# Package: mistyR (via r-universe)

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Type Package

Title Multiview Intercellular SpaTial modeling framework

**Version** 1.13.0

**Description** mistyR is an implementation of the Multiview Intercellular SpaTialmodeling framework (MISTy). MISTy is an explainable machine learning framework for knowledge extraction and analysis of single-cell, highly multiplexed, spatially resolved data. MISTy facilitates an in-depth understanding of marker interactions by profiling the intra- and intercellular relationships. MISTy is a flexible framework able to process a custom number of views. Each of these views can describe a different spatial context, i.e., define a relationship among the observed expressions of the markers, such as intracellular regulation or paracrine regulation, but also, the views can also capture cell-type specific relationships, capture relations between functional footprints or focus on relations between different anatomical regions. Each MISTy view is considered as a potential source of variability in the measured marker expressions. Each MISTy view is then analyzed for its contribution to the total expression of each marker and is explained in terms of the interactions with other measurements that led to the observed contribution.

URL https://saezlab.github.io/mistyR/

BugReports https://github.com/saezlab/mistyR/issues

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## **Description**

The juxtaview captures the expression of all markers within the immediate neighborhood of a spatial unit.

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## Usage

```
add_juxtaview(
  current.views,
  positions,
  neighbor.thr = 15,
  prefix = "",
  cached = FALSE,
  verbose = TRUE
)
```

#### **Arguments**

current.views the current view composition.

positions a data.frame, tibble or a matrix with named coordinates in columns and

rows for each spatial unit ordered as in the intraview.

neighbor.thr a threshold value used to indicate the largest distance between two spatial units

that can be considered as neighboring.

prefix a prefix to add to the column names.

cached a logical indicating whether to cache the calculated view after the first calcu-

lation and to reuse a previously cached view if it already exists for this sample.

verbose a logical controlling the verbosity of the output of the function during execu-

tion.

#### **Details**

The neighborhood of each spatial unit is estimated by constructing a graph by 2D Delaunay triangulation following by removal of edges with length larger than neighbor. thr. For each spatial unit the juxtaview contains the sum of expressions across its estimated neighbors for each marker.

### Value

A mistyR view composition with added juxtaview.

#### See Also

```
create_initial_view() for starting a view composition with an intraview only.
Other view composition functions: add_paraview(), add_views(), create_initial_view(),
create_view(), remove_views()
```

## **Examples**

```
# Create a view composition of an intraview and a juxtaview.
library(dplyr)
# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
```

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```
# get the coordinates for each cell
pos <- synthetic[[1]] %>% select(row, col)

# compose
misty.views <- create_initial_view(expr) %>% add_juxtaview(pos, neighbor.thr = 1.5)

# preview
str(misty.views[["juxtaview.1.5"]])
```

add\_paraview

Generate and add a paraview to the current view composition

## **Description**

The paraview captures the expression of all markers in the broader tissue structure.

# Usage

