Package 'dar'

May 10, 2024

Title Differential Abundance Analysis by Consensus

Version 1.0.0 **Date** 2023-09-21

Description Differential abundance testing in microbiome data challenges both parametric and non-parametric statistical methods, due to its sparsity, high variability and compositional nature. Microbiome-specific statistical methods often assume classical distribution models or take into account compositional specifics. These produce results that range within the specificity vs sensitivity space in such a way that type I and type II error that are difficult to ascertain in real microbiome data when a single method is used. Recently, a consensus approach based on multiple differential abundance (DA) methods was recently suggested in order to increase robustness. With dar, you can use dplyr-like pipeable sequences of DA methods and then apply different consensus strategies. In this way we can obtain more reliable results in a fast, consistent and reproducible way.

License MIT + file LICENSE

Encoding UTF-8

URL https://github.com/MicrobialGenomics-IrsicaixaOrg/dar,
 https://microbialgenomics-irsicaixaorg.github.io/dar/

BugReports https://github.com/MicrobialGenomics-IrsicaixaOrg/dar/issues

biocViews Software, Sequencing, Microbiome, Metagenomics, MultipleComparison, Normalization

Imports cli, ComplexHeatmap, crayon, dplyr, generics, ggplot2, glue, gplots, heatmaply, magrittr, methods, mia, phyloseq, purrr, readr, rlang (>= 0.4.11), scales, stringr, tibble, tidyr, UpSetR, waldo

Suggests ALDEx2, ANCOMBC, apeglm, ashr, Biobase, corncob, covr, DESeq2, devtools, furrr, future, knitr, lefser, limma, Maaslin2, metagenomeSeq, microbiome, rmarkdown, roxygen2,

2 Contents

roxyglobals, roxytest, rstatix, SummarizedExperiment, TreeSummarizedExperiment, testthat (>= 3.0.0)					
Config/testthat/edition 3					
Depends R (>= 4.4.0)					
LazyData false					
Collate 'recipe-class.R' 'aldex2.R' 'ancom.R' 'bake.R' 'corncob.R' 'dar-package.R' 'data.R' 'deseq2.R' 'filter_by_abundance.R' 'filter_by_prevalence.R' 'filter_by_rarity.R' 'filter_by_variance.R' 'filter_taxa.R' 'globals.R' 'lefse.R' 'masslin2.R' 'metagenomeseq.R' 'misc.R' 'phyloseq_qc.R' 'pkg_check.R' 'plot_methods.R' 'rarefaction.R' 'read_data.R' 'steps_and_checks.R' 'subset_taxa.R' 'utils-pipe.R' 'utils-tidy-eval.R' 'utils.R' 'wilcox.R'					
VignetteBuilder knitr					
Config/roxyglobals/filename globals.R					
Config/roxyglobals/unique TRUE					
Config/testthat/parallel true					
RoxygenNote 7.3.1					
git_url https://git.bioconductor.org/packages/dar					
git_branch RELEASE_3_19					
git_last_commit 1d07d5f					
git_last_commit_date 2024-04-30					
Repository Bioconductor 3.19					
Date/Publication 2024-05-10					
Author Francesc Catala-Moll [aut, cre] (https://orcid.org/0000-0002-2354-8648)					
Maintainer Francesc Catala-Moll <fcatala@irsicaixa.es></fcatala@irsicaixa.es>					
Contents					
dar-package abundance_plt add_step add_tax add_var bake contains_rarefaction cool corr_heatmap exclusion_plt export_steps find_intersections				 	10 11 11 11 14

Contents 3

get_comparisons	15
get_phy	 16
get_tax	 17
get_var	 17
import_steps	 18
intersection_df	 19
intersection_plt	
metaHIV_phy	
mutual_plt	
 otu_table	
overlap_df	
pastry_df	
phyloseq_or_null-class	
phy_qc	
prep	27
PrepRecipe-class	
prep_recipe	29
rand_id	
read_data	
recipe	31
recipes_pkg_check	32
required_deps	33
sample_data	34
step	34
steps_ids	35
step_aldex	36
step_ancom	38
step_corncob	42
step_deseq	45
step_filter_by_abundance	 47
step_filter_by_prevalence	49
step_filter_by_rarity	 50
step_filter_by_variance	 52
step_filter_taxa	 53
step_lefse	 54
step_maaslin	57
step_metagenomeseq	 59
step_rarefaction	62
step subset taxa	 63
step_to_expr	64
step_wilcox	65
tax_table	67
test_prep_rec	67
test_rec	68
tidyeval	68
to_tibble	70
use rarefy	71
usc_rarcry	 72

4 abundance_plt

Index 74

dar-package

dar: Differential Abundance Analysis by Consensus

Description

To learn more about dar, start with the vignettes: browseVignettes(package = "dar")

Author(s)

