key.

# Description

[Maturing] Performs aggregation on values contained in the integration matrices based on the key and the specified lambda. For more details on how to use this function: vignette("Working with aggregate functions", package = "ISAnalytics")

#### Usage

```
aggregate_values_by_key(
    x,
    association_file,
    value_cols = "Value",
    key = c("SubjectID", "CellMarker", "Tissue", "TimePoint"),
    lambda = list(sum = ~sum(.x, na.rm = TRUE)),
    group = c(mandatory_IS_vars(), annotation_IS_vars()),
    join_af_by = "CompleteAmplificationID"
)
```

#### **Arguments**

х	A single integration matrix (tibble) or a list of imported integration matrices (tibble)				
association_file					
	The imported association file				
value_cols	A character vector containing the names of the columns to apply the given lambdas. Must be numeric or integer columns.				
key	A string or a character vector with column names of the association file to take as key				
lambda	A named list of functions or purrr-style lambdas. See details section.				
group	Other variables to include in the grouping besides key, can be set to NULL				
join_af_by	A character vector representing the joining key between the matrix and the metadata. Useful to re-aggregate already aggregated matrices.				

## **Details**

#### **Setting the lambda parameter:**

The lambda parameter should always contain a named list of either functions or purrr-style lambdas. It is also possible to specify the namespace of the function in both ways, for example:

```
lambda = list(sum = sum, desc = psych::describe)
```

Using purrr-style lambdas allows to specify arguments for the functions, keeping in mind that the first parameter should always be .x:

```
lambda = list(sum = ~sum(.x, na.rm = TRUE))
```

It is also possible to use custom user-defined functions, keeping in mind that the symbol will be evaluated in the calling environment, for example if the function is called in the global environment and lambda contains "foo" as a function, "foo" will be evaluated in the global environment.

```
foo <- function(x) {
   sum(x)
}
lambda = list(sum = ~sum(.x, na.rm = TRUE), foo = foo)
# Or with lambda notation
lambda = list(sum = ~sum(.x, na.rm = TRUE), foo = ~foo(.x))</pre>
```

#### **Constraints on aggregation functions:**

Functions passed in the lambda parameters must respect a few constraints to properly work and it's the user responsibility to ensure this.

- Functions have to accept as input a numeric or integer vector
- Function should return a single value or a list/data frame: if a list or a data frame is returned as a result, all the columns will be added to the final data frame.

## Value

A list of tibbles or a single tibble aggregated according to the specified arguments

6 annotation\_IS\_vars

#### See Also

Other Aggregate functions: aggregate\_metadata(), default\_meta\_agg()

## **Examples**

```
op <- options("ISAnalytics.widgets" = FALSE, "ISAnalytics.verbose" = FALSE)</pre>
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
root_correct <- system.file("extdata", "fs.zip", package = "ISAnalytics")</pre>
root_correct <- unzip_file_system(root_correct, "fs")</pre>
association_file <- import_association_file(path_AF, root_correct,</pre>
    dates_format = "dmy"
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("fragmentEstimate", "seqCount"),
    matrix_type = "annotated", workers = 2, matching_opt = "ANY"
agg <- aggregate_values_by_key(</pre>
    x = matrices,
    association_file = association_file,
    value_cols = c("fragmentEstimate", "seqCount")
options(op)
```

annotation\_IS\_vars

Names of the annotation variables for an integration matrix.

#### **Description**

Contains the names of the columns that are present if the integration matrix is annotated.

#### **Usage**

```
annotation_IS_vars()
```

## Value

A character vector

```
annotation_IS_vars()
```

```
association_file_columns
```

Names of the columns in the association file.

# **Description**

All the names of the columns present in the association file.

# Usage

```
association_file_columns()
```

# Value

A character vector

# **Examples**

```
association_file_columns()
```

as\_sparse\_matrix

Converts tidy integration matrices in the original sparse matrix form.

# Description

[Maturing] This function is particularly useful when a sparce matrix structure is needed by a specific function (mainly from other packages).

# Usage

```
as_sparse_matrix(
    x,
    fragmentEstimate = "fragmentEstimate",
    seqCount = "seqCount",
    barcodeCount = "barcodeCount",
    cellCount = "cellCount",
    ShsCount = "ShsCount"
)
```

available\_outlier\_tests

#### **Arguments**

X	A sin	gle tidy	integratio	n matrix o	er a list of inte	egration matric	es. Supports als	Ю
	multi	-quantif	ication ma	trices obta	ined via com	parison_matrix	<u> </u>	
fragmentEstima	ite							
		1.1		. •		0.1.0		

For multi-quantification matrix support: the name of the fragment estimate values column

seqCount For multi-quantification matrix support: the name of the sequence count values

barcodeCount For multi-quantification matrix support: the name of the barcode count values

cellCount For multi-quantification matrix support: the name of the cell count values col-

umn

ShsCount For multi-quantification matrix support: the name of the Shs Count values col-

umn

#### Value

Depending on input, 2 possible outputs:

- A single sparce matrix (tibble) if input is a single quantification matrix
- A list of sparce matrices divided by quantification if input is a single multi-quantification matrix or a list of matrices

#### See Also

```
Other Utility functions: generate_Vispa2_launch_AF(), generate_blank_association_file(),
unzip_file_system()
```

# **Examples**

```
path <- system.file("extdata", "ex_annotated_ISMatrix.tsv.xz",</pre>
    package = "ISAnalytics"
matrix <- import_single_Vispa2Matrix(path)</pre>
sparse <- as_sparse_matrix(matrix)</pre>
```

available\_outlier\_tests

A character vector containing all the names of the currently supported outliers tests that can be called in the function outlier\_filter.

#### **Description**

A character vector containing all the names of the currently supported outliers tests that can be called in the function outlier\_filter.

blood\_lineages\_default

# Usage

```
available_outlier_tests()
```

#### Value

A character vector

#### See Also

```
Other Outlier tests: outliers_by_pool_fragments()
```

# **Examples**

```
available_outlier_tests()
```

```
blood_lineages_default
```

Default blood lineages info

# Description

A default table with info relative to different blood lineages associated with cell markers that can be supplied as a parameter to  $\mbox{HSC\_population\_size\_estimate}$ 

# Usage

```
blood_lineages_default()
```

## Value

A data frame

```
blood_lineages_default()
```

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CIS\_grubbs

Grubbs test for Common Insertion Sites (CIS).

#### **Description**

[Experimental] Statistical approach for the validation of common insertion sites significance based on the comparison of the integration frequency at the CIS gene with respect to other genes contained in the surrounding genomic regions. For more details please refer to this paper: https://ashpublications.org/blood/article/117/20/5332/21206/Lentiviral-vector-common-integration-sites-in

# Usage

```
CIS_grubbs(
    x,
    genomic_annotation_file = system.file("extdata", "hg19.refGene.oracle.tsv.xz",
        package = "ISAnalytics"),
    grubbs_flanking_gene_bp = 1e+05,
    threshold_alpha = 0.05,
    add_standard_padjust = TRUE
)
```

# Arguments

#### **Details**

#### Genomic annotation file:

This file is a data base, or more simply a .tsv file to import, with genes annotation for the specific genome. The annotations for the human genome (hg19) is already included in this package. If for any reason the user is performing an analysis on another genome, this file needs to be changed respecting the USCS Genome Browser format, meaning the input file headers should be:

```
## name2, chrom, strand
## min_txStart, max_txEnd, minmax_TxLen
## average_TxLen, name, min_cdsStart
## max_cdsEnd, minmax_CdsLen, average_CdsLen
```

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#### Value

A data frame

#### See Also

```
Other Analysis functions: comparison_matrix(), compute_abundance(), cumulative_count_union(), sample_statistics(), separate_quant_matrices(), threshold_filter(), top_integrations()
```

## **Examples**

```
op <- options(ISAnalytics.widgets = FALSE)</pre>
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
root_correct <- system.file("extdata", "fs.zip",</pre>
    package = "ISAnalytics"
)
root_correct <- unzip_file_system(root_correct, "fs")</pre>
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = path_AF, root = root_correct,
    quantification_type = c("seqCount", "fragmentEstimate"),
    matrix_type = "annotated", workers = 2, patterns = NULL,
    matching_opt = "ANY",
    dates_format = "dmy"
)
cis <- CIS_grubbs(matrices)</pre>
options(op)
```

CIS\_volcano\_plot

Trace volcano plot for computed CIS data.