```
add_paraview(
  current.views,
  positions,
  l,
  zoi = 0,
  family = c("gaussian", "exponential", "linear", "constant"),
  approx = 1,
  nn = NULL,
  prefix = "",
  cached = FALSE,
  verbose = TRUE
)
```

## **Arguments**

current.views	the current view composition.
positions	a data.frame, tibble or a matrix with named coordinates in columns and rows for each spatial unit ordered as in the intraview.
1	effective radius of influence of expression in the broader tissue structure.
zoi	spatial units with distance smaller than the zone of indifference will not be taken into account when generating the paraview.
family	the family f functions used to generate weights. (see Details)
approx	rank of the Nyström approximation matrix. (see Details)
nn	the number of spatial units to be used for approximating the paraview using a fast nearest neighbor search. (see Details)
prefix	a prefix to add to the column names.
cached	a logical indicating whether to cache the calculated view after the first calculation and to reuse a previously cached view if it already exists for this sample.
verbose	a logical controlling the verbosity of the output of the function during execution.

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#### **Details**

The paraview is generated by weighted sum of the expression of all spatial units for each marker. The weights for each spatial unit i are dependent on the family which can be one of "gaussian", "exponential", "linear" or "constant".

If "gaussian" the weights are calculated based on the distance to the spatial unit j and the parameter 1 using the radial basis function

$$w_{ij} = e^{-\frac{d_{ij}^2}{l^2}}$$

The parameter 1 here denotes the "effective" radius of influence.

If "exponential" the weights are calculated based on the distance to the spatial unit j and the parameter 1 using the exponential function

$$w_{ij} = e^{-\frac{d_{ij}}{l}}$$

The parameter 1 here denotes signaling length. For more information consult Oyler-Yaniv et. al. Immunity 46(4) 2017.

If "linear" the weights are calculated based on the distance to the spatial unit j and the parameter 1 using the linear function

$$w_{ij} = 1 - d(i,j)/l$$

The parameter 1 here denotes the intersect of the linear function. For distances larger than 1 the weight is equal to 0.

If "constant" the weights are always 1. The parameter 1 here denotes the number of nearest neighbors to take into account if nn is not defined.

Since the generation of the paraview requires the calculation of pairwise distances of all spatial units it can take a significant amount of computation time. The parameters approx and nn can be set to speed up the calculation by approximation. The approximation can be achieved by using the Nyström low-rank approximation method or by limiting the calculation of the paraview to a number of nearest neighbors around each spatial unit.

If the value of approx is between 0 and 1 it will be interpreted as fraction of the number of spatial units. Discrete values above 1 will be interpreted as the size of the approximation block. The number of nearest neighbors nn around each spatial unit are determined using a fast nearest neighbor search.

If both approx and nn have non-null values, nn has priority and an approximation based on fast nearest neighbor search will be used to generate the paraview.

## Value

A mistyR view composition with added paraview with parameter 1.

#### See Also

```
create_initial_view() for starting a view composition with an intraview only.
```

Other view composition functions: add\_juxtaview(), add\_views(), create\_initial\_view(), create\_view(), remove\_views()

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## **Examples**

```
# Create a view composition of an intraview and a paraview with radius 10.
library(dplyr)

# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
# get the coordinates for each cell
pos <- synthetic[[1]] %>% select(row, col)

# compose
misty.views <- create_initial_view(expr) %>% add_paraview(pos, 1 = 10)

# preview
str(misty.views[["paraview.10"]])
```

add\_views

Add custom views to the current view composition

## **Description**

Add one or more custom views to the current view composition.

## Usage

```
add_views(current.views, new.views)
```

# **Arguments**

```
current.views the current view composition.

new.views a view or a list of views created with create_view() or otherwise.
```

## Value

A mistyR view composition containing an union of views from current.views and new.views.

## See Also

```
create_initial_view() for starting a view composition, with an intraview, create_view() for
creating a custom view.
```

```
Other view composition functions: add_juxtaview(), add_paraview(), create_initial_view(), create_view(), remove_views()
```

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# **Examples**

```
# create random views
view1 <- data.frame(marker1 = rnorm(100, 10, 2), marker2 = rnorm(100, 15, 3))
view2 <- data.frame(marker1 = rnorm(100, 10, 5), marker2 = rnorm(100, 15, 5))
misty.views <- create_initial_view(view1)
new.view <- create_view("dummyname", view2, "dname")
add_views(misty.views, new.view)
misty.views %>% add_views(create_view("dummyname", view2, "dname"))
```

clear\_cache

Clear cached objects

# Description

Purge the cache or clear the cached objects for a single sample.

## Usage

```
clear_cache(id = NULL)
```

# Arguments

id

the unique id of the sample.

## Details

The cached objects are removed from disk and cannot be retrieved. Whenever possible specifying an id is reccomended. If id = NULL all contents of the folder '.misty.temp' will be removed.

## Value

None (NULL)

# Examples

```
clear_cache("b98ad35f4e671871cba35f2155228612")
clear_cache()
```

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collect\_results

Collect and aggregate results

## **Description**

Collect and aggregate performance, contribution and importance estimations of a set of raw results produced by run\_misty().

# Usage