Maintainer: Francesc Catala-Moll <fcatala@irsicaixa.es> (ORCID)

See Also

Useful links:

- https://github.com/MicrobialGenomics-IrsicaixaOrg/dar
- https://microbialgenomics-irsicaixaorg.github.io/dar/
- Report bugs at https://github.com/MicrobialGenomics-IrsicaixaOrg/dar/issues

abundance_plt

Abundance boxplot

Description

Abundance boxplot

```
abundance_plt(
  rec,
  taxa_ids = NULL,
  type = "boxplot",
  transform = "compositional",
  scale = 1,
  top_n = 20
)

## S4 method for signature 'Recipe'
abundance_plt(
  rec,
  taxa_ids = NULL,
  type = "boxplot",
```

abundance_plt 5

```
transform = "compositional",
    scale = 1,
    top_n = 20
)

## S4 method for signature 'PrepRecipe'
abundance_plt(
    rec,
    taxa_ids = NULL,
    type = "boxplot",
    transform = "compositional",
    scale = 1,
    top_n = 20
)
```

Arguments

rec A Recipe or Recipe step.

taxa_ids Character vector with taxa_ids to plot. If taxa_ids is NULL the significant char-

acteristics present in all of the executed methods will be plotted.

type Character vector indicating the type of the result. Options: c("boxoplot", "heatmap").

transform Transformation to apply. The options include: 'compositional' (ie relative abun-

dance), 'Z', 'log10', 'log10p', 'hellinger', 'identity', 'clr', 'alr', or any method from the vegan::decostand function. If the value is NULL, no normalization is

applied and works with the raw counts.

scale Scaling constant for the abundance values when transform = "scale".

top_n Maximum number of taxa to represent. Default: 20.

Value

ggplot2

```
data(test_prep_rec)
## Running the function returns a boxplot,
abundance_plt(test_prep_rec)
## Giving the value "heatmap" to the type parameter, the resulting graph
## a heatmap.
# abundance_plt(test_prep_rec, type = "heatmap")

## By default, those taxa significant in all methods are plotted. If you want
## to graph some determined features, you can pass them as vector through the
## taxa_ids parameter.
# taxa_ids <- c("Otu_96", "Otu_78", "Otu_88", "Otu_35", "Otu_94", "Otu_34")
# abundance_plt(test_prep_rec, taxa_ids = taxa_ids)
# abundance_plt(test_prep_rec, taxa_ids = taxa_ids, type = "heatmap")</pre>
```

6 add_tax

```
## abundance_plt function needs a PrepRecipe. If you pass a a non-prep
## Recipe the output is an error.
data(test_rec)
err <- testthat::expect_error(abundance_plt(test_rec))
err</pre>
```

add_step

Add a New Operation to the Current Recipe

Description

add_step adds a step to the last location in the Recipe. add_check does the same for checks.

Usage

```
add_step(rec, object)

## S4 method for signature 'Recipe'
add_step(rec, object)

## S4 method for signature 'PrepRecipe'
add_step(rec, object)
```

Arguments

rec A Recipe().

object A step or check object.

Value

A updated Recipe() with the new operation in the last slot.

 $\mathsf{add}_\mathsf{tax}$

Adds taxonomic level of interest in the Recipe.

Description

Adds taxonomic level of interest in the Recipe.

```
add_tax(rec, tax_info)
## S4 method for signature 'Recipe'
add_tax(rec, tax_info)
## S4 method for signature 'PrepRecipe'
add_tax(rec, tax_info)
```

add_var 7

Arguments

rec A Recipe object.

tax_info A character string of taxonomic levels that will be used in any context.

Value

A Recipe object.

Examples

```
data(metaHIV_phy)
## Define recipe
rec <-
    recipe(metaHIV_phy)

## add var info
rec <- add_tax(rec, tax_info = "Species")
rec

## add tax info to a prep-Recipe returns an error
data(test_prep_rec)
err <- testthat::expect_error(
    add_tax(test_prep_rec, tax_info = "Species")
)
err</pre>
```

add_var

Adds variable of interest to the Recipe

Description

Adds variable of interest to the Recipe

```
add_var(rec, var_info)
## S4 method for signature 'Recipe'
add_var(rec, var_info)
## S4 method for signature 'PrepRecipe'
add_var(rec, var_info)
```

8 bake

Arguments

rec A Recipe object.

var_info A character string of column names corresponding to variables that will be used

in any context.

Value

A Recipe object.

