Package 'rifiComparative'

May 30, 2024

Title 'rifiComparative' compares the output of rifi from two different conditions.

Version 1.4.0

Description 'rifiComparative' is a continuation of rifi package. It compares two conditions output of rifi using half-life and mRNA at time 0 segments. As an input for the segmentation, the difference between half-life of both condtions and log2FC of the mRNA at time 0 are used. The package provides segmentation, statistics, summary table, fragments visualization and some additional useful plots for further anaylsis.

Depends R (>= 4.2)

Imports cowplot, doMC, parallel, dplyr, egg, foreach, ggplot2, ggrepel, graphics, grDevices, grid, methods, nnet, rlang, S4Vectors, scales, stats, stringr, tibble, rtracklayer, utils, writexl, DTA, LSD, reshape2, devtools, SummarizedExperiment

Suggests DescTools, knitr, rmarkdown, BiocStyle

VignetteBuilder knitr

biocViews RNASeq, DifferentialExpression, GeneRegulation, Transcriptomics, Microarray, Software

BugReports https://github.com/CyanolabFreiburg/rifiComparative

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Contents

adjusting_HLToInt	2
annot_g	4
data_combined_minimal	5
df_comb_minimal	7
df_mean_minimal	8
differential_expression	9
figures_fun	9
fragmentation	11
fragment_int	12
gff3_preprocess	13
inp_f	14
inp_s	16
joining_data_column	18
joining_data_row	18
loading_fun	19
make_pen	20
penalties	22
penalties_df	23
pen_HL	24
pen_int	24
rifiComparative	25
rifi_visualization_comparison	26
statistics	28
stats_df_comb_minimal	29
stats_se_cdt1	30
stats_se_cdt2	32
	35

Index

adjusting_HLToInt *adjusting_HLToInt Creates one table merging HL and intensity fragments with genome annotation*

Description

'adjusting_HLToInt' merges HL and intensity segments adapting the positions to each other and combining to the genome annotation. To make HL and intensity segments comparable, log2FC(HL) is used to generate the data frame instead of distance. The fragments should have a significant p_value from t-test at least from one segmentation, either HL or intensity.

Usage

adjusting_HLToInt(data, Strand = c("+", "-"), annotation)

Arguments

data	data frame: data frame combined data by column
Strand	string: either "+" or "-"
annotation	data frame: data frame from processed gff3 file.

Details

The functions used are:

- 1. p_value_function extracts and return the p_values of HL and intensity segments respectively.
- 2. eliminate_outlier_hl eliminates outliers from HL fragments.
- 3. eliminate_outlier_int eliminates outliers from intensity fragments.
- 4. mean_length_int calculates the mean of the log2FC(intensity) fragments adapted to HL_fragments and their lengths
- 5. mean_length_hl calculates the mean of log2FC(HL) fragments adapted to the intensity fragments and their lengths.
- 6. calculating_rate calculates decay rate and log2FC(intensity). Both are used to calculate synthesis rate.

Value

The data frame with the corresponding columns:

position: Integer, position of the first fragment region: String, region annotation covering the fragments gene: String, gene annotation covering the fragments locus_tag: String, locus_tag annotation covering the fragments strand: Boolean. The bin/probe specific strand (+/-) fragment_HL: String, HL fragments fragment_int: String, intensity fragments position_frg_int: Integer, position of the first fragment and the last position of the last fragment mean_HL_fragment: Integer, mean of the HL of the fragments involved mean int fragment: Integer, mean of the intensity of the fragments involved log2FC(decay rate): Integer, log2FC(decay(condition1)/ decay(condition2)) log2FC(synthesis rate): Integer, sum of log2FC(decay rate) and log2FC(intensity) intensity FC: Integer, log2FC(mean(intensity(condition1))/mean(intensity(condition2))) Log2FC(HL)+Log2FC(int): Integer, sum of log2FC(decay_rate) and log2FC(intensity) **p_value:** String, indicated by "*" means at least one fragment either HL fragment or intensity fragment has a significant p_value

Examples

```
data(stats_df_comb_minimal)
data(annot_g)
df_mean_minimal <- adjusting_HLToInt(data = stats_df_comb_minimal,
annotation = annot_g[[1]])</pre>
```

annot_g

The result of gff3_preprocessing of gff3 file A list containing all necessary information from a gff file for adjusting_HLToInt and visualization.

Description

The result of gff3_preprocessing of gff3 file A list containing all necessary information from a gff file for adjusting_HLToInt and visualization.

Usage

data(annot_g)

Format

A list with 2 items:

data annotation: a data frame with 5853 rows and 6 variables

region: the region from the gff file

start: the start of the annotation

end: the end of the annotation

strand: the strand of the annotation

gene: the annotated gene name

locus_tag: the annotated locus tag

genome length: a numeric vector containing the length of the genome

Source

https://github.com/CyanolabFreiburg/rifiComparative

4

data_combined_minimal The result of joining_by_row for inp_s and inp_f example data A data frame containing the output of joining_by_row as a data frame

Description

The result of joining_by_row for inp_s and inp_f example data A data frame containing the output of joining_by_row as a data frame

Usage

data(data_combined_minimal)

Format

A data frame with 600 rows and 49 variables:

strand: The strand specific position: The bin/probe specific position ID: The bin/probe specific ID FLT: The bin/probe flag for background level intensity: The relative intensity at time point 0 probe_TI: An internal value to determine which fitting model is applied flag: Information on which fitting model is applied position_segment: The position based segment delay: The delay value of the bin/probe half life: The half-life of the bin/probe **TI termination factor:** The termination factor of the bin/probe delay_fragment: The delay fragment the bin belongs to velocity_fragment: The velocity value of the respective delay fragment intercept: The vintercept of fit through the respective delay fragment slope: The slope of the fit through the respective delay fragment HL_fragment: The half-life fragment the bin belongs to HL_mean_fragment: The mean half-life value of the respective half-life fragment intensity_fragment: The intensity fragment the bin belongs to intensity_mean_fragment: The mean intensity value of the respective intensity fragment TU: The overarching transcription unit TI_termination_fragment: The TI fragment the bin belongs to TI mean termination factor: The mean termination factor of the respective TI fragment seg_ID: The combined ID of the fragment