```
collect_results(folders)
```

## **Arguments**

folders

Paths to folders containing the raw results from run\_misty().

#### Value

List of collected performance, contributions and importances per sample, performance and contribution statistics and aggregated importances.

improvements Long format tibble with measurements of performance for each target and each sample. Available performance measures are RMSE and variance explained (R2) for a model containing only an intrinsic view (intra.RMSE, intra.R2), model with all views (multi.RMSE, multi.R2), gain of RMSE and gain of variance explained of multi-view model over the intrisic model where gain.RMSE is the relative decrease of RMSE in percent, while gain.R2 is the absolute increase of variance explained in percent. Each value represents the mean performance across folds (k-fold cross-validation). The p values of a one sided t-test of improvement of performance (p.RMSE, p.R2) are also available as a measure.

*improvements.stats* Long format tibble with summary statistics (mean, standard deviation and coefficient of variation) for all performance measures for each target over all samples.

contributions Long format tibble with the values of the coefficients for each *view* in the metamodel, for each *target* and each *sample*. The p values for the coefficient for each view, under the null hypothesis of zero contribution to the meta model are also available.

contributions.stats Long format tibble with summary statistics for all views per target over all samples. Including mean coffecient value, fraction of contribution, mean and standard deviation of p values.

importances List of view-specific predictor-target importance tables per sample. The importances in each table are standardized per target and weighted by the quantile of the coefficient for the target in that view. Columns other than *Predictor* represent target markers.

importances.aggregated A list of aggregated view-specific predictor-target importance tables . Aggregation is reducing by mean over all samples.

## See Also

run\_misty() to train models and generate results.

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## **Examples**

```
# Train and collect results for 3 samples in synthetic
library(dplyr)
library(purrr)

data("synthetic")

misty.results <- synthetic[seq_len(3)] %>%
   imap_chr(~ create_initial_view(.x %>% select(-c(row, col, type))) %>%
   add_paraview(.x %>% select(row, col), l = 10) %>%
   run_misty(paste0("results/", .y))) %>%
   collect_results()
str(misty.results)
```

create\_initial\_view

**Start here:** create a basic view composition with an intraview

## **Description**

This function is the first one to be called when building a mistyR workflow, starting from view composition. The initial view describes the intraview of the sample.

## Usage

```
create_initial_view(data, unique.id = NULL)
```

## **Arguments**

data A data.frame or a tibble containing expression information for all markers

of interest (in named columns) for each spatial unit (in rows).

unique.id A character vector. Identifier of the current sample. If not provided (unique.id

= NULL) then an id is automatically generated by calculating the md5 hash of

table.

## Value

An initial mistyR view composition containing an *intraview* list item named described with abbreviation "intra" and *data* as provided in data and a *misty.uniqueid* list item containing the provided or automatically calculated unique.id. A cache folder for the sample will be automatically created in the working directory as a subfolder of '.misty.temp/' with the same name as unique.id.

## See Also

```
Other view composition functions: add_juxtaview(), add_paraview(), add_views(), create_view(), remove_views()
```

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## **Examples**

```
# Create an intrinsic view from the first sample in the dataset synthetic.
library(dplyr)
# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
create_initial_view(expr)
```

create\_view

Create a custom view

## **Description**

Create a custom view from a data. frame or a tibble.

# Usage

```
create_view(name, data, abbrev = name)
```

## Arguments

name Name of the view. A character vector.

data A data.frame or a tibble with named variables in columns and rows for each

spatial unit ordered as in the intraview.

abbrev Abbreviated name. A character vector.

#### **Details**

Creating a custom view does not add it to the current view composition.

## Value

A new mistyR view. A list with a single named item described by the provided abbreviation and *data* containing the provided data.

## See Also

```
add_views() for adding created views to a view composition.
```

Other view composition functions: add\_juxtaview(), add\_paraview(), add\_views(), create\_initial\_view(), remove\_views()

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## **Examples**

```
# Create a view from the mean expression of the 10 nearest neighbors of
# each cell.
library(dplyr)
library(purrr)
library(distances)
# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
# get the coordinates for each cell
pos <- synthetic[[1]] %>% select(row, col)
# find the 10 nearest neighbors
neighbors <- nearest_neighbor_search(distances(as.matrix(pos)), k = 11)[-1, ]</pre>
# calculate the mean expression of the nearest neighbors for all markers
# for each cell in expr
nnexpr <- seq_len(nrow(expr)) %>%
  map_dfr(~ expr %>%
    slice(neighbors[, .x]) %>%
    colMeans())
create_view("nearest", nnexpr, "nn")
```

extract\_signature

Extract signatures from the results

# Description

Signature is a representation of each sample in the space of mistyR results.

# Usage

#### **Arguments**