#### **Description**

[Experimental] Traces a volcano plot for IS frequency and CIS results.

# Usage

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```
suspicious_genes = clinical_relevant_suspicious_genes(),
significance_threshold = 0.05,
annotation_threshold_ontots = 0.1,
highlight_genes = NULL,
title_prefix = NULL,
return_df = FALSE
)
```

#### **Arguments**

x Either a simple integration matrix or a data frame resulting from the call to

CIS\_grubbs with add\_standard\_padjust = TRUE

onco\_db\_file Uniprot file for proto-oncogenes (see details)

tumor\_suppressors\_db\_file

Uniprot file for tumor-suppressor genes

species One between "human", "mouse" and "all"

known\_onco Data frame with known oncogenes. See details.

suspicious\_genes

Data frame with clinical relevant suspicious genes. See details.

significance\_threshold

The significance threshold

annotation\_threshold\_ontots

Value above which genes are annotated

highlight\_genes

Either NULL or a character vector of genes to be highlighted in the plot even if

they're not above the threshold

title\_prefix A string to be displayed in the title - usually the project name and other charac-

terizing info

return\_df Return the data frame used to generate the plot? This can be useful if the user

wants to manually modify the plot with ggplot2. If TRUE the function returns a

list containing both the plot and the data frame.

#### Details

# Input data frame:

Users can supply as x either a simple integration matrix or a data frame resulting from the call to CIS\_grubbs with add\_standard\_padjust = TRUE. In the first case an internal call to the function CIS\_grubbs is performed.

## Oncogene and tumor suppressor genes files:

These files are included in the package for user convenience and are simply UniProt files with gene annotations for human and mouse. For more details on how this files were generated use the help ?filename function.

## **Known oncogenes:**

The default values are contained in a data frame exported by this package, it can be accessed by doing:

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```
head(known_clinical_oncogenes())
## # A tibble: 5 x 2
    GeneName KnownClonalExpansion
##
     <chr>
              <lgl>
## 1 MECOM
              TRUE
## 2 CCND2
              TRUE
## 3 TAL1
              TRUE
## 4 LMO2
              TRUE
## 5 HMGA2
              TRUE
```

If the user wants to change this parameter the input data frame must preserve the column structure. The same goes for the suspicious\_genes parameter (DOIReference column is optional):

head(clinical\_relevant\_suspicious\_genes())

```
## # A tibble: 6 x 3
##
    GeneName ClinicalRelevance DOIReference
                                <chr>
##
     <chr>
              < lgl >
## 1 DNMT3A
              TRUE
                                https://doi.org/10.1182/blood-2018-01-829937
## 2 TET2
              TRUE
                                https://doi.org/10.1182/blood-2018-01-829937
## 3 ASXL1
              TRUE
                                https://doi.org/10.1182/blood-2018-01-829937
## 4 JAK2
              TRUE
                                https://doi.org/10.1182/blood-2018-01-829937
## 5 CBL
              TRUE
                                https://doi.org/10.1182/blood-2018-01-829937
## 6 TP53
              TRUE
                                https://doi.org/10.1182/blood-2018-01-829937
```

#### Value

A plot or a list containing a plot and a data frame

#### See Also

Other Plotting functions: HSC\_population\_plot()

```
op <- options(ISAnalytics.widgets = FALSE)

path_AF <- system.file("extdata", "ex_association_file.tsv",
    package = "ISAnalytics"
)

root_correct <- system.file("extdata", "fs.zip",
    package = "ISAnalytics"
)

root_correct <- unzip_file_system(root_correct, "fs")

matrices <- import_parallel_Vispa2Matrices_auto(
    association_file = path_AF, root = root_correct,
    quantification_type = c("seqCount", "fragmentEstimate"),
    matrix_type = "annotated", workers = 2, patterns = NULL,
    matching_opt = "ANY",
    dates_format = "dmy"</pre>
```

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```
cis <- CIS_grubbs(matrices)
plot <- CIS_volcano_plot(cis)
options(op)</pre>
```

```
clinical_relevant_suspicious_genes
```

Clinical relevant suspicious genes (for mouse and human).

# **Description**

Clinical relevant suspicious genes (for mouse and human).

# Usage

```
clinical_relevant_suspicious_genes()
```

#### Value

A data frame

# See Also

Other Plotting function helpers: known\_clinical\_oncogenes()

## **Examples**

```
clinical_relevant_suspicious_genes()
```

 ${\tt comparison\_matrix}$ 

obtain a single integration matrix from individual quantification matrices.

# Description

[Maturing] Takes a list of integration matrices referring to different qunatification types and merges them in a single data frame that has multiple value columns, each renamed according to their quantification type of reference.

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#### Usage

```
comparison_matrix(
    x,
    fragmentEstimate = "fragmentEstimate",
    seqCount = "seqCount",
    barcodeCount = "barcodeCount",
    cellCount = "cellCount",
    ShsCount = "ShsCount"
)
```

#### **Arguments**

x A named list of integration matrices, ideally obtained via import\_parallel\_Vispa2Matrices\_interactive or import\_parallel\_Vispa2Matrices\_auto. Names must be quantification types.

fragmentEstimate

The name of the output column for fragment estimate values

seqCount The name of the output column for sequence count values
barcodeCount The name of the output column for barcode count values
cellCount The name of the output column for cell count values
ShsCount The name of the output column for Shs count values

#### Value

A tibble

## See Also

```
quantification_types
```

```
Other Analysis functions: CIS_grubbs(), compute_abundance(), cumulative_count_union(), sample_statistics(), separate_quant_matrices(), threshold_filter(), top_integrations()
```

16 compute\_abundance

	omputes the abundance for every integration event in the input data time.
--	---

#### **Description**

[Maturing] Abundance is obtained for every integration event by calculating the ratio between the single value and the total value for the given group.

# Usage

```
compute_abundance(
   x,
   columns = "Value",
   percentage = TRUE,
   key = "CompleteAmplificationID",
   keep_totals = FALSE
)
```

## Arguments

x An integration matrix - aka a data frame that includes the mandatory\_IS\_vars()

as columns. The matrix can either be aggregated (via aggregate\_values\_by\_key())

or not.

columns A character vector of column names to process, must be numeric or integer

columns

percentage Add abundance as percentage?

key The key to group by when calculating totals

keep\_totals A value between TRUE, FALSE or df. If TRUE, the intermediate totals for each

group will be kept in the output data frame as a dedicated column with a trailing "\_tot". If FALSE, totals won't be included in the output data frame. If df, the totals are returned to the user as a separate data frame, together with the

abundance data frame.

#### **Details**

Abundance will be computed upon the user selected columns in the columns parameter. For each column a corresponding relative abundance column (and optionally a percentage abundance column) will be produced.

#### Value

Either a single data frame with computed abundance values or a list of 2 data frames (abundance\_df, quant\_totals)

#### See Also

```
Other Analysis functions: CIS_grubbs(), comparison_matrix(), cumulative_count_union(), sample_statistics(), separate_quant_matrices(), threshold_filter(), top_integrations()
```

#### **Examples**

compute\_near\_integrations

Scans input matrix to find and merge near integration sites.

# Description

[Experimental] This function scans the input integration matrix to detect eventual integration sites that are too "near" to each other and merges them into single integration sites adjusting their values if needed.

#### Usage