pausing_site: presence of pausing site indicated by +/-

iTSS_I: presence of iTSS_I indicated by +/-

ps_ts_fragment: The fragments involved in pausing site or iTSS_I

event_ps_itss_p_value_Ttest: p_value of pausing site or iTSS_I

p_value_slope: p_value of the slope

delay_frg_slope: the slope value of the respective delay fragment

velocity_ratio: Integer, ratio of velocity between 2 delay fragments

event_duration: Integer, the duration between two delay fragments

event_position: Integer, the position middle between 2 fragments with an event

FC_fragment_HL: Integer, the fold change value of 2 intensity fragments

FC_HL: Integer, the fold change value of 2 HL fragments#'

p_value_HL: p_value of the fold change of HL fragments

FC_intensity: Integer, the fold change value of 2 intensity fragments

FC_fragment_intensity: String, fragments involved in fold change between 2 intensity fragments

p_value_intensity: p_value of the fold change of intensity fragments

- FC_HL_intensity: ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_intensity_fragment: fragments involved on ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- **FC_HL_adapted:** Integer, the fold change of half-life/ fold change of intensity, position of the half-life fragment is adapted to intensity fragment

synthesis_ratio: Integer, the value corresponding to synthesis rate

synthesis_ratio_event: String, the event assigned by synthesis rate either Termination or iTSS

p_value_Manova: p_value of the variance between two fold-changes, HL and intensity

p_value_TI: p_value of TI fragment

TI_fragments_p_value: p_value of 2 TI fragments

cdt: The condition assigned to the experiment here cdt2

logFC_int: The bin/probe log2 fold change of intensity at time 0

P.Value: The bin/probe p_value adjusted

Source

https://github.com/CyanolabFreiburg/rifi

df_comb_minimal

The result of joining_by_column for data_combined_minimal example data A data frame containing the output of joining_by_row as a data frame

Description

The result of joining_by_column for data_combined_minimal example data A data frame containing the output of joining_by_row as a data frame

Usage

data(df_comb_minimal)

Format

A data frame with 300 rows and 18 variables:

strand: The strand specific position: The bin/probe specific position **ID:** The bin/probe specific ID intensity.cdt1: The relative intensity at time point 0 for condition 1 position_segment: The position based segment half_life.cdt1: The half-life of the bin/probe condition 1 TI_termination_factor.cdt1: The termination factor of the bin/probe condition 1 HL fragment.cdt1: The half-life fragment the bin belongs to condition 1 intensity_fragment.cdt1: The intensity fragment the bin belongs to condition 1 TI termination fragment.cdt1: The TI fragment the bin belongs to condition 1 logFC_int: The bin/probe log2 fold change of intensity at time 0 **P.Value:** The bin/probe p_value adjusted intensity.cdt2: The relative intensity at time point 0 condition 2 half_life.cdt2: The half-life of the bin/probe condition 2 TI_termination_factor.cdt2: The termination factor of the bin/probe condition 2 HL_fragment.cdt2: The half-life fragment the bin belongs to condition 2 intensity_fragment.cdt2: The intensity fragment the bin belongs to condition 2 TI_termination_fragment.cdt2: The TI fragment the bin belongs to condition 2

Source

https://github.com/CyanolabFreiburg/rifiComparative

df_mean_minimal

The result of adjusting_HLToInt for stats_df_comb_minimal and annotation example data A data frame containing the output of adjusting_HLToInt as a data frame

Description

The result of adjusting_HLToInt for stats_df_comb_minimal and annotation example data A data frame containing the output of adjusting_HLToInt as a data frame

Usage

data(df_mean_minimal)

Format

A data frame with 52 rows and 15 variables:

position: The bin/probe specific position

region: the region from the gff file

gene: the annotated gene name

locus_tag: the annotated locus tag

strand: The strand specific

fragment_HL: The half-life fragment the bin belongs

fragment_int: The intensity fragment the bin belongs

position_frg_int: The position of the first fragment and the last position of the last fragment

mean_HL_fragment: The mean half-life value of the respective half-life fragments

mean_int_fragment: The mean intensity value of the respective intensity fragments

log2FC(decay_rate): log2FC(decay(condition1)/decay(condition2))

Log2FC(HL)-Log2FC(int): log2FC(decay_rate/intensity)

log2FC(synthesis_rate): log2FC(decay_rate) + log2FC(intensity)

intensity_FC: log2FC(mean(intensity(condition1))/mean(intensity(condition2)))

p_value: indicated by "*" means at least one fragment either HL fragment or intensity fragment has a significant p_value

Source

https://github.com/CyanolabFreiburg/rifiComparative

differential_expression

An example data frame from Synechosystis PCC 6803 differential probes expression obtained from limma package and only interesting variables were selected. The data frame was used entirely.

Description

An example data frame from Synechosystis PCC 6803 differential probes expression obtained from limma package and only interesting variables were selected. The data frame was used entirely.

Usage

```
data(differential_expression)
```

Format

A data frame of differential_expression with 55508 rows and 4 variables:

position: The bin/probe specific position

strand: The strand specific

logFC_int: The bin/probe differential expression

P.Value: The bin/probe p_value adjusted

Source

https://github.com/CyanolabFreiburg/rifiComparative

figures_fun

'figures_fun': generates several plots

Description

'figures_fun' plots at one the density of HL, the HL category as histogram, log2FC of decay and synthesis rate and their heatscatter. Scatter plot of HL and volcano plot. The function uses the four output generated previously.