```
misty.results a results list generated by collect_results().

type type of signature to extract from the results.
```

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trim display targets with performance value above (if R2 or gain) or below (other-

wise) this value only.

trim.measure the measure used for trimming.

#### **Details**

The performance signature of each sample is a concatenation of the estimated values of variance explained using only the intraview, the variance explained by the multiview model and the gain in variance explained for each marker. The performance signature vector for each sample available in misty.results is of length markers  $\cdot$  3.

The contribution signature of each sample is a concatenation of the estimated fraction of contribution of each view for each marker. The contribution signature vector for each sample available in misty.results is of length markers · views.

The importance signature of each sample is a concatenation of the estimated and weighted importances for each predictor-target marker pair from all views. The importance signature vector for each sample available in misty.results is of length markers $^2$  views.

#### Value

A table with one row per sample from misty.results representing its signature.

#### See Also

collect\_results() to generate a results list from raw results.

## **Examples**

```
library(dplyr)
misty.results <-
   list.files("results", full.names = TRUE) %>% collect_results()
extract_signature(misty.results, "performance")
```

filter\_views

Filter spatial units

## **Description**

Select, remove (or duplicate) rows from all views in a composition by their row locations or according to conditions based on a specific view.

## Usage

```
filter_views(current.views, rows, view = "intraview", ...)
```

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## **Arguments**

current.views the current view composition.

row (integer) location; positive values to keep (duplicate) and/or negative to remove.

view the name of the view to be used for filtering.

logical expressions defined in terms of the variables in view passed on to dplyr::filter().

## **Details**

The values in rows have priority over the other parameters. If rows doesn't contain integer values then filtering is performed based on the view specified in view and expressions (...) returning logical values defined in terms of the variables in view.

#### Value

A mistyR view composition with filtered spatial units from all views.

Other view manipulation functions: rename\_view(), select\_markers()

#### See Also

```
<data-masking>.
```

# Examples

```
# Create a view composition with an intraview and filter
library(dplyr)
# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
# compose
misty.views <- create_initial_view(expr)
# select only the first 10 spatial units and preview
misty.views %>%
    filter_views(1:10) %>%
    str()
# select only the units where the expression of ligA is larger than 0.5
# and preview
misty.views %>%
    filter_views(NA, "intraview", ligA > 0.5) %>%
    str()
```

## **Description**

The heatmap shows the interactions that are present and have importance above a cutoff value in the to.view but but not in the from.view.

## Usage

## **Arguments**

#### Value

The misty.results list (invisibly).

#### See Also

```
collect_results() to generate a results list from raw results.
```

Other plotting functions: plot\_contrast\_results(), plot\_improvement\_stats(), plot\_interaction\_communities(), plot\_interaction\_heatmap(), plot\_view\_contributions()

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## **Examples**

```
all.samples <- list.dirs("results", recursive = FALSE)
misty.results <- collect_results(all.samples)
misty.results %>%
  plot_contrast_heatmap("intra", "para.10")
misty.results %>%
  plot_contrast_heatmap("intra", "para.10", cutoff = 0.5)
```

## **Description**

Plot interexperiment contrast of views.

## Usage

## **Arguments**

## **Details**

The heatmaps show the interactions that are present and have importance above a cutoff. to value in the views of misty.results.to but not present or have importance below cutoff.from in the views of misty.results.from.

#### Value

The misty.results.from list (invisibly).

#### See Also

```
collect_results() to generate a results list from raw results.
```

```
Other plotting functions: plot_contrast_heatmap(), plot_improvement_stats(), plot_interaction_communities() plot_interaction_heatmap(), plot_view_contributions()
```

## **Examples**

```
# if for example the available samples come from different grades of tumors
grade1.results <- collect_results(c("results/synthetic1", "results/synthetic2"))
grade3.results <- collect_results("results/synthetic10")

# highlight interactions present in grade 1 tumors but not in grade 3 tumors
# in the paraview

grade3.results %>% plot_contrast_results(grade1.results, views = "para.10")