```
compute_near_integrations(
    x,
    threshold = 4,
    keep_criteria = "max_value",
    strand_specific = TRUE,
    max_value_column = "seqCount",
    map_as_widget = TRUE,
    map_as_file = TRUE,
    file_path = ".",
    export_widget_path = NULL
)
```

#### **Arguments**

x A single integration matrix, either with a single "Value" column or multiple value columns corresponding to different quantification types (obtained via comparison\_matrix)

threshold A single integer that represents an absolute number of bases for which two integrations are considered distinct

keep\_criteria

While scanning, which integration should be kept? The 2 possible choices for this parameter are:

- "max\_value": keep the integration site which has the highest value (and collapse other values on that integration).
- "keep\_first": keeps the first integration

strand\_specific

Should strand be considered? If yes, for example these two integration sites  $c(chr = "1", strand = "+", integration_locus = 14568)$  and  $c(chr = "1", strand = "-", integration_locus = 14568)$  are considered different and not grouped together.

max\_value\_column

The column that has to be considered for searching the maximum value

map\_as\_widget Produce recalibration map as an HTML widget?

map\_as\_file Produce recalibration map as a .tsv file?

file\_path String representing the path were the file will be saved. By default the function produces a folder in the current working directory and generates file names with

time stamps.

export\_widget\_path

A path on disk to save produced widgets or NULL if the user doesn't wish to save the html file

#### **Details**

The whole matrix is scanned with a sliding window mechanism: for each row in the integration matrix an interval is calculated based on the threshold value, then a "look ahead" operation is performed to detect subsequent rows which integration locuses fall in the interval. If CompleteAmplificationIDs of the near integrations are different only the locus value (and optionally GeneName and GeneStrand if the matrix is annotated) is modified, otherwise rows with the same id are aggregated and values are summed. If one of the map parameters is set to true the function will also produce a re-calibration map: this data frame contains the reference of pre-recalibration values for chr, strand and integration locus and the value to which that integration was changed to after.

#### Value

An integration matrix with same or less number of rows

#### Note

We do recommend to use this function in combination with comparison\_matrix to automatically perform re-calibration on all quantification matrices.

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cumulative\_count\_union

Integrations cumulative count in time by sample

# **Description**

[Experimental] This function computes the cumulative number of integrations observed in each sample at different time points by assuming that if an integration is observed at time point "t" then it is also observed in time point "t+1".

# Usage

```
cumulative_count_union(
    x,
    association_file = NULL,
    timepoint_column = "TimePoint",
    key = c("SubjectID", "CellMarker", "Tissue", "TimePoint"),
    include_tp_zero = FALSE,
    zero = "0000",
    aggregate = FALSE,
    ...
)
```

# **Arguments**

#### **Details**

#### **Input data frame:**

The user can provide as input for the x parameter both a simple integration matrix AND setting the aggregate parameter to TRUE, or provide an already aggregated matrix via aggregate\_values\_by\_key. If the user supplies a matrix to be aggregated the association\_file parameter must not be NULL: aggregation will be done by an internal call to the aggregation function. If the user supplies an already aggregated matrix, the key parameter is the key used for aggregation - NOTE: for this operation is mandatory that the time point column is included in the key.

## **Assumptions on time point format:**

By using the functions provided by this package, when imported, an association file will be correctly formatted for future usage. In the formatting process there is also a padding operation performed on time points: this means the functions expects the time point column to be of type character and to be correctly padded with 0s. If the chosen column for time point is detected as numeric the function will attempt the conversion to character and automatic padding. If you choose to import the association file not using the import\_association\_file function, be sure to check the format of the chosen column to avoid undesired results.

#### Value

A data frame

#### See Also

```
Other Analysis functions: CIS_grubbs(), comparison_matrix(), compute_abundance(), sample_statistics(), separate_quant_matrices(), threshold_filter(), top_integrations()
```

```
op <- options(ISAnalytics.widgets = FALSE)
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
root_correct <- system.file("extdata", "fs.zip",</pre>
    package = "ISAnalytics"
)
root_correct <- unzip_file_system(root_correct, "fs")</pre>
association_file <- import_association_file(path_AF, root_correct,
    dates_format = "dmy"
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("seqCount", "fragmentEstimate"),
    matrix_type = "annotated", workers = 2, patterns = NULL,
    matching_opt = "ANY", multi_quant_matrix = FALSE
)
#### EXTERNAL AGGREGATION
```

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date\_columns\_coll

Possible choices for date\_col parameter.

# **Description**

Possible choices for date\_col parameter.

# Usage

```
date_columns_coll()
```

# Value

A character vector of column names

#### See Also

```
remove_collisions
```

```
dates <- date_columns_coll()</pre>
```

# **Description**

All options correspond to lubridate functions:

- ymd: year, month, date
- ydm: year, day, month
- mdy: month, day, year
- myd: month, year, day
- dmy: day, month, year
- dym: day, year, month
- yq: year quantile

#### Usage

```
date_formats()
```

#### **Details**

NOTE: use the same date format across the association file.

#### Value

A character vector

#### See Also

```
import_association_file, import_parallel_Vispa2Matrices_auto
```

# **Examples**

```
date_formats()
```

```
default_iss_file_prefixes
```

Default regex prefixes for Vispa2 stats files.

# Description

Note that each element is a regular expression.

# Usage

```
default_iss_file_prefixes()
```

# Value

A character vector of regexes

default\_meta\_agg 23

## **Examples**

```
default_iss_file_prefixes()
```

default\_meta\_agg

Default metadata aggregation function table

# **Description**

A default columns-function specifications for aggregate\_metadata

# Usage

```
default_meta_agg()
```

#### **Details**

This data frame contains four columns:

- Column: holds the name of the column in the association file that should be processed
- Function: contains either the name of a function (e.g. mean) or a purrr-style lambda (e.g. ~ mean(.x,na.rm = TRUE)). This function will be applied to the corresponding column specified in Column
- Args: optional additional arguments to pass to the corresponding function. This is relevant ONLY if the corresponding Function is a simple function and not a purrr-style lambda.
- Output\_colname: a glue specification that will be used to determine a unique output column name. See glue for more details.

## Value

A data frame

#### See Also

```
Other Aggregate functions: aggregate_metadata(), aggregate_values_by_key()
```

```
default_meta_agg()
```

default\_stats

A set of pre-defined functions for sample\_statistics.

# **Description**

A set of pre-defined functions for sample\_statistics.

## Usage

```
default_stats()
```

#### Value

A named list of functions/purrr-style lambdas

# **Examples**

```
default_stats()
```

```
generate_blank_association_file
```

Creates a blank association file.

# **Description**

This function is useful if you want a blank association file to start using both Vispa2 and this package or simply if you want a correct framework to fix a malformed association file you have already.

# Usage

```
generate_blank_association_file(path)
```

# **Arguments**

path

The path on disk where the file should be written

#### Value

returns NULL

# See Also

```
Other Utility functions: as_sparse_matrix(), generate_Vispa2_launch_AF(), unzip_file_system()
```

```
temp <- tempfile()
generate_blank_association_file(temp)</pre>
```

generate\_Vispa2\_launch\_AF

Creates a reduced association file for Vispa2 run, given project and pool

# **Description**

The function selects the appropriate columns and prepares a file for the launch of Vispa2 pipeline for each project/pool pair specified.

#### Usage

```
generate_Vispa2_launch_AF(association_file, project, pool, path)
```

# **Arguments**

association\_file

The imported association file (via import\_association\_file)

project A vector of characters containing project names

pool A vector of characters containing pool names. **NOTE: the names should refer** 

to the values contained in the PoolID column of the association file and NOT

the concatenatePoolIDSeqRun column!

path A single string representing the path to the folder where files should be written.

If the folder doesn't exist it will be created.

#### **Details**

Note: the function is vectorized, meaning you can specify more than one project and more than one pool as vectors of characters, but you must ensure that:

- Both project and pool vectors have the same length
- You correctly type names in corresponding positions, for example c("CLOEXP", "PROJECT1100",
  "PROJECT1100") c("POOL6", "ABX-LR-PL5-POOL14-1", "ABX-LR-PL6-POOL15-1").
   If you type a pool in the position of a corresponding project that doesn't match no file will be produced since that pool doesn't exist in the corresponding project.

#### Value

returns NULL

#### See Also

Other Utility functions: as\_sparse\_matrix(), generate\_blank\_association\_file(), unzip\_file\_system()

#### **Examples**

HSC\_population\_plot

Plot of the estimated HSC population size for each patient.

## **Description**

Plot of the estimated HSC population size for each patient.

## Usage