Examples

```
data(metaHIV_phy)

## Define recipe
rec <- recipe(metaHIV_phy)

## add var info
rec <- add_var(rec, var_info = "RiskGroup2")
rec

## add var info to a prep-recipe returns an error
data(test_prep_rec)
err <- testthat::expect_error(
   add_var(test_prep_rec, var_info = "RiskGroup2")
)
err</pre>
```

bake

Define consensus strategies from a Recipe

Description

For a prep Recipe adds a consensus strategies to use for result extraction.

```
bake(
  rec,
  count_cutoff = NULL,
  weights = NULL,
  exclude = NULL,
  id = rand_id("bake")
)

## S4 method for signature 'PrepRecipe'
bake(
  rec,
```

bake 9

```
count_cutoff = NULL,
  weights = NULL,
  exclude = NULL,
  id = rand_id("bake")
)

## S4 method for signature 'Recipe'
bake(
  rec,
  count_cutoff = NULL,
  weights = NULL,
  exclude = NULL,
  id = rand_id("bake")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

count_cutoff Indicates the minimum number of methods in which an OTU must be present

(Default: NULL). If count cutoff is NULL count cutoff is equal to length(steps_ids(rec,

"da")) - length(exclude)

weights Named vector with the ponderation value for each method.

exclude Method ids to exclude.

id A character string that is unique to this step to identify it.

Value

An object of class PrepRecipe

```
data(test_prep_rec)
rec <- test_prep_rec

## Default bake extracts common OTUs in all DA tested methods
## (In this case the Recipe contains 3 methods)
res <- bake(rec)
cool(res)

## bake and cool methods needs a PrepRecipe. If you pass a non-PrepRecipe
## the output is an error.
data(test_rec)
err <- testthat::expect_error(bake(test_rec))
err

## We can use the parameter `cout_cutoff` to for example select those OTUs
## shared with at least two methods
res <- bake(rec, count_cutoff = 2)</pre>
```

10 contains_rarefaction

```
cool(res)

## Furthermore, we can exclude methods from the consensus strategy with the
## `exclude` parameter.
res <- bake(rec, exclude = steps_ids(rec, "da")[1])
cool(res)

## Finally, we can use the `weights` parameter to weigh each method.
weights <- c(2, 1, 1)
names(weights) <- steps_ids(rec, "da")
res <- bake(rec, weights = weights)
cool(res)</pre>
```

Description

Checks if Recipe contains a rarefaction step

Usage

```
contains_rarefaction(rec)
```

Arguments

rec

A Recipe object. The step will be added to the sequence of operations for this recipe.

Value

boolean

```
data(GlobalPatterns, package = "phyloseq")
rec <-
   phyloseq::subset_samples(
     GlobalPatterns, SampleType %in% c("Soil", "Skin")
) |>
   recipe(var_info = "SampleType", tax_info = "Genus") |>
   step_rarefaction()

contains_rarefaction(rec)
```

cool 11

cool

Extract results from defined bake

Description

Extract results from defined bake

Usage

```
cool(rec, bake = 1)
## S4 method for signature 'Recipe'
cool(rec, bake = 1)
## S4 method for signature 'PrepRecipe'
cool(rec, bake = 1)
```

Arguments

rec A Recipe object.

bake Name or index of the bake to extract.

Value

tbl_df

```
data(test_prep_rec)
## First we need to add bakes (extraction strategies) to the PrepRecipe.
rec <- bake(test_prep_rec)
## Finally we can extract the results with the cool method
cool(rec)
## By default cool extracts the results of the first bake. If we have more
## bakes we can extract the one that you want with the bake parameter.
rec <- bake(rec, count_cutoff = 1)
cool(rec, 2)
## bake and cool methods needs a prep-Recipe. If you pass a non-PrepRecipe
## the output is an error.
data(test_rec)
err <- testthat::expect_error(cool(test_rec))
err</pre>
```

12 corr_heatmap

corr_heatmap Plot otuput of the overlap_df function as a heatmap.	
---	--

Description

Plot otuput of the overlap_df function as a heatmap.

Usage

```
corr_heatmap(rec, steps = steps_ids(rec, "da"), font_size = 15, type = "all")
## S4 method for signature 'Recipe'
corr_heatmap(rec, steps = steps_ids(rec, "da"), font_size = 15, type = "all")
## S4 method for signature 'PrepRecipe'
corr_heatmap(rec, steps = steps_ids(rec, "da"), font_size = 15, type = "all")
```

Arguments

rec A Recipe object.

steps Character vector with step_ids to take in account.

font_size Size of the axis font.

type Indicates whether to use all taxa ("all") or only those that are differentially abun-

dant in at least one method ("da"). Default as "all".

Value

heatmap

```
data(test_prep_rec)
## Running the function returns a UpSet plot ordered by frequency.
corr_heatmap(test_prep_rec)
## If you want to exclude a method for the plot, you can remove it with the
## step parameter. In the following example we eliminate from the graph the
## results of maaslin
corr_heatmap(test_prep_rec, steps = steps_ids(test_prep_rec, "da")[-1])
## corr_heatmap function needs a PrepRecipe. If you pass a a non-prep
## Recipe the output is an error.
data(test_rec)
err <- testthat::expect_error(corr_heatmap(test_rec))
err</pre>
```

exclusion_plt 13

exclusion_plt

Plot the number of shared DA OTUs between methods.

Description

Plot the number of shared DA OTUs between methods.

Usage