# see the loss of interactions in all views with lower sensitivity

plot_contrast_results(grade3.results, grade1.results, cutoff.from = 0.75, cutoff.to = 0.5)
```

plot\_improvement\_stats

Plot observed performance and improvement per target

## **Description**

Generates a plot of the mean (+- standard deviation) of the performance value per target across all samples from the results.

## Usage

```
plot_improvement_stats(
   misty.results,
   measure = c("gain.R2", "multi.R2", "intra.R2", "gain.RMSE", "multi.RMSE", "intra.RMSE"),
   trim = -Inf
)
```

## **Arguments**

```
misty.results a results list generated by collect_results().

measure performance measure to be plotted (See collect_results()).

trim display targets with performance value above (if R2 or gain) or below (otherwise) this value only.
```

#### Value

The misty.results list (invisibly).

#### See Also

```
collect_results() to generate a results list from raw results.
```

```
Other plotting functions: plot_contrast_heatmap(), plot_contrast_results(), plot_interaction_communities(), plot_interaction_heatmap(), plot_view_contributions()
```

# **Examples**

```
all.samples <- list.dirs("results", recursive = FALSE)

collect_results(all.samples) %>% plot_improvement_stats()

misty.results <- collect_results(all.samples)
misty.results %>% plot_improvement_stats(measure = "gain.RMSE")
misty.results %>% plot_improvement_stats(measure = "intra.R2")
```

```
plot_interaction_communities
```

Plot marker interaction communities

## **Description**

Identify and plot a graph of marker interaction communities.

## Usage

```
plot_interaction_communities(misty.results, view, cutoff = 1)
```

## **Arguments**

```
misty.results a results list generated by collect_results().
```

view abbreviated name of the view.

cutoff importance threshold. Importances below this value will be colored white in the

heatmap and considered as not relevant.

## **Details**

The communities are identified using the Louvain algorithm. Communities can be extracted only from views that have the same predictor and target markers.

#### Value

The misty.results list (invisibly).

## See Also

```
collect_results() to generate a results list from raw results.
Other plotting functions: plot_contrast_heatmap(), plot_contrast_results(), plot_improvement_stats(), plot_interaction_heatmap(), plot_view_contributions()
```

## **Examples**

```
all.samples <- list.dirs("results", recursive = FALSE)
misty.results <- collect_results(all.samples)
misty.results %>%
   plot_interaction_communities("intra") %>%
   plot_interaction_communities("para.10")
misty.results %>%
   plot_interaction_communities("para.10", cutoff = 0.5)
```

```
plot_interaction_heatmap
```

Plot importance heatmap for a view

## **Description**

Generate a heatmap with importances of predictor-target interaction.

# Usage

```
plot_interaction_heatmap(
    misty.results,
    view,
    cutoff = 1,
    trim = -Inf,
    trim.measure = c("gain.R2", "multi.R2", "intra.R2", "gain.RMSE", "multi.RMSE",
        "intra.RMSE"),
    clean = FALSE
)
```

## **Arguments**

```
misty.results a results list generated by collect_results().

view abbreviated name of the view.

cutoff importance threshold. Importances below this value will be colored white in the heatmap and considered as not relevant.

trim display targets with performance value above (if R2 or gain) or below (other-
```

wise) this value only.

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trim.measure the measure used for trimming.

clean a logical indicating whether to remove rows and columns with all importances

are below cutoff from the heatmap.

## Value

The misty.results list (invisibly).

## See Also

```
collect_results() to generate a results list from raw results.
Other plotting functions: plot_contrast_heatmap(), plot_contrast_results(), plot_improvement_stats(),
```

# **Examples**

```
all.samples <- list.dirs("results", recursive = FALSE)

collect_results(all.samples) %>%
   plot_interaction_heatmap("intra") %>%
   plot_interaction_heatmap("para.10", cutoff = 0.5)
```

plot\_interaction\_communities(), plot\_view\_contributions()

plot\_view\_contributions

Plot view contributions per target

## **Description**

Generate a stacked barplot of the average view contribution fraction per target across all samples from the results.

## Usage

```
plot_view_contributions(
   misty.results,
   trim = -Inf,
   trim.measure = c("gain.R2", "multi.R2", "intra.R2", "gain.RMSE", "multi.RMSE",
        "intra.RMSE")
)
```

## **Arguments**