```
HSC_population_plot(
  estimates,
  project_name,
  timepoints = "Consecutive",
  models = "Mth Chao (LB)"
)
```

## **Arguments**

estimates The estimates data frame, obtained via HSC\_population\_size\_estimate

project\_name The project name, will be included in the plot title

timepoints Which time points to plot? One between "All", "Stable" and "Consecutive"

models Name of the models to plot (as they appear in the column of the estimates)

#### Value

A plot

#### See Also

Other Plotting functions: CIS\_volcano\_plot()

## **Examples**

```
op <- options("ISAnalytics.widgets" = FALSE, "ISAnalytics.verbose" = FALSE)</pre>
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
)
root_correct <- system.file("extdata", "fs.zip", package = "ISAnalytics")</pre>
root_correct <- unzip_file_system(root_correct, "fs")</pre>
association_file <- import_association_file(path_AF, root_correct,</pre>
    dates_format = "dmy"
aggregated_meta <- aggregate_metadata(association_file)</pre>
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("fragmentEstimate", "seqCount"),
    matrix_type = "annotated", workers = 2, matching_opt = "ANY"
agg <- aggregate_values_by_key(</pre>
    x = matrices,
    association_file = association_file,
    value_cols = "seqCount"
estimate <- HSC_population_size_estimate(x = agg,</pre>
metadata = aggregated_meta,
stable_timepoints = NULL)
p <- HSC_population_plot(estimate, "PROJECT1")</pre>
options(op)
```

HSC\_population\_size\_estimate

Hematopoietic stem cells population size estimate.

#### **Description**

[Experimental] Hematopoietic stem cells population size estimate with capture-recapture models.

# Usage

```
HSC_population_size_estimate(
    X,
    metadata,
    stable_timepoints = NULL,
    aggregation_key = c("SubjectID", "CellMarker", "Tissue", "TimePoint"),
    blood_lineages = blood_lineages_default(),
    timepoint_column = "TimePoint",
    seqCount_column = "seqCount_sum",
    seqCount_threshold = 3,
    nIS_threshold = 5,
    cell_type = "MYELOID",
    tissue_type = "PB"
)
```

#### **Arguments**

x An aggregated integration matrix. See details.

metadata An aggregated association file. See details.

stable\_timepoints

A numeric vector or NULL if there are no stable time points.

aggregation\_key

A character vector indicating the key used for aggregating x and metadata. Note that x and metadata should always be aggregated with the same key.

blood\_lineages A data frame containing information on the blood lineages. Users can supply their own, provided the columns CellMarker and CellType are present.

timepoint\_column

What is the name of the time point column to use? Note that this column must be present in the key.

seqCount\_column

What is the name of the column in x holding the values of sequence count quantification?

seqCount\_threshold

A single numeric value. After re-aggregating x, rows with a value greater or equal will be kept, the others will be discarded.

nIS\_threshold A single numeric value. If a group (row) in the metadata data frame has a count

of distinct integration sites strictly greater than this number it will be kept, oth-

erwise discarded.

cell\_type The cell types to include in the models. Note that the matching is case-insensitive.

tissue\_type The tissue types to include in the models. Note that the matching is case-

insensitive.

# Value

A data frame with the results of the estimates

#### **Input formats**

Both x and metadata should be supplied to the function in aggregated format (ideally through the use of aggregate\_metadata and aggregate\_values\_by\_key). Note that the aggregation\_key, aka the vector of column names used for aggregation, must contain at least the columns SubjectID, CellMarker, Tissue and a time point column (the user can specify the name of the column in the argument timepoint\_column).

# On time points

If stable\_timepoints is a vector with length > 1, the function will look for the first available stable time point and slice the data from that time point onward. If NULL is supplied instead, it means there are no stable time points available. Note that 0 time points are ALWAYS discarded. Also, to be included in the analysis, a group must have at least 2 distinct non-zero time points.

## **Examples**

```
op <- options("ISAnalytics.widgets" = FALSE, "ISAnalytics.verbose" = FALSE)</pre>
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
)
root_correct <- system.file("extdata", "fs.zip", package = "ISAnalytics")</pre>
root_correct <- unzip_file_system(root_correct, "fs")</pre>
association_file <- import_association_file(path_AF, root_correct,</pre>
    dates_format = "dmy"
aggregated_meta <- aggregate_metadata(association_file)</pre>
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("fragmentEstimate", "seqCount"),
    matrix_type = "annotated", workers = 2, matching_opt = "ANY"
agg <- aggregate_values_by_key(</pre>
    x = matrices,
    association_file = association_file,
    value_cols = "seqCount"
estimate <- HSC_population_size_estimate(x = agg,</pre>
metadata = aggregated_meta,
stable_timepoints = NULL)
options(op)
```

import\_association\_file

Import the association file from disk

#### **Description**

[Maturing] Imports the association file and immediately performs a check on the file system starting from the root to assess the alignment between the two.

## Usage

```
import_association_file(
  path,
  root = NULL,
  tp_padding = 4,
  dates_format = "ymd",
  separator = "\t",
  filter_for = NULL,
  import_iss = FALSE,
  export_widget_path = NULL,
  convert_tp = TRUE,
  ...
)
```

#### **Arguments**

path The path on disk to the association file.

root The path on disk of the root folder of Vispa2 output or NULL. See details.

tp\_padding Timepoint padding, indicates the number of digits of the "Timepoint" column

once imported. Fills the content with 0s up to the length specified (ex: 1 be-

comes 0001 with a tp\_padding of 4)

dates\_format A single string indicating how dates should be parsed. Must be a value in:

date\_formats()

separator The column separator used in the file

filter\_for A named list where names represent column names that must be filtered. For

example: list(ProjectID = c("PROJECT1", "PROJECT2)) will filter the association file so that it contains only those rows for which the value of the column "ProjectID" is one of the specified values. If multiple columns are present in the

list all filtering conditions are applied as a logical AND.

import\_iss Import Vispa2 stats and merge them with the association file?

export\_widget\_path

A path on disk to save produced widgets or NULL if the user doesn't wish to

save the html file

convert\_tp Should be time points be converted into months and years?

... Additional arguments to pass to import\_Vispa2\_stats

#### Details

The import series of functions is designed to work in combination with the use of Vispa2 pipeline, please refer to this article for more details: VISPA2: A Scalable Pipeline for High-Throughput Identification and Annotation of Vector Integration Sites.

The pipeline automatically produces an hierarchical structure in the file system which follows this schema:

- /root\_folder
  - Optional intermediate folders
    - \* ProjectID |\_bam

l\_bcmuxall

l\_bed

l\_iss

**\_quality** 

| report

\_\_quantification

\*|\_\_\_concatenatePoolIDSeqRun

For each ProjectID there may be several nested PoolIDs. The alignment function only looks for PoolIDs in the quantification folder, since it's the location of the matrices to import. For more details on how to properly use these functions, refer to the vignette - vignette("how\_to\_import\_functions"). If 'NULL' the file system alignment step is skipped.

#### Value

A tibble with the contents of the association file plus columns containing the path in the file system for every project and pool if found.

#### See Also

```
date_formats
```

```
Other Import functions: import_Vispa2_stats(), import_parallel_Vispa2Matrices_auto(), import_parallel_Vispa2Matrices_interactive(), import_single_Vispa2Matrix()
```

### **Examples**

```
import_parallel_Vispa2Matrices_auto
```

Import integration matrices based on the association file.

# **Description**

[Maturing] These functions are designed to import the appropriate integration matrix files given the association file and the root folder of the file system where Vispa2 matrices are generated.

# Usage