Usage

```
figures_fun(
    data.1,
    data.2,
    input.1,
    input.2,
    cdt1,
    cdt2,
    y = 30,
    x = 30,
    limits = c(0, 20)
)
```

Arguments

data.1	data frame output of statistic
data.2	data frame joining two outputs from rifi_stats by row
input.1	data frame joining two outputs from rifi_stats by column
input.2	data frame of differential gene expression at time 0
cdt1	string for the first condition
cdt2	string for the second condition
У	integer to break the scaling in scatter plot for y_axis
х	integer to break the scaling in scatter plot for x_axis
limits	vector to limit the scaling in scatter plot for both axis

Details

The functions used are:

plot_decay_synt: plots the changes in RNA decay rates versus the changes in RNA synthesis rates plot_heatscatter: plots the changes in RNA decay rates versus the changes in RNA synthesis rates with density.

plot_volcano: plots statistical significance versus magnitude of change .

plot_histogram: plot a histogram of probe/bin half-life categories from 2 to 20 minutes in both conditions.

plot_density: plots the probe/bin half-life density in both conditions.

plot_scatter: plots of the bin/probe half-life in one condition1 vs. condition2.

extract the object of rifi_statistics from both conditions. The differential gene expression at time 0 needs to be run separately. The columns log2FC, p_value adjusted, position and strand are extracted and saved to a data frame. loading_fun_fig joins the differential gene expression table and the output from rifi statistics into one data frame.

Value

several plots

10

fragmentation

Examples

```
data(data_combined_minimal)
data(df_comb_minimal)
data(differential_expression)
data(df_mean_minimal)
figures_fun(data.1 = df_mean_minimal, data.2 = data_combined_minimal,
input.1 = df_comb_minimal, input.2 = differential_expression, cdt1 = "sc",
cdt2 = "fe")
```

fragmentation fragmentation: Conveniently wraps all fragmentation steps

Description

fragmentation fragments the half-life and intensity into segments using the penalties output.

Usage

fragmentation(data, pen_HL, pen_int, cores = 2)

Arguments

data	data frame: data frame combined data by column
pen_HL	list: list of the penalties set optimal for the fragmentation for half-life
pen_int	list: list of the penalties set optimal for the fragmentation for intensity
cores	integer: the number of assigned cores for the task. It needs to be increased in case of big data.

Value

Two data frames with half-life and intensity fragments and the mean of the coefficient fragment based.

Examples

```
data(penalties_df)
data(pen_HL)
data(pen_int)
df_comb_minimal <- fragmentation(data = penalties_df, pen_HL,
pen_int)</pre>
```

fragment_int

Description

The result of fragmentation for df_comb_minimal example data A data frame containing the output of fragmentation as a data frame

Usage

data(fragment_int)

Format

A data frame with 500 rows and 24 variables:

strand: The strand specific position: The bin/probe specific position **ID:** The bin/probe specific ID intensity.cdt1: The relative intensity at time point 0 for condition 1 position_segment: The position based segment half life.cdt1: The half-life of the bin/probe condition 1 TI_termination_factor.cdt1: The termination factor of the bin/probe condition 1 HL_fragment.cdt1: The half-life fragment the bin belongs to condition 1 intensity_fragment.cdt1: The intensity fragment the bin belongs to condition 1 TI_termination_fragment.cdt1: The TI fragment the bin belongs to condition 1 logFC_int: The bin/probe log2 fold change of intensity at time 0 **P.Value:** The bin/probe p_value adjusted intensity.cdt2: The relative intensity at time point 0 condition 2 **half_life.cdt2:** The half-life of the bin/probe condition 2 TI_termination_factor.cdt2: The termination factor of the bin/probe condition 2 HL_fragment.cdt2: The half-life fragment the bin belongs to condition 2 intensity_fragment.cdt2: The intensity fragment the bin belongs to condition 2 **TI termination fragment.cdt2:** The TI fragment the bin belongs to condition 2 distance HL: The bin/probe difference of half-life from both conditions distance_int: The bin/probe log2 fold change of intensity at time 0 HL comb fragment: The half-life fragment the bin belongs to both conditions HL mean comb fragment: The half-life mean of the fragment the bin belongs to both conditions intensity comb fragment: The intensity fragment the bin belongs to both conditions intensity_mean_comb_fragment: The intensity mean of the fragment the bin belongs to both conditions

gff3_preprocess

Source

https://github.com/CyanolabFreiburg/rifiComparative

gff3_preprocess gff3_file from database

Description

gff3_preprocess processes the gff3 file extracting gene names and locus_tag from all coding regions (CDS). UTRs/ncRNA/asRNA if available, are also extracted. The resulting dataframe contains region, positions, strand, gene and locus_tag.

Usage

gff3_preprocess(path)

Arguments

path path: path to the directory containing the gff3 file.

Value

A list with 2 items:

data annotation: region: String, the region from the gff file

start: Integer, the start of the annotation

end: Integer, the end of the annotation

strand: Boolean, the strand of the annotation

gene: String, the annotated gene name

locus_tag: String, the annotated locus tag

genome length: a numeric vector containing the length of the genome

Examples

```
gff3_preprocess(
path = gzfile(system.file("extdata", "gff_synechocystis_6803.gff.gz",
package = "rifiComparative"))
)
```

inp_f

The result of loading_fun for stats_se_cdt2 example data Two data frame containing the output of loading_fun as second element of a list.

Description

The result of loading_fun for stats_se_cdt2 example data Two data frame containing the output of loading_fun as second element of a list.

Usage

data(inp_f)

Format

A data frame with 500 rows and 49 variables:

strand: The strand specific position: The bin/probe specific position **ID:** The bin/probe specific ID FLT: The bin/probe flag for background level intensity: The relative intensity at time point 0 probe_TI: An internal value to determine which fitting model is applied flag: Information on which fitting model is applied position_segment: The position based segment delay: The delay value of the bin/probe half_life: The half-life of the bin/probe TI_termination_factor: The termination factor of the bin/probe delay_fragment: The delay fragment the bin belongs to velocity_fragment: The velocity value of the respective delay fragment intercept: The vintercept of fit through the respective delay fragment slope: The slope of the fit through the respective delay fragment HL fragment: The half-life fragment the bin belongs to HL_mean_fragment: The mean half-life value of the respective half-life fragment intensity_fragment: The intensity fragment the bin belongs to intensity_mean_fragment: The mean intensity value of the respective intensity fragment TU: The overarching transcription unit TI_termination_fragment: The TI fragment the bin belongs to TI mean termination factor: The mean termination factor of the respective TI fragment seg_ID: The combined ID of the fragment