```
misty.results a results list generated by collect_results().
```

trim display targets with performance value above (if R2 or gain) or below (other-

wise) this value only.

trim.measure the measure used for trimming.

20 remove\_views

## Value

The misty.results list (invisibly).

## See Also

```
collect_results() to generate a results list from raw results.
```

```
Other plotting functions: plot_contrast_heatmap(), plot_contrast_results(), plot_improvement_stats(), plot_interaction_communities(), plot_interaction_heatmap()
```

## **Examples**

```
all.samples <- list.dirs("results", recursive = FALSE)
collect_results(all.samples) %>% plot_view_contributions()
```

remove\_views

Remove views from the current view composition

## **Description**

Remove one or more views from the view composition.

# Usage

```
remove_views(current.views, view.names)
```

## Arguments

```
current.views the current view composition.
```

view.names the names of one or more views to be removed.

## **Details**

The intraview and the unique id cannot be removed with this function.

## Value

A mistyR view composition with view. names views removed.

## See Also

```
Other view composition functions: add_juxtaview(), add_paraview(), add_views(), create_initial_view(), create_view()
```

rename\_view 21

## **Examples**

```
library(dplyr)
# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
# get the coordinates for each cell
pos <- synthetic[[1]] %>% select(row, col)
misty.views <- create_initial_view(expr) %>%
  add_juxtaview(pos, neighbor.thr = 1.5) %>%
  add_paraview(pos, 1 = 10)
# preview
str(misty.views)
# remove juxtaview and preview
misty.views %>%
  remove_views("juxtaview.1.5") %>%
  str()
# remove juxtaview and paraview and preview
misty.views %>%
  remove_views(c("juxtaview.1.5", "paraview.10")) %>%
  str()
```

rename\_view

Rename view in a view composition

## **Description**

Rename view in a view composition

#### Usage

```
rename_view(current.views, old.name, new.name, new.abbrev = new.name)
```

## **Arguments**

current.views the current view composition.

old.name old name of the view.

new.name new name of the view.

new.abbrev new abbreviated name.

# Value

A mistyR view composition with a renamed view.

run\_misty

## See Also

Other view manipulation functions: filter\_views(), select\_markers()

## **Examples**

```
view1 <- data.frame(marker1 = rnorm(100, 10, 2), marker2 = rnorm(100, 15, 3))
view2 <- data.frame(marker1 = rnorm(100, 10, 5), marker2 = rnorm(100, 15, 5))
misty.views <- create_initial_view(view1) %>%
    add_views(create_view("originalname", view2, "on"))
str(misty.views)
# rename and preview
misty.views %>%
    rename_view("originalname", "renamed", "rn") %>%
    str()
```

run\_misty

Train MISTy models

## **Description**

Trains multi-view models for all target markers, estimates the performance, the contributions of the view specific models and the importance of predictor markers for each target marker.

# Usage