```
import_parallel_Vispa2Matrices_auto(
   association_file,
   quantification_type,
   matrix_type = "annotated",
   workers = 2,
   multi_quant_matrix = TRUE,
   export_report_path = NULL,
   patterns = NULL,
   matching_opt = matching_options(),
   ...
)
```

#### **Arguments**

association\_file

A single string containing the path to the association file on disk, or a data frame

resulting from a previous call to import\_association\_file

quantification\_type

A vector of requested quantification\_types. Must be one in quantification\_types()

matrix\_type A single string representing the type of matrices to be imported. Can only be

one in "annotated" or "not\_annotated"

workers A single integer representing the number of parallel workers to use for the import

multi\_quant\_matrix

If set to TRUE will produce a multi-quantification matrix (data frame) through

comparison\_matrix instead of a list.

export\_report\_path

A path on disk to save produced import report or NULL if the user doesn't wish

to save the html file

patterns A character vector of additional patterns to match on file names. Please note

that patterns must be regular expressions. Can be NULL if no patterns needs to

be matched.

matching\_opt A single value between matching\_options

... <dynamic-dots> Additional named arguments to pass to import\_association\_file

and comparison\_matrix

#### Details

Import family functions are designed to work in combination with Vispa2, for more details on this take a look here: VISPA2: A Scalable Pipeline for High-Throughput Identification and Annotation of Vector Integration Sites.

For more details on how to properly use these functions, refer to the vignette - vignette ("how\_to\_import\_functions")

## Value

A named list of data frames containing data from all imported integration matrices, divided by quantification type or a multi-quantification matrix

#### **Automatic version**

The automatic version of import\_parallel\_Vispa2Matrices doesn't interact with the user directly, for this reason options in this modality are more limited compared to the interactive version. In automatic version you can't:

- Choose single projects or pools: to have a selection import the association file first and filter it according to your needs before calling the function (more details on this in the vignette)
- Choose duplicates: if, after filtering by the specified patterns, duplicates are found they are automatically ignored

#### **Interactive version**

The interactive version of import\_parallel\_Vispa2Matrices asks user for input and allows a more detailed choice of projects to import, pools to import and, if necessary, duplicate files. During the execution, a series of reports is shown in html format.

#### See Also

```
matching_options, https://stringr.tidyverse.org/articles/regular-expressions.html
Other Import functions: import_Vispa2_stats(), import_association_file(), import_parallel_Vispa2Matrices_i
import_single_Vispa2Matrix()
```

## **Examples**

import\_parallel\_Vispa2Matrices\_interactive

Import integration matrices based on the association file.

# Description

[Maturing] These functions are designed to import the appropriate integration matrix files given the association file and the root folder of the file system where Vispa2 matrices are generated.

#### Usage

```
import_parallel_Vispa2Matrices_interactive(
   association_file,
   quantification_type,
   matrix_type = "annotated",
   workers = 2,
   multi_quant_matrix = TRUE,
   export_report_path = NULL,
   ...
)
```

#### **Arguments**

association\_file A single string containing the path to the association file on disk, or a data frame resulting from a previous call to import\_association\_file quantification\_type A vector of requested quantification\_types. Must be one in quantification\_types() A single string representing the type of matrices to be imported. Can only be matrix\_type one in "annotated" or "not\_annotated" workers A single integer representing the number of parallel workers to use for the import multi\_quant\_matrix If set to TRUE will produce a multi-quantification matrix (data frame) through comparison\_matrix instead of a list. export\_report\_path A path on disk to save produced import report or NULL if the user doesn't wish to save the html file <dynamic-dots> Additional named arguments to pass to import\_association\_file

#### Details

Import family functions are designed to work in combination with Vispa2, for more details on this take a look here: VISPA2: A Scalable Pipeline for High-Throughput Identification and Annotation of Vector Integration Sites.

For more details on how to properly use these functions, refer to the vignette - vignette("how\_to\_import\_functions")

#### Value

A named list of data frames containing data from all imported integration matrices, divided by quantification type or a multi-quantification matrix

# **Interactive version**

The interactive version of import\_parallel\_Vispa2Matrices asks user for input and allows a more detailed choice of projects to import, pools to import and, if necessary, duplicate files. During the execution, a series of reports is shown in html format.

#### See Also

```
comparison_matrix, import_association_file
Other Import functions: import_Vispa2_stats(), import_association_file(), import_parallel_Vispa2Matrices_a
import_single_Vispa2Matrix()
```

# Examples

```
## Not run:
# Can't run because it's interactive and requires user input
matrices <- import_parallel_Vispa2Matrices_interactive(
    association_file,</pre>
```

and comparison\_matrix

```
quantification_type,
  matrix_type = "annotated",
  workers = 2,
  multi_quant_matrix = FALSE,
  export_report_path = NULL,
)
## End(Not run)
```

import\_single\_Vispa2Matrix

Import a single integration matrix from file

# **Description**

[**Stable**] This function allows to read and import an integration matrix produced as the output of Vispa2 pipeline and converts it to a tidy format.

# Usage

```
import_single_Vispa2Matrix(path, to_exclude = NULL, separator = "\t")
```

# **Arguments**

path The path to the file on disk

to\_exclude Either NULL or a character vector of column names that should be ignored when

importing

separator The column delimiter used

#### **Details**

The import series of functions is designed to work in combination with the use of Vispa2 pipeline, please refer to this article for more details: VISPA2: A Scalable Pipeline for High-Throughput Identification and Annotation of Vector Integration Sites. For more details on how to properly use these functions, refer to vignette("How to use import functions", package = "ISAnalytics")

#### Value

A data.table object in tidy format

## See Also

Other Import functions: import\_Vispa2\_stats(), import\_association\_file(), import\_parallel\_Vispa2Matrices\_aimport\_parallel\_Vispa2Matrices\_interactive()

import\_Vispa2\_stats

#### **Examples**

```
path_to_file <- system.file("extdata", "ex_annotated_ISMatrix.tsv.xz",</pre>
    package = "ISAnalytics"
isa_dataframe <- import_single_Vispa2Matrix(path_to_file)</pre>
```

import\_Vispa2\_stats

*Import Vispa2 stats given the aligned association file.* 

# **Description**

[Experimental] Imports all the Vispa2 stats files for each pool provided the association file has been aligned with the file system (see import\_association\_file).

## Usage

```
import_Vispa2_stats(
  association_file,
  file_prefixes = default_iss_file_prefixes(),
  join_with_af = TRUE,
  pool_col = "concatenatePoolIDSeqRun",
  export_widget_path = NULL
)
```

#### **Arguments**

association\_file

The file system aligned association file (contains columns with absolute paths to

the 'iss' folder)

file\_prefixes A character vector with known file prefixes to match on file names. NOTE: the

elements represent regular expressions. For defaults see default\_iss\_file\_prefixes.

join\_with\_af Logical, if TRUE the imported stats files will be merged with the association

file, if false a single data frame holding only the stats will be returned.

A single string. What is the name of the pool column used in the Vispa2 run?

This will be used as a key to perform a join operation with the stats files POOL

column.

export\_widget\_path

Either NULL or the path on disk where the widget report should be saved.

#### Value

A data frame

pool\_col

#### See Also

```
Other Import functions: import_association_file(), import_parallel_Vispa2Matrices_auto(),
import_parallel_Vispa2Matrices_interactive(), import_single_Vispa2Matrix()
```

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## **Examples**

**ISAnalytics** 

ISAnalytics: Analyze gene therapy vector insertion sites data identified from genomics next generation sequencing reads for clonal tracking studies

## **Description**

[Maturing] In gene therapy, stem cells are modified using viral vectors to deliver the therapeutic transgene and replace functional properties since the genetic modification is stable and inherited in all cell progeny. The retrieval and mapping of the sequences flanking the virus-host DNA junctions allows the identification of insertion sites (IS), essential for monitoring the evolution of genetically modified cells in vivo. A comprehensive toolkit for the analysis of IS is required to foster clonal tracking studies and supporting the assessment of safety and long term efficacy in vivo. This package is aimed at (1) supporting automation of IS workflow, (2) performing base and advance analysis for IS tracking (clonal abundance, clonal expansions and statistics for insertional mutagenesis, etc.), (3) providing basic biology insights of transduced stem cells in vivo.

#### Useful resources

• VISPA2: A Scalable Pipeline for High-Throughput Identification and Annotation of Vector Integration Sites

## **ISAnalytics function families**

- Import functions:
  - import\_single\_Vispa2Matrix
  - import\_association\_file
  - import\_Vispa2\_stats
  - import\_parallel\_Vispa2Matrices\_interactive
  - import\_parallel\_Vispa2Matrices\_auto
- Aggregation functions:
  - aggregate\_metadata
  - aggregate\_values\_by\_key
- Collision removal functions:

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```
- remove_collisions
```

- realign\_after\_collisions
- Removal of outliers from raw reads
  - outlier\_filter
  - outliers\_by\_pool\_fragments
- Recalibration functions:
  - compute\_near\_integrations
- Analysis functions:
  - compute\_abundance
  - comparison\_matrix
  - separate\_quant\_matrices
  - threshold\_filter
  - top\_integrations
  - sample\_statistics
  - CIS\_grubbs
  - cumulative\_count\_union
- HSC population size estimate:
  - HSC\_population\_size\_estimate
- Plotting functions:
  - CIS\_volcano\_plot
  - HSC\_population\_plot
- Utility functions:
  - generate\_blank\_association\_file
  - generate\_Vispa2\_launch\_AF
  - unzip\_file\_system
  - as\_sparse\_matrix

# Vignettes

- vignette("How to use import functions", package = "ISAnalytics")
- vignette("Collision removal functionality",package = "ISAnalytics")
- vignette("Working with aggregate functions", package = "ISAnalytics")

known\_clinical\_oncogenes

Known clinical oncogenes (for mouse and human).