inp_f

pausing_site: presence of pausing site indicated by +/-

iTSS_I: presence of iTSS_I indicated by +/-

ps_ts_fragment: The fragments involved in pausing site or iTSS_I

event_ps_itss_p_value_Ttest: p_value of pausing site or iTSS_I

p_value_slope: p_value of the slope

delay_frg_slope: the slope value of the respective delay fragment

velocity_ratio: Integer, ratio of velocity between 2 delay fragments

event_duration: Integer, the duration between two delay fragments

event_position: Integer, the position middle between 2 fragments with an event

FC_HL: Integer, the fold change value of 2 HL fragments

FC_fragment_HL: Integer, the fold change value of 2 intensity fragments

p_value_HL: p_value of the fold change of HL fragments

FC_intensity: Integer, the fold change value of 2 intensity fragments

- FC_fragment_intensity: String, fragments involved in fold change between 2 intensity fragments
- p_value_intensity: p_value of the fold change of intensity fragments
- **FC_HL_intensity:** ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_intensity_fragment: fragments involved on ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_adapted: Integer, the fold change of half-life/ fold change of intensity, position of the half-life fragment is adapted to intensity fragment

synthesis_ratio: Integer, the value corresponding to synthesis rate

synthesis_ratio_event: String, the event assigned by synthesis rate either Termination or iTSS

p_value_Manova: p_value of the variance between two fold-changes, HL and intensity

p_value_TI: p_value of TI fragment

TI_fragments_p_value: p_value of 2 TI fragments

cdt: The condition assigned to the experiment here cdt2

logFC_int: The bin/probe log2 fold change of intensity at time 0

P.Value: The bin/probe p_value adjusted

Source

https://github.com/CyanolabFreiburg/rifiComparative

inp_s

Description

The result of loading_fun for stats_se_cdt1 example data Two data frame containing the output of loading_fun as first element of a list.

Usage

data(inp_s)

Format

A data frame with 500 rows and 49 variables:

strand: The strand specific position: The bin/probe specific position ID: The bin/probe specific ID FLT: The bin/probe flag for background level intensity: The relative intensity at time point 0 probe_TI: An internal value to determine which fitting model is applied flag: Information on which fitting model is applied position_segment: The position based segment delay: The delay value of the bin/probe half life: The half-life of the bin/probe **TI termination factor:** The termination factor of the bin/probe delay_fragment: The delay fragment the bin belongs to velocity_fragment: The velocity value of the respective delay fragment intercept: The vintercept of fit through the respective delay fragment slope: The slope of the fit through the respective delay fragment HL_fragment: The half-life fragment the bin belongs to HL_mean_fragment: The mean half-life value of the respective half-life fragment intensity_fragment: The intensity fragment the bin belongs to intensity_mean_fragment: The mean intensity value of the respective intensity fragment TU: The overarching transcription unit TI_termination_fragment: The TI fragment the bin belongs to TI mean termination factor: The mean termination factor of the respective TI fragment seg_ID: The combined ID of the fragment

iTSS_I: presence of iTSS_I indicated by +/-

ps_ts_fragment: The fragments involved in pausing site or iTSS_I

event_ps_itss_p_value_Ttest: p_value of pausing site or iTSS_I

p_value_slope: p_value of the slope

delay_frg_slope: the slope value of the respective delay fragment

velocity_ratio: Integer, ratio of velocity between 2 delay fragments

event_duration: Integer, the duration between two delay fragments

event_position: Integer, the position middle between 2 fragments with an event

FC_HL: Integer, the fold change value of 2 HL fragments

FC_fragment_HL: Integer, the fold change value of 2 intensity fragments

p_value_HL: p_value of the fold change of HL fragments

FC_intensity: Integer, the fold change value of 2 intensity fragments

FC_fragment_intensity: String, fragments involved in fold change between 2 intensity fragments

p_value_intensity: p_value of the fold change of intensity fragments

- FC_HL_intensity: ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_intensity_fragment: fragments involved on ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_adapted: Integer, the fold change of half-life/ fold change of intensity, position of the half-life fragment is adapted to intensity fragment

synthesis_ratio: Integer, the value corresponding to synthesis rate

synthesis_ratio_event: String, the event assigned by synthesis rate either Termination or iTSS

p_value_Manova: p_value of the variance between two fold-changes, HL and intensity

p_value_TI: p_value of TI fragment

TI_fragments_p_value: p_value of 2 TI fragments

cdt: The condition assigned to the experiment here cdt1

logFC_int: The bin/probe log2 fold change of intensity at time 0

P.Value: The bin/probe p_value adjusted

Source

https://github.com/CyanolabFreiburg/rifiComparative

joining_data_column joining_data_column joins two data frames by column

Description

'joining_data_column': joins two data frames from different conditions by column.

Usage

```
joining_data_column(data)
```

Arguments

data

data frame with joined columns from both conditions

Value

The data frame with joined columns from both conditions with the corresponding columns: strand, position, ID, intensity.cdt1, position_segment, half_life.cdt1, TI_termination_factor.cdt1", HL_fragment.cdt1, intensity_fragment.cdt1, TI_termination_fragment.cdt1, logFC_int, P.Value, intensity.cdt2, half_life.cdt2, TI_termination_factor.cdt2, HL_fragment.cdt2, intensity_fragment.cdt2, TI_termination_fragment.cdt2.

cdt1: first condition, cdt2: second condition.

Examples

```
data(data_combined_minimal)
df_comb_minimal <- joining_data_column(data = data_combined_minimal)</pre>
```

joining_data_row joining_data_row joins two data frames by row

Description

joining_data_row joins two data frames from different conditions by row.