```
run_misty(
  views,
  results.folder = "results",
  seed = 42,
  target.subset = NULL,
  bypass.intra = FALSE,
  cv.folds = 10,
  cached = FALSE,
  append = FALSE,
  model.function = random_forest_model,
  ...
)
```

## **Arguments**

views view composition.

results. folder path to the top level folder to store raw results.

seed seed used for random sampling to ensure reproducibility.

target.subset subset of targets to train models for. If NULL, models will be trained for markers

in the intraview.

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bypass.intra a logical indicating whether to train a baseline model using the intraview data (see Details). cv.folds number of cross-validation folds to consider for estimating the performance of the multi-view models cached a logical indicating whether to cache the trained models and to reuse previously cached ones if they already exist for this sample. append a logical indicating whether to append the performance and coefficient files in the results.folder. Consider setting to TRUE when rerunning a workflow with different target. subset parameters. model.function a function which is used to model each view, default model is random\_forest\_model. Other models included in mistyR are gradient\_boosting\_model, bagged\_mars\_model, mars\_model, linear\_model, svm\_model, mlp\_model all additional parameters are passed to the chosen ML model for training the view-specific models

#### **Details**

If bypass.intra is set to TRUE all variable in the intraview the intraview data will be treated as targets only. The baseline intraview model in this case is a trivial model that predicts the average of each target. If the intraview has only one variable this switch is automatically set to TRUE.

*Default* model to train the view-specific views is a Random Forest model based on ranger() – run\_misty(views, model.function = random\_forest\_model)

The following parameters are the default configuration: num.trees = 100, importance = "impurity", num.threads = 1, seed = seed.

*Gradient boosting* is an alternative to model each view using gradient boosting. The algorithm is based on xgb.train() - run\_misty(views, model.function = gradient\_boosting\_model)

The following parameters are the default configuration: booster = "gbtree", rounds = 10, objective = "reg:squarederror". Set booster to "gblinear" for linear boosting.

Bagged MARS is an alternative to model each view using bagged MARS, (multivariate adaptive spline regression models) trained with bootstrap aggregation samples. The algorithm is based on  $earth() - run_misty(views, model.function = bagged_mars_model)$ 

The following parameters are the default configuration: degree = 2. Furthermore 50 base learners are used by default (pass n.bags as parameter via . . . to change this value).

*MARS* is an alternative to model each view using multivariate adaptive spline regression model. The algorithm is based on earth() – run\_misty(views, model.function = mars\_model)

The following parameters are the default configuration: degree = 2.

Linear model is an alternative to model each view using a simple linear model. The algorithm is based on  $lm() - run_misty(views, model.function = linear_model)$ 

SVM is an alternative to model each view using a support vector machines. The algorithm is based on ksvm() - run\_misty(views, model.function = svm\_model)

The following parameters are the default configuration: kernel = "vanilladot" (linear kernel), C = 1, type = "eps-svr".

*MLP* is an alternative to model each view using a multi-layer perceptron. The alogorithm is based on mlp() – run\_misty(views, model.function = mlp\_model)

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The following parameters are the default configuration: size = c(10) (meaning we have 1 hidden layer with 10 units).

#### Value

Path to the results folder that can be passed to collect\_results().

#### See Also

```
create_initial_view() for starting a view composition.
```

## **Examples**

```
# Create a view composition of an intraview and a paraview with radius 10 then
# run MISTy for a single sample.

library(dplyr)

# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
# get the coordinates for each cell
pos <- synthetic[[1]] %>% select(row, col)

# compose
misty.views <- create_initial_view(expr) %>% add_paraview(pos, l = 10)

# run with default parameters
run_misty(misty.views)
```

select\_markers

Select a subset of markers in a view

# Description

Select a subset of markers in a view

## Usage

```
select_markers(current.views, view = "intraview", ...)
```

## **Arguments**

```
current.views the current view composition.
view the name of the view to select markers for.
... one or more select expressions dplyr::select() for the specified view.
```

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#### Value

A mistyR view composition with selected markers in view.

#### See Also

```
<tidy-select>.

Other view manipulation functions: filter_views(), rename_view()
```

# Examples

```
# Create a view composition with an intraview and select
library(dplyr)
# get the expression data
data("synthetic")
expr <- synthetic[[1]] %>% select(-c(row, col, type))
# compose
misty.views <- create_initial_view(expr)
# select markers from the intraview not starting with lig and preview
misty.views %>%
    select_markers("intraview", !starts_with("lig")) %>%
    str()
```

synthetic

Synthetic benchmark data for mistyR

# **Description**

Data generated from 10 random layouts of four cell types and empty space on 100-by-100 grid by simulating a two-dimensional cellular automata model that focuses on signaling events. Cell growth, division, motility and death are neglected. The intracellular processes involve two layers, first the ligand activation of signaling hubs and ligand production/secretion regulated by proteins. The model simulates the production, diffusion, degradation and interactions of 11 molecular species. Ligands are produced in each cell-type based on the activity level of their production nodes and then freely diffuse, degrade or interact with other cells on the grid. Other molecular species involved in signaling are localised in the intracellular space and their activity depends on ligand binding and intracellular wiring.

#### Usage

```
data("synthetic")
```

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# **Format**

A named list of length 10. Each list item is a tibble that corresponds to a simulation of one random layout with information about each cell in rows described by the following 14 variables:

```
row, col location of the cell on the grid
ligA, ligB, ligC, ligD expression of ligands
protE, protF expression of intracellular proteins
prodA, prodB, prodC, prodD expression of regulatory proteins
type cell type id
```

## Source

https://github.com/saezlab/misty\_pipelines/

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