## **Description**

Known clinical oncogenes (for mouse and human).

## Usage

```
known_clinical_oncogenes()
```

## Value

A data frame

## See Also

Other Plotting function helpers: clinical\_relevant\_suspicious\_genes()

## **Examples**

```
known_clinical_oncogenes()
```

mandatory\_IS\_vars

Names of mandatory variables for an integration matrix.

# Description

Contains the names of the columns that need to be present in order for a tibble to be considered an integration matrix.

## Usage

```
mandatory_IS_vars()
```

## Value

A character vector

```
mandatory_IS_vars()
```

matching\_options

Possible choices for the matching\_opt parameter.

## **Description**

These are all the possible values for the matching\_opt parameter in import\_parallel\_vispa2Matrices\_auto.

## Usage

```
matching_options()
```

#### **Details**

The values "ANY", "ALL" and "OPTIONAL", represent how the patterns should be matched, more specifically

- ANY = look only for files that match AT LEAST one of the patterns specified
- ALL = look only for files that match ALL of the patterns specified
- OPTIONAL = look preferentially for files that match, in order, all patterns or any pattern and if no match is found return what is found (keep in mind that duplicates are discarded in automatic mode)

## Value

A vector of characters for matching\_opt

## See Also

```
import_parallel_Vispa2Matrices_auto
Other Import functions helpers: quantification_types()
```

## **Examples**

```
opts <- matching_options()</pre>
```

```
outliers_by_pool_fragments
```

Identify and flag outliers based on pool fragments.

## **Description**

[Experimental] Identify and flag outliers

## Usage

```
outliers_by_pool_fragments(
  metadata,
  key = "BARCODE_MUX",
  outlier_p_value_threshold = 0.05,
  normality_test = FALSE,
  normality_p_value_threshold = 0.05,
  transform_log2 = TRUE,
  per_pool_test = TRUE,
  pool_col = "PoolID",
  min_samples_per_pool = 5,
  flag_logic = "AND",
  keep_calc_cols = TRUE,
  save_widget_path = NULL
)
```

## **Arguments**

metadata The metadata data frame

key A character vector of numeric column names

outlier\_p\_value\_threshold

The p value threshold for a read to be considered an outlier

normality\_test Perform normality test? Normality is assessed for each column in the key using Shapiro-Wilk test and if the values do not follow a normal distribution, other

calculations are skipped

normality\_p\_value\_threshold

Normality threshold

transform\_log2 Perform a log2 trasformation on values prior the actual calculations?

per\_pool\_test Perform the test for each pool?

pool\_col A character vector of the names of the columns that uniquely identify a pool

min\_samples\_per\_pool

The minimum number of samples that a pool needs to contain in order to be

processed - relevant only if per\_pool\_test = TRUE

flag\_logic A character vector of logic operators to obtain a global flag formula - only relevant if the key is longer than one. All operators must be chosen between: AND,

OR, XOR, NAND, NOR, XNOR

keep\_calc\_cols Keep the calculation columns in the output data frame?

save\_widget\_path

Either null or a string containing the path on disk where the report should be saved

## **Details**

This particular test calculates for each column in the key

• The zscore of the values

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- The tstudent of the values
- The the distribution of the tstudent values

Optionally the test can be performed for each pool and a normality test can be run prior the actual calculations. Samples are flagged if this condition is respected:

• tdist < outlier\_p\_value\_threshold & zscore < 0

If the key contains more than one column an additional flag logic can be specified for combining the results. Example: let's suppose the key contains the names of two columns, X and Y key = c("X","Y") if we specify the the argument flag\_logic = "AND" then the reads will be flagged based on this global condition: (tdist\_X < outlier\_p\_value\_threshold & zscore\_X < 0) AND (tdist\_Y < outlier\_p\_value\_threshold & zscore\_Y < 0)

The user can specify one or more logical operators that will be applied in sequence.

#### Value

A data frame of metadata with the column to\_remove

#### See Also

```
Other Outlier tests: available_outlier_tests()
```

## **Examples**

outlier\_filter

Filter out outliers in metadata, identified by the chosen outlier test.

#### **Description**

[Experimental] Filter out outliers in metadata.

# Usage

```
outlier_filter(
  metadata,
  outlier_test = "outliers_by_pool_fragments",
  negate = FALSE,
  ...
)
```

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## **Arguments**

metadata	The metadata data frame
outlier_test	A string representing a function name. The name must be one of the available outlier tests, see available_outlier_tests.
negate	If TRUE will return only the metadata that was flagged to be removed. If FALSE will return only the metadata that wasn't flagged to be removed.
	Additional named arguments passed to outliers_test

## Value

A data frame of metadata which has less or the same amount of rows

## **Examples**

# Description

These are all the possible values for the quantification\_type parameter in import\_parallel\_vispa2Matrices\_interac and import\_parallel\_vispa2Matrices\_auto.

## Usage

```
quantification_types()
```

## **Details**

The possible values are:

- $\bullet \ \ fragment Estimate$
- seqCount
- barcodeCount
- cellCount
- ShsCount

#### Value

A vector of characters for quantification types

#### See Also

```
import_parallel_Vispa2Matrices_interactive, import_parallel_Vispa2Matrices_auto
Other Import functions helpers: matching_options()
```

## **Examples**

```
quant_types <- quantification_types()</pre>
```

```
realign_after_collisions
```

Re-aligns matrices of other quantification types based on the processed sequence count matrix.

## **Description**

**[Experimental]** This function should be used to keep data consistent among the same analysis: if for some reason you removed the collisions by passing only the sequence count matrix to the remove\_collisions function, you should call this function afterwards, providing a list of other quantification matrices. NOTE: if you provided a list of several quantification types to remove\_collisions before, there is no need to call this function.

#### Usage

```
realign_after_collisions(sc_matrix, other_matrices)
```

#### **Arguments**

```
sc_matrix The sequence count matrix already processed for collisions via remove_collisions other_matrices A named list of matrices to re-align. Names in the list must be quantification types (quantification_types()) except "seqCount".
```

#### **Details**

For more details on how to use collision removal functionality: vignette("Collision removal functionality",package = "ISAnalytics")

## Value

A named list with re-aligned matrices

# See Also

```
remove_collisions
Other Collision removal: remove_collisions()
```

reduced\_AF\_columns 45

## **Examples**

```
op <- options("ISAnalytics.widgets" = FALSE)</pre>
path <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
root_pth <- system.file("extdata", "fs.zip", package = "ISAnalytics")</pre>
root <- unzip_file_system(root_pth, "fs")</pre>
association_file <- import_association_file(path, root,</pre>
    dates_format = "dmy"
)
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("fragmentEstimate", "seqCount"),
    matrix_type = "annotated", workers = 2,
    patterns = NULL, matching_opt = "ANY",
    multi_quant_matrix = FALSE
sc_matrix <- remove_collisions(matrices$seqCount, association_file)</pre>
others <- matrices[!names(matrices) %in% "seqCount"]</pre>
aligned_matrices <- realign_after_collisions(sc_matrix, others)</pre>
options(op)
```

reduced\_AF\_columns

Names of the columns of the association file to consider for Vispa2 launch.