Usage

```
joining_data_row(input1, input2)
```

Arguments

input1	data frame from SummarizedExperiment output of rifi_stats from rifi package of the first condition.
input2	data frame from SummarizedExperiment output of rifi_stats from rifi package of the second condition.

loading_fun

Value

The data frame with joined rows from both conditions with the corresponding columns: ID with position, strand, intensity, probe_TI, flag, position_segment, delay, half_life, TI_termination_factor, delay_fragment, velocity_fragment, intercept, slope, HL_fragment, HL_mean_fragment, intensity_fragment, intensity_mean_fragment, TU, TI_termination_fragment, TI_mean_termination_factor, seg_ID, pausing_site, iTSS_I, ps_ts_fragment, event_ps_itss_p_value_Ttest, p_value_slope, delay_frg_slope, velocity_ratio, event_duration, event_position, FC_HL, FC_fragment_HL, p_value_HL, FC_intensity, FC_fragment_intensity, p_value_intensity, FC_HL_intensity, FC_HL_intensity_fragment, FC_HL_adapted, synthesis_ratio, synthesis_ratio_event, p_value_Manova, p_value_TI, cdt (condition), logFC_int (log2FC(intensity)), P.Value of log2FC(intensity)

Examples

```
data(inp_s)
data(inp_f)
data_combined_minimal <-
joining_data_row(input1 = inp_s, input2 = inp_f)</pre>
```

```
loading_fun
```

loading_fun loads the data of all conditions

Description

loading_fun extract outputs from rifi_stats of all conditions and join each data to the differential expression table. The differential gene expression at time 0 needs to be run separately. The columns log2FC, p_value adjusted, position and strand are extracted and saved to a data frame. loading_fun joins the differential gene expression table and the output from rifi statistics into one data frame.

Usage

loading_fun(data1, data2, data3)

Arguments

data1	data frame from rifi_stats of one condition
data2	data frame from rifi_stats of other condition
data3	data frame from differential gene expression at time 0

Value

A list of two data frames with joined columns from differential expression and output of rifi_stats with the corresponding columns: ID with position, strand, intensity, probe_TI, flag, position_segment, delay, half_life, TI_termination_factor, delay_fragment, velocity_fragment, intercept, slope, HL_fragment, HL_mean_fragment, intensity_fragment, intensity_mean_fragment, TU, TI_termination_fragment, TI_mean_termination_factor, seg_ID, pausing_site, iTSS_I, ps_ts_fragment, event_ps_itss_p_value_Ttest, p_value_slope, delay_frg_slope, velocity_ratio, event_duration, event_position, FC_HL, FC_fragment_HL, p_value_HL, FC_intensity, FC_fragment_intensity, p_value_intensity, FC_HL_intensity, fragment, FC_HL_adapted, synthesis_ratio, synthesis_ratio_event, p_value_Manova, p_value_TI, cdt (condition), logFC_int (log2FC(intensity)), P.Value of log2FC(intensity).

Examples

```
data(stats_se_cdt1)
data(stats_se_cdt2)
data(differential_expression)
inp_s <-
loading_fun(stats_se_cdt1, stats_se_cdt2, differential_expression)[[1]]
inp_f <-
loading_fun(stats_se_cdt1, stats_se_cdt2, differential_expression)[[2]]</pre>
```

make_pen

make_pen assigns automatically penalties

Description

make_pen calls one of four available penalty functions to automatically assign penalties for the dynamic programming. The two functions to be called are:

- 1. fragment_HL_pen
- 2. fragment_inty_pen

Usage

```
make_pen(
    probe,
    FUN,
    cores = 1,
    logs,
    dpt = 1,
    smpl_min = 10,
    smpl_max = 100,
    sta_pen = 0.5,
    end_pen = 4.5,
    rez_pen = 9,
    sta_pen_out = 0.5,
    end_pen_out = 3.5,
    rez_pen_out = 7
```

```
)
```

Arguments

probe	data frame: data frame combined data by column
FUN	function: one of the four bottom level functions (see details)
cores	integer: the number of assigned cores for the task

20

make_pen

logs	numeric vector: the logbook vector.
dpt	integer: the number of times a full iteration cycle is repeated with a more narrow range based on the previous cycle.
<pre>smpl_min</pre>	integer: the smaller end of the sampling size.
<pre>smpl_max</pre>	integer: the larger end of the sampling size.
sta_pen	numeric: the lower starting penalty.
end_pen	numeric: the higher starting penalty.
rez_pen	numeric: the number of penalties iterated within the penalty range.
sta_pen_out	numeric: the lower starting outlier penalty.
end_pen_out	numeric: the higher starting outlier penalty.
rez_pen_out	numeric: the number of outlier penalties iterated within the outlier penalty range.

Details

The two functions called return the amount of statistically correct and statistically wrong splits at a specific pair of penalties. 'make_pen' iterates over many penalty pairs and picks the most suitable pair based on the difference between wrong and correct splits. The sample size, penalty range and resolution as well as the number of cycles can be customized. The primary start parameters create a matrix with $n = rez_pen$ rows and $n = rez_pen_out$ columns with values between sta_pen/sta_pen_out and end_pen/end_pen_out. The best penalty pair is picked. If dept is bigger than 1 the same process is repeated with a new matrix of the same size based on the result of the previous cycle. Only position segments with length within the sample size range are considered for the penalties to increase run time.

Value

A list with 4 items:

logbook: The logbook vector containing all penalty information

penalties: a vector with the respective penalty and outlier penalty

correct: a matrix of the correct splits

wrong: a matrix of the incorrect splits

Examples

```
data(df_comb_minimal)
```

```
df_comb_minimal$distance_HL <- df_comb_minimal$half_life.cdt1 -
df_comb_minimal$half_life.cdt2</pre>
```

df_comb_minimal\$distance_int <- df_comb_minimal\$logFC_int</pre>

```
pen_HL <- make_pen(
    probe = df_comb_minimal, FUN = rifiComparative:::fragment_HL_pen,
    cores = 2, logs = as.numeric(rep(NA, 8)), dpt = 1, smpl_min = 10,
    smpl_max = 50, sta_pen = 0.5, end_pen = 4.5, rez_pen = 9, sta_pen_out = 0.5,</pre>
```

```
end_pen_out = 3.5, rez_pen_out = 7
)
pen_int <- make_pen(
    probe = df_comb_minimal, FUN = rifiComparative:::fragment_inty_pen,
    cores = 2, logs = as.numeric(rep(NA, 8)), dpt = 1, smpl_min = 10,
    smpl_max = 50, sta_pen = 0.5, end_pen = 4.5, rez_pen = 9, sta_pen_out = 0.5,
    end_pen_out = 3.5, rez_pen_out = 7
)</pre>
```

penalties

penalties wraps conveniently all penalty steps

Description

penalties finds the best set of penalties for half-life and intensity fragmentation using dynamic programming. The segmentation of the HL uses the difference between 2 conditions and the segmentation of the intensity uses the log2FC.