## **Description**

Selection of column names from the association file to be considered for Vispa2 launch. NOTE: the TagID column appears only once but needs to be repeated twice for generating the launch file. Use the appropriate function to generate the file automatically.

## Usage

```
reduced_AF_columns()
```

#### Value

A character vector

```
reduced_AF_columns()
```

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remove\_collisions

*Identifies and removes collisions based on the sequence count matrix.* 

## Description

[Experimental] A collision is an integration (aka a unique combination of chr, integration\_locus and strand) which is observed in more than one independent sample (a unique pair of ProjectID and SubjectID). The function tries to decide to which subject an integration should be assigned and if no decision can be taken, the integration is completely removed from the data frame.

## Usage

```
remove_collisions(
  Χ,
  association_file,
  date_col = "SequencingDate",
  reads_ratio = 10,
  seq_count_col = "seqCount",
 max_rows_reports = 50,
  save_widget_path = NULL
)
```

#### **Arguments**

Х

A named list of matrices (names must be quantification types), a single integration matrix representing the sequence count matrix of interest or a multiquantification matrix obtained via comparison matrix

association\_file

The association file imported via import\_association\_file

date\_col The date column that should be considered for the analysis. Must be one value

in date\_columns\_coll()

A single numeric value that represents the ratio that has to be considered when reads\_ratio

deciding between segCount value.

For support of multi-quantification matrix - the name of the sequence count seq\_count\_col

values column

max\_rows\_reports

A numeric value, represents the maximum number of rows of the reports data frames that can be printed on console if the option ISAnalytics.verbose is active. If the data frames are too large they won't be printed on console - we recommend using widgets for detailed and more accessible info.

save\_widget\_path

Either NULL or a path where the html report file should be saved. If NULL the report is visualized via browser ONLY (not saved on disk).

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#### **Details**

If you don't want the function to show details and messages do: options(ISAnalitics.verbose = FALSE). To restore to the original value: options(ISAnalitics.verbose = TRUE). For more details on how to use collision removal functionality: vignette("Collision removal functionality", package = "ISAnalytics")

#### Value

A list of tibbles with removed collisions

#### See Also

```
date_columns_coll
Other Collision removal: realign_after_collisions()
```

## **Examples**

```
op <- options("ISAnalytics.widgets" = FALSE)</pre>
path <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
)
root_pth <- system.file("extdata", "fs.zip", package = "ISAnalytics")</pre>
root <- unzip_file_system(root_pth, "fs")</pre>
association_file <- import_association_file(path, root,</pre>
    dates_format = "dmy"
)
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("fragmentEstimate", "seqCount"),
    matrix_type = "annotated", workers = 2,
    patterns = NULL, matching_opt = "ANY",
    multi_quant_matrix = FALSE
)
matrices <- remove_collisions(matrices, association_file)</pre>
options(op)
```

sample\_statistics

Computes user specified functions on numerical columns and updates the metadata data frame accordingly.

## **Description**

**[Experimental]** The function operates on a data frame by grouping the content by the sample key and computing every function specified on every column in the value\_columns parameter. After that the metadata data frame is updated by including the computed results as columns for the corresponding key. For this reason it's required that both x and metadata have the same sample key, and it's particularly important if the user is working with previously aggregated data. For example:

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```
### Importing association file and matrices
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
package = "ISAnalytics")
root_correct <- system.file("extdata", "fs.zip",</pre>
package = "ISAnalytics")
root_correct <- unzip_file_system(root_correct, "fs")</pre>
association_file <- import_association_file(path_AF, root_correct)</pre>
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
association_file = association_file , root = NULL,
quantification_type = c("seqCount", "fragmentEstimate"),
matrix_type = "annotated", workers = 2, patterns = NULL,
matching_opt = "ANY", dates_format = "dmy")
### Aggregating data (both by same key)
aggreggated_x <- aggregate_values_by_key(matrices$seqCount,</pre>
association_file)
aggregated_meta <- aggregate_metadata(association_file)</pre>
### Sample statistics
sample_stats <- sample_statistics(x = aggregated_x,</pre>
metadata = aggregated_meta,
sample_key = c("SubjectID", "CellMarker", "Tissue", "TimePoint"))
```

## Usage

```
sample_statistics(
   x,
   metadata,
   sample_key = "CompleteAmplificationID",
   value_columns = "Value",
   functions = default_stats()
)
```

## **Arguments**

x A data frame

metadata The metadata data frame

sample\_key Character vector representing the key for identifying a sample

value\_columns THe name of the columns to be computed, must be numeric or integer

functions A named list of function or purrr-style lambdas

#### Value

A list with modified x and metadata data frames

#### See Also

Other Analysis functions: CIS\_grubbs(), comparison\_matrix(), compute\_abundance(), cumulative\_count\_union(), separate\_quant\_matrices(), threshold\_filter(), top\_integrations()

## **Examples**

```
op <- options(ISAnalytics.widgets = FALSE)</pre>
path_AF <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
)
root_correct <- system.file("extdata", "fs.zip",</pre>
    package = "ISAnalytics"
)
root_correct <- unzip_file_system(root_correct, "fs")</pre>
association_file <- import_association_file(path_AF, root_correct,</pre>
    dates_format = "dmy"
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file, root = NULL,
    quantification_type = c("seqCount", "fragmentEstimate"),
    matrix_type = "annotated", workers = 2, patterns = NULL,
    matching_opt = "ANY", multi_quant_matrix = FALSE
)
stats <- sample_statistics(matrices$seqCount, association_file)</pre>
options(op)
```

separate\_quant\_matrices

Separate a multiple-quantification matrix into single quantification matrices.

## **Description**

[Maturing] The function separates a single multi-quantification integration matrix, obtained via comparison\_matrix, into single quantification matrices as a named list of tibbles.

#### Usage

```
separate_quant_matrices(
    x,
    fragmentEstimate = "fragmentEstimate",
    seqCount = "seqCount",
    barcodeCount = "barcodeCount",
    cellCount = "cellCount",
    ShsCount = "ShsCount",
    key = c(mandatory_IS_vars(), annotation_IS_vars(), "CompleteAmplificationID")
)
```

#### **Arguments**

x Single integration matrix with multiple quantification value columns, likely obtained via comparison\_matrix.

fragmentEstimate

Name of the fragment estimate values column in input

SeqCount Name of the sequence count values column in input
barcodeCount Name of the barcode count values column in input
cellCount Name of the cell count values column in input
ShsCount Name of the shs count values column in input
key Key columns to perform the joining operation

#### Value

A named list of tibbles, where names are quantification types

#### See Also

```
quantification_types
```

```
Other Analysis functions: CIS_grubbs(), comparison_matrix(), compute_abundance(), cumulative_count_union(), sample_statistics(), threshold_filter(), top_integrations()
```

```
op <- options("ISAnalytics.widgets" = FALSE)</pre>
path <- system.file("extdata", "ex_association_file.tsv",</pre>
    package = "ISAnalytics"
root_pth <- system.file("extdata", "fs.zip", package = "ISAnalytics")</pre>
root <- unzip_file_system(root_pth, "fs")</pre>
association_file <- import_association_file(</pre>
    path = path, root = root,
    dates_format = "dmy"
)
matrices <- import_parallel_Vispa2Matrices_auto(</pre>
    association_file = association_file,
    quantification_type = c("seqCount", "fragmentEstimate"),
    matrix_type = "annotated", workers = 2, patterns = NULL,
    matching_opt = "ANY"
)
separated_matrix <- separate_quant_matrices(matrices)</pre>
options(op)
```

threshold\_filter 51

threshold_filter Filter data frames with custom predicates	threshold_filter	Filter data frames with custom predicates
--	------------------	---

## **Description**

[Experimental] Filter a single data frame or a list of data frames with custom predicates assembled from the function parameters.

#### Usage

```
threshold_filter(x, threshold, cols_to_compare = "Value", comparators = ">")
```

## **Arguments**

x A data frame or a list of data frames

threshold A numeric/integer vector or a named list of numeric/integer vectors

cols\_to\_compare

A character vector or a named list of character vectors

comparators A character vector or a named list of character vectors. Must be one of the

allowed values between c("<", ">", "==", "!=", ">=", "<=")

#### Details

#### A single data frame as input:

If the user chooses to operate on a single data frame, the other parameters should only be vectors: numeric vector for threshold and character vectors for both cols\_to\_compare and comparators. A filtering condition is obtained by combining element by element cols\_to\_compare + comparators + threshold (similarly to the paste function). For example:

```
threshold = c(20, 35, 50)

cols\_to\_compare = c("a", "b", "c")

comparators = "<"
```

given these vectors, the input data frame will be filtered by checking which values in column "a" are less than 20 **AND** which values in column "b" are less than 35 **AND** which values in column "c" are less than 50. Things the user should keep in mind are:

- The vectors of length 1 are going to be recycled if one or more parameters are longer (in the example, the comparators value)
- If vectors are not of length 1 they must have the same length
- Columns to compare, of course, need to be included in the input data frame and need to be numeric/integer
- The filtering will perform a logical "AND" on all the conditions, only rows that satisfy ALL the conditions are preserved

#### A list of data frames as input:

The input for the function may also be a list of data frames, either named or unnamed.

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#### Unnamed list:

If the input is a simple unnamed list, the other parameters should be simple vectors (as for data frames). All the predicates will simply be applied to every data frame in the list: this is useful if it's desirable to filter for the same conditions different data frames that have the same structure but different data.

#### Named list:

It is also possible to filter different data frames with different sets of conditions. Besides having the possibility of defining the other parameters as simple vector, which has the same results as operating on an unnamed list, the user can define the parameters as named lists containing vectors. For example:

```
example_df <- tibble::tibble(a = c(20, 30, 40),
                               b = c(40, 50, 60),
                               c = c("a", "b", "c"),
                               d = c(3L, 4L, 5L)
example_list <- list(first = example_df,</pre>
                      second = example_df,
                      third = example_df)
print(example_list)
## $first
## # A tibble: 3 x 4
##
         а
                b c
                            d
##
     <dbl> <dbl> <chr> <int>
## 1
              40 a
        20
                            3
## 2
        30
               50 b
                            4
## 3
        40
              60 c
                            5
##
## $second
## # A tibble: 3 x 4
##
               b c
                            d
         а
     <dbl> <dbl> <chr> <int>
##
## 1
        20
              40 a
## 2
        30
               50 b
                            4
## 3
              60 c
                            5
        40
##
## $third
## # A tibble: 3 x 4
##
         а
                b c
##
     <dbl> <dbl> <chr> <int>
## 1
        20
              40 a
                            3
## 2
               50 b
                            4
        30
## 3
        40
               60 c
filtered <- threshold_filter(example_list,</pre>
                               threshold = list(first = c(20, 60),
                                                 third = c(25)),
                               cols_to_compare = list(first = c("a", "b"),
                                                       third = c("a")),
                               comparators = list(first = c(">", "<"),</pre>
                                                   third = c(">="))
```

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```
print(filtered)
## $first
## # A tibble: 1 x 4
##
         а
               b c
##
     <dbl> <dbl> <chr> <int>
## 1
              50 b
        30
##
## $second
## # A tibble: 3 x 4
##
         а
               b c
##
     <dbl> <dbl> <chr> <int>
## 1
        20
              40 a
## 2
        30
              50 b
                            4
## 3
        40
              60 c
                            5
##
## $third
## # A tibble: 2 x 4
##
               b c
##
     <dbl> <dbl> <chr> <int>
## 1
              50 b
        30
                            4
## 2
        40
              60 c
                            5
```

The above signature will roughly be translated as:

- Filter the element "first" in the list by checking that values in column "a" are bigger than 20 AND values in column "b" are less than 60
- Don't apply any filter to the element "second" (returns the data frame as is)
- Filter the element "third" by checking that values in column "a" are equal or bigger than 25.

It is also possible to use some parameters as vectors and some as lists: vectors will be recycled for every element filtered.

```
\label{eq:filtered} \begin{tabular}{ll} filter(example_list, & threshold = list(first = c(20, 60), & third = c(25, 65)), & \\ & cols_to_compare = c("a", "b"), & comparators = list(first = c(">", "<"), & third = c(">=", "<="))) \end{tabular}
```

In this example, different threshold and comparators will be applied to the same columns in all data frames.

Things the user should keep in mind are:

- Names for the list parameters must be the same names in the input list
- Only elements explicited in list parameters as names will be filtered
- Lengths of both vectors and lists must be consistent

## Value

A data frame or a list of data frames

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## See Also

Other Analysis functions: CIS\_grubbs(), comparison\_matrix(), compute\_abundance(), cumulative\_count\_union(), sample\_statistics(), separate\_quant\_matrices(), top\_integrations()

## **Examples**

```
example_df <- tibble::tibble(</pre>
   a = c(20, 30, 40),
   b = c(40, 50, 60),
   c = c("a", "b", "c"),
   d = c(3L, 4L, 5L)
)
example_list <- list(</pre>
    first = example_df,
    second = example_df,
    third = example_df
)
filtered <- threshold_filter(example_list,</pre>
    threshold = list(
        first = c(20, 60),
        third = c(25)
   ),
    cols_to_compare = list(
        first = c("a", "b"),
        third = c("a")
   ),
    comparators = list(
        first = c(">", "<"),
        third = c(">=")
    )
)
```

top\_integrations

Sorts and keeps the top n integration sites based on the values in a given column.

## **Description**

[Experimental] The input data frame will be sorted by the highest values in the columns specified and the top n rows will be returned as output. The user can choose to keep additional columns in the output by passing a vector of column names or passing 2 "shortcuts":

- keep = "everything" keeps all columns in the original data frame
- keep = "nothing" only keeps the mandatory columns (mandatory\_IS\_vars()) plus the columns in the columns parameter.

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## Usage

```
top_integrations(
    x,
    n = 50,
    columns = "fragmentEstimate_sum_RelAbundance",
    keep = "everything",
    key = NULL
)
```

## **Arguments**

X	An integration matrix (data frame containing mandatory_IS_vars())
n	How many integrations should be sliced (in total or for each group)? Must be numeric or integer and greater than $0$
columns	Columns to use for the sorting. If more than a column is supplied primary ordering is done on the first column, secondary ordering on all other columns
keep	Names of the columns to keep besides mandatory_IS_vars() and columns
key	Either NULL or a character vector of column names to group by. If not NULL the input will be grouped and the top fraction will be extracted from each group.

## Value

Either a data frame with at most n rows or a data frames with at most n\*(number of groups) rows.

#### See Also

```
Other Analysis functions: CIS_grubbs(), comparison_matrix(), compute_abundance(), cumulative_count_union(), sample_statistics(), separate_quant_matrices(), threshold_filter()
```

```
smpl <- tibble::tibble(</pre>
    chr = c("1", "2", "3", "4", "5", "6"),
    integration_locus = c(14536, 14544, 14512, 14236, 14522, 14566),
    strand = c("+", "+", "-", "+", "-", "+"),
    CompleteAmplificationID = c("ID1", "ID2", "ID1", "ID1", "ID3", "ID2"),
    Value = c(3, 10, 40, 2, 15, 150),
    Value2 = c(456, 87, 87, 9, 64, 96),
    Value3 = c("a", "b", "c", "d", "e", "f")
)
top <- top_integrations(smpl,</pre>
    n = 3,
    columns = c("Value", "Value2"),
    keep = "nothing"
top_key <- top_integrations(smpl,</pre>
    n = 3,
    columns = "Value",
    keep = "Value2",
```

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```
key = "CompleteAmplificationID"
)
```

unzip\_file\_system

A utility function to unzip and use example file systems included in the package

# Description

This utility function is a simple shortcut to create a temporary directory, unzip and reference the examples file systems included in the package for testing purposes.

## Usage

```
unzip_file_system(zipfile, name)
```

# **Arguments**

zipfile The zipped file to decompress

name The name of the folder in the zipped archive ("fs" or "fserr")

## Value

A path to reference

# See Also

Other Utility functions: as\_sparse\_matrix(), generate\_Vispa2\_launch\_AF(), generate\_blank\_association\_file()

```
root_pth <- system.file("extdata", "fs.zip", package = "ISAnalytics")
root <- unzip_file_system(root_pth, "fs")</pre>
```

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