Usage

penalties(data, cores = 2)

Arguments

data	data frame with the joined columns from differential expression and output of rifi_stats.
cores	integer: the number of assigned cores for the task. It needs to be increased in case of big data.

Details

The function uses 4 functions: score_fun_ave.r make_pen.r fragment_HL_pen.r fragment_inty_pen.r

Value

A list of data frame and penalties, The first element is data frame with 2 more variables, second and third are HL and intensity penalties respectively.

22

penalties_df

Examples

```
data(df_comb_minimal)
penalties_df <- penalties(df_comb_minimal)[[1]]
pen_HL <- penalties(df_comb_minimal)[[2]]
pen_int <- penalties(df_comb_minimal)[[3]]</pre>
```

```
penalties_df
```

The result of penalties for df_comb_minimal example data A data frame containing the output of penalties as a data frame

Description

The result of penalties for df_comb_minimal example data A data frame containing the output of penalties as a data frame

Usage

data(penalties_df)

Format

A data frame with 300 rows and 20 variables:

strand: The strand specific

position: The bin/probe specific position

ID: The bin/probe specific ID

intensity.cdt1: The relative intensity at time point 0 for condition 1

position_segment: The position based segment

half_life.cdt1: The half-life of the bin/probe condition 1

TI_termination_factor.cdt1: The termination factor of the bin/probe condition 1

HL_fragment.cdt1: The half-life fragment the bin belongs to condition 1

intensity_fragment.cdt1: The intensity fragment the bin belongs to condition 1

TI_termination_fragment.cdt1: The TI fragment the bin belongs to condition 1

logFC_int: The bin/probe log2 fold change of intensity at time 0

P.Value: The bin/probe p_value adjusted

intensity.cdt2: The relative intensity at time point 0 condition 2

half_life.cdt2: The half-life of the bin/probe condition 2

TI_termination_factor.cdt2: The termination factor of the bin/probe condition 2
HL_fragment.cdt2: The half-life fragment the bin belongs to condition 2
intensity_fragment.cdt2: The intensity fragment the bin belongs to condition 2
TI_termination_fragment.cdt2: The TI fragment the bin belongs to condition 2
distance HL: The bin/probe difference of half-life from both conditions

distance_int: The bin/probe log2 fold change of intensity at time 0

Source

https://github.com/CyanolabFreiburg/rifiComparative

pen_HL	The result of penalties for df_comb_minimal example data. A list
	containing the output from penalties including the logbook and two
	penalty objects.

Description

The result of penalties for df_comb_minimal example data. A list containing the output from penalties including the logbook and two penalty objects.

Usage

data(pen_HL)

Format

A list with 5 items:

pen_obj_HL: A list with 4 items:

logbook: The logbook vector containing half-life penalty information **HL_penalties:** a vetor with the half-life penalty and half-life outlier penalty **correct:** a matrix of the correct splits **wrong:** a matrix of the incorrect splits

Source

https://github.com/CyanolabFreiburg/rifi

pen_int	The result of penalties for df_comb_minimal example data. A list
	containing the output from penalties including the logbook and two
	penalty objects.

Description

The result of penalties for df_comb_minimal example data. A list containing the output from penalties including the logbook and two penalty objects.

Usage

data(pen_int)

rifiComparative

Format

A list with 5 items:

pen_int: A list with 4 items:

logbook: The logbook vector containing intensity penalty informationint_penalties: a vector with the intensity penalty and intensity outlier penaltycorrect: a matrix of the correct splitswrong: a matrix of the incorrect splits

Source

https://github.com/CyanolabFreiburg/rifi

rifiComparative %
rifiComparative
rifiComparative a successor package of rifi. It compares 2 rifi
outputs from 2 different conditions of the same organism.

Description

rifiComparative was developed to compare 2 rifi outputs from 2 conditions. The rifi output may differ significantly from 2 conditions. The complexity of the segments number, position, length and the events make the comparison between 2 conditions nearly impossible. rifiComparative uses a simple strategy to generate single segments for both conditions, extract the features and make them comparable.

Details

Five major steps ate described in rifiComparative:

- 1. Joining data
- 2. penalties
- 3. fragmentation
- 4. statistics
- 5. visualization

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rifi_visualization_comparison

rifi_visualization_comparison plots the segments and genome annotation

Description

rifi_visualization_comparison plots the genome annotation, half-life difference (HL), log2FC(intensity) fragments. It uses several functions to plot TUs and genes including small-RNAs. Additionally it plots the statistical t-test between the neighboring fragment, significant p-values from t-test are assigned with '*'.

Usage

```
rifi_visualization_comparison(
  data,
  data_c,
  genomeLength = annot_g[[2]],
  annot = annot_g[[1]],
  condition = c("cdt1", "cdt2"),
  Strand = c("+", "-"),
  region = c("CDS", "asRNA", "5'UTR", "ncRNA", "3'UTR", "tRNA"),
 color_region = c("grey0", "red", "blue", "orange", "yellow", "green", "white",
    "darkseagreen1", "grey50", "black"),
  color_TU = c("cyan", "yellow", "orange"),
  scaling_TU = c(0, 3.4, 6.6),
  color_text.1 = "grey0",
  color_text.2 = "black",
  Alpha = 0.5,
  size_tu = 1.6,
  size_locusTag = 1.6,
  size_gene = 1.6,
  Limit = 10,
  shape = 22,
  face = "bold",
  tick_length = 0.3,
  arrow.color = "darkseagreen1",
  col_above20 = "#00FFFF",
  fontface = "plain",
  shape_above20 = 14,
  axis_text_y_size = 3,
  axis_title_y_size = 6,
  iTSS_threshold = 1.2,
  p_value_manova = 0.05,
  termination_threshold = 0.8
)
```

Arguments

data	dataframe: the probe based dataframe with joined columns.
data_c	dataframe: the probe based dataframe with joined rows.
genomeLength	integer: genome length output of gff3_preprocess function.
annot	dataframe: the annotation file.
condition	string: assigned as cdt1 (condition 1) and cdt2 (condition2), it could be adapted to any name.
Strand	string: either ("+" or "-").
region	dataframe: gff3 features of the genome.
color_region	string vector: vector of colors.
color_TU	string. TU color
scaling_TU	vector: values to adjusted termination and iTSSs to TUs.
color_text.1	string: TU color text
color_text.2	string: genes color text
Alpha	integer: color transparency degree.
size_tu	integer: TU size
size_locusTag	integer: locus_tag size
size_gene	integer: font size for gene annotation.
Limit	integer: value for y-axis limit.
shape	integer: value for shape.
face	string: label font.
tick_length	integer: value for ticks.
arrow.color	string: arrows color.
col_above20	string: color for probes/bin above value 20.
fontface	integer: font type
shape_above20	integer: shape for probes/bins above value 20.
axis_text_y_siz	
	integer: text size for y-axis.
axis_title_y_si	integer: title size for y-axis.
iTSS_threshold	integer: threshold for iTSS_II selected to plot, default 1.2.
	integer: p_value of manova test fragments to plot, default 0.05.
termination_thr	
	integer: threshold for termination to plot, default .8.

Details

The functions used are:

strand_selection: plots HL, intensity fragments from both strands.

splitGenome_function: splits the genome into fragments.

annotation_plot_comp: plots the corresponding annotation.

indice_function: assign a new column to the data to distinguish between fragments, outliers from delay or HL or intensity.

empty_data_positive: plots empty boxes in case no data is available for positive strand

empty_data_negative: plots empty boxes in case no data is available for negative strand

TU_annotation: designs the segments border for the genes and TUs annotation.

gene_annot_function: it requires gff3 file, returns a dataframe adjusting each fragment according to its annotation. It allows as well the plot of genes and TUs shared into two pages.

secondaryAxis: adjusts the half-life or delay to 20 in case of the dataframe row numbers is equal to 1 and the half-life or delay exceed the limit, they are plotted with different shape and color.

my_arrow: creates an arrow for the annotation.

arrange_byGroup: selects the last row for each segment and add 40 nucleotides in case of negative strand for a nice plot.

my_segment_T: plots terminals and pausing sites labels.

Value

The plot.

Examples

```
data(data_combined_minimal)
data(stats_df_comb_minimal)
data(annot_g)
rifi_visualization_comparison(
    data = data_combined_minimal,
    data_c = stats_df_comb_minimal,
    genomeLength = annot_g[[2]],
    annot = annot_g[[1]]
    )
```

statistics

statistics check segments significance using statistical test

Description

statistics uses t-test to check HL and intensity segments significance. The function returns the data frame with p_value and p_value adjusted. The function used is t_test_function.

Usage

statistics(data)

Arguments data

data frame: data frame output of fragmentation

Value

A list of two data frames, the first one contains all segments with p_value and p_value adjusted. The second one removes the duplicated segments from intensity and could be saved as an excel file.

Examples

```
data(fragment_int)
stats_df_comb_minimal <- statistics(data= fragment_int)[[1]]
df_comb_uniq_minimal <- statistics(data= fragment_int)[[2]]</pre>
```

stats_df_comb_minimal The result of statistics for fragment_int example data A data frame containing the output of statistics as a data frame

Description

The result of statistics for fragment_int example data A data frame containing the output of statistics as a data frame

Usage

```
data(stats_df_comb_minimal)
```

Format

A data frame with 500 rows and 26 variables:

strand: The strand specific

position: The bin/probe specific position

ID: The bin/probe specific ID

intensity.cdt1: The relative intensity at time point 0 for condition 1

position_segment: The position based segment

half_life.cdt1: The half-life of the bin/probe condition 1

TI_termination_factor.cdt1: The termination factor of the bin/probe condition 1

HL_fragment.cdt1: The half-life fragment the bin belongs to condition 1

intensity_fragment.cdt1: The intensity fragment the bin belongs to condition 1

30

TI_termination_fragment.cdt1: The TI fragment the bin belongs to condition 1

logFC_int: The bin/probe log2 fold change of intensity at time 0

P.Value: The bin/probe p_value adjusted

intensity.cdt2: The relative intensity at time point 0 condition 2

half_life.cdt2: The half-life of the bin/probe condition 2

TI_termination_factor.cdt2: The termination factor of the bin/probe condition 2

HL_fragment.cdt2: The half-life fragment the bin belongs to condition 2

intensity_fragment.cdt2: The intensity fragment the bin belongs to condition 2

TI_termination_fragment.cdt2: The TI fragment the bin belongs to condition 2

distance_HL: The bin/probe difference of half-life from both conditions

distance_int: The bin/probe log2 fold change of intensity at time 0

HL_comb_fragment: The half-life fragment the bin belongs to both conditions

HL_mean_comb_fragment: The half-life mean of the fragment the bin belongs to both conditions

intensity_comb_fragment: The intensity fragment the bin belongs to both conditions

- intensity_mean_comb_fragment: The intensity mean of the fragment the bin belongs to both conditions
- **p_value_distance_HL:** The p_value adjusted of the half-life fragment the bin belongs to both conditions
- **p_value_distance_intensity:** The p_value adjusted of the intensity fragment the bin belongs to both conditions

Source

https://github.com/CyanolabFreiburg/rifiComparative

stats_se_cdt1	An example SummarizedExperiment from Synechosystis PCC 6803
	first condition obtained from rifi_statistics and used as input for ri-
	fiComparative

Description

An example SummarizedExperiment from Synechosystis PCC 6803 first condition obtained from rifi_statistics and used as input for rifiComparative

Usage

data(stats_se_cdt1)

Format

A rowRanges of SummarizedExperiment with 500 rows and 50 variables:

seqnames: The sequence name chromosome start: The bin/probe start position end: The bin/probe end position width: The bin/probe length strand: The strand specific position: The bin/probe specific position **ID:** The bin/probe specific ID FLT: The bin/probe flag for background level **intensity:** The relative intensity at time point 0 probe TI: An internal value to determine which fitting model is applied flag: Information on which fitting model is applied position segment: The position based segment delay: The delay value of the bin/probe half_life: The half-life of the bin/probe TI_termination_factor: The termination factor of the bin/probe **delay_fragment:** The delay fragment the bin belongs to velocity_fragment: The velocity value of the respective delay fragment intercept: The vintercept of fit through the respective delay fragment slope: The slope of the fit through the respective delay fragment HL_fragment: The half-life fragment the bin belongs to HL_mean_fragment: The mean half-life value of the respective half-life fragment intensity_fragment: The intensity fragment the bin belongs to intensity mean fragment: The mean intensity value of the respective intensity fragment TU: The overarching transcription unit **TI termination fragment:** The TI fragment the bin belongs to **TI mean termination factor:** The mean termination factor of the respective TI fragment seg ID: The combined ID of the fragment pausing_site: presence of pausing site indicated by +/iTSS_I: presence of iTSS_I indicated by +/ps_ts_fragment: The fragments involved in pausing site or iTSS_I event_ps_itss_p_value_Ttest: p_value of pausing site or iTSS_I#' delay_frg_slope: the slope value of the respective delay fragment **p_value_slope:** p_value of the slope velocity ratio: Integer, ratio of velocity between 2 delay fragments event_duration: Integer, the duration between two delay fragments

event_position: Integer, the position middle between 2 fragments with an event

- FC_HL: Integer, the fold change value of 2 HL fragments
- FC_fragment_HL: Integer, the fold change value of 2 intensity fragments
- p_value_HL: p_value of the fold change of HL fragments
- FC_intensity: Integer, the fold change value of 2 intensity fragments
- FC_fragment_intensity: String, fragments involved in fold change between 2 intensity fragments
- p_value_intensity: p_value of the fold change of intensity fragments
- FC_HL_intensity: ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_intensity_fragment: fragments involved on ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_adapted: Integer, the fold change of half-life/ fold change of intensity, position of the half-life fragment is adapted to intensity fragment

synthesis_ratio: Integer, the value corresponding to synthesis rate

synthesis_ratio_event: String, the event assigned by synthesis rate either Termination or iTSS

p_value_Manova: p_value of the variance between two fold-changes, HL and intensity

p_value_TI: p_value of TI fragment

TI_fragments_p_value: p_value of 2 TI fragments

Source

https://github.com/CyanolabFreiburg/rifiComparative

<pre>stats_se_cdt2</pre>	An example SummarizedExperiment from Synechosystis PCC 6803
	second condition obtained from rifi_statistics and used as input for rifiComparative

Description

An example SummarizedExperiment from Synechosystis PCC 6803 second condition obtained from rifi_statistics and used as input for rifiComparative

Usage

data(stats_se_cdt2)

Format

A rowRanges of SummarizedExperiment with 500 rows and 50 variables:

seqnames: The sequence name chromosome start: The bin/probe start position end: The bin/probe end position width: The bin/probe length strand: The strand specific position: The bin/probe specific position **ID:** The bin/probe specific ID FLT: The bin/probe flag for background level **intensity:** The relative intensity at time point 0 probe TI: An internal value to determine which fitting model is applied flag: Information on which fitting model is applied position segment: The position based segment delay: The delay value of the bin/probe half_life: The half-life of the bin/probe TI_termination_factor: The termination factor of the bin/probe **delay_fragment:** The delay fragment the bin belongs to velocity_fragment: The velocity value of the respective delay fragment intercept: The vintercept of fit through the respective delay fragment slope: The slope of the fit through the respective delay fragment HL_fragment: The half-life fragment the bin belongs to HL_mean_fragment: The mean half-life value of the respective half-life fragment intensity_fragment: The intensity fragment the bin belongs to intensity mean fragment: The mean intensity value of the respective intensity fragment TU: The overarching transcription unit **TI termination fragment:** The TI fragment the bin belongs to **TI mean termination factor:** The mean termination factor of the respective TI fragment seg ID: The combined ID of the fragment pausing_site: presence of pausing site indicated by +/iTSS_I: presence of iTSS_I indicated by +/ps_ts_fragment: The fragments involved in pausing site or iTSS_I event_ps_itss_p_value_Ttest: p_value of pausing site or iTSS_I **p_value_slope:** p_value of the slope delay_frg_slope: the slope value of the respective delay fragment velocity ratio: Integer, ratio of velocity between 2 delay fragments event_duration: Integer, the duration between two delay fragments

- FC_HL: Integer, the fold change value of 2 HL fragments
- FC_fragment_HL: Integer, the fold change value of 2 intensity fragments
- p_value_HL: p_value of the fold change of HL fragments
- FC_intensity: Integer, the fold change value of 2 intensity fragments
- FC_fragment_intensity: String, fragments involved in fold change between 2 intensity fragments
- p_value_intensity: p_value of the fold change of intensity fragments
- **FC_HL_intensity:** ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- FC_HL_intensity_fragment: fragments involved on ratio of fold change between 2 half-life fragments and fold change between 2 intensity fragments
- **FC_HL_adapted:** Integer, the fold change of half-life/ fold change of intensity, position of the half-life fragment is adapted to intensity fragment

synthesis_ratio: Integer, the value corresponding to synthesis rate

synthesis_ratio_event: String, the event assigned by synthesis rate either Termination or iTSS

p_value_Manova: p_value of the variance between two fold-changes, HL and intensity

p_value_TI: p_value of TI fragment

TI_fragments_p_value: p_value of 2 TI fragments

Source

https://github.com/CyanolabFreiburg/rifiComparative

Index

* datasets annot_g, 4 data_combined_minimal, 5 df_comb_minimal, 7 df_mean_minimal, 8 differential_expression, 9 fragment_int, 12 inp_f, 14 inp_s, 16 pen_HL, 24 pen_int, 24 penalties_df, 23 stats_df_comb_minimal, 29 stats_se_cdt1, 30 stats_se_cdt2, 32 adjusting_HLToInt, 2 annot_g, 4 data_combined_minimal, 5 df_comb_minimal, 7 df_mean_minimal, 8 differential_expression, 9 figures_fun,9 fragment_int, 12 fragmentation, 11 gff3_preprocess, 13 inp_f, 14 inp_s, 16 joining_data_column, 18 joining_data_row, 18 loading_fun, 19 make_pen, 20 pen_HL, 24

pen_int, 24
penalties, 22
penalties_df, 23

rifi_visualization_comparison, 26
rifiComparative, 25

statistics, 28
stats_df_comb_minimal, 29
stats_se_cdt1, 30
stats_se_cdt2, 32