```
exclusion_plt(rec, steps = steps_ids(rec, "da"))
## S4 method for signature 'Recipe'
exclusion_plt(rec, steps = steps_ids(rec, "da"))
## S4 method for signature 'PrepRecipe'
exclusion_plt(rec, steps = steps_ids(rec, "da"))
```

Arguments

rec A Recipe object.

steps Character vector with step_ids to take in account.

Value

```
ggplot2-class object
```

```
data(test_prep_rec)
## Running the function returns a barplot plot,
exclusion_plt(test_prep_rec)

## If you want to exclude a method for the plot, you can remove it with the
## step parameter. In the following example we eliminate from the graph the
## results of maaslin
exclusion_plt(test_prep_rec, steps = steps_ids(test_prep_rec, "da")[-1])

## intersection_plt function needs a PrepRecipe. If you pass a a non-prep
## Recipe the output is an error.
data(test_rec)
err <- testthat::expect_error(exclusion_plt(test_rec))
err</pre>
```

14 find_intersections

export_steps

Export step parameters as json.

Description

Export step parameters as json.

Usage

```
export_steps(rec, file_name)
```

Arguments

rec A Recipe object.

file_name The path and file name of the optout file.

Value

invisible

Examples

```
data(metaHIV_phy)

## Create a Recipe with steps
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Species") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.3 * length(x))") |>
    step_filter_by_prevalence(0.4) |>
    step_maaslin()

## Prep Recipe
rec <- prep(rec, parallel = TRUE)

## Export to json file
export_steps(rec, tempfile(fileext = ".json"))</pre>
```

find_intersections

Finds common OTU between method results

Description

Finds common OTU between method results

```
find_intersections(rec, steps = steps_ids(rec, "da"))
```

get_comparisons 15

Arguments

rec A Recipe object.

steps character vector with step ids to take in account

Value

tibble

Examples

```
data(test_prep_rec)
## From a PrepRecipe we can extract a tibble with all intersections
intersections <- find_intersections(test_prep_rec)
intersections

## Additionally, we can exclude some methods form the table
intersections <- find_intersections(
   test_prep_rec,
   steps = steps_ids(test_prep_rec, "da")[-1]
)
intersections</pre>
```

get_comparisons

Generate all unique contrasts between levels of a categorical variable.

Description

Generate all unique contrasts between levels of a categorical variable.

Usage

```
get_comparisons(var, phy, as_list = TRUE, n_cut = 1)
```

Arguments

var categorical variable phy phyloseq object

as_list boolean indicating if output must be returned as a list.

n_cut minimum of observations by level.

Value

tibble or list

get_phy

Examples

```
data(test_rec)
dar:::get_comparisons("RiskGroup2", get_phy(test_rec))
```

 get_phy

Returns phyloseq from Recipe-class object

Description

Returns phyloseq from Recipe-class object

Usage

```
get_phy(rec)
## S4 method for signature 'Recipe'
get_phy(rec)
```

Arguments

rec

A Recipe object

Value

Phyloseq class object

```
data(metaHIV_phy)

## Define recipe
rec <-
   recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")

## Extract phyloseq object
get_phy(rec)</pre>
```

get_tax 17

get_tax

Returns tax_info from Recipe-class object

Description

Returns tax_info from Recipe-class object

Usage

```
get_tax(rec)
## S4 method for signature 'Recipe'
get_tax(rec)
```

Arguments

rec

A Recipe object

Value

Tibble containing tax_info.

Examples

```
data(metaHIV_phy)

## Define recipe
rec <-
   recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")

## Extract taxonomic level
get_tax(rec)</pre>
```

get_var

Returns var_info from Recipe-class object

Description

Returns var_info from Recipe-class object

```
get_var(rec)
## S4 method for signature 'Recipe'
get_var(rec)
```

import_steps

Arguments

rec A Recipe object

Value

Tibble containing var_info.

Examples

```
data(metaHIV_phy)

## Define recipe
rec <-
   recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")

## Extract variable of interest
get_var(rec)</pre>
```

import_steps

Import steps from json file

Description

Import steps from json file

Usage

```
import_steps(rec, file, parallel = TRUE, workers = 4)
```

Arguments

rec A Recipe object.

file Path to the input file.

parallel if FALSE, no palatalization. if TRUE, parallel execution using future and furrr

packages.

workers Number of workers for palatalization.

Value

recipe-class object

intersection_df 19

Examples

```
data(metaHIV_phy)

## Initialize the Recipe with a phyloseq object
rec <- recipe(metaHIV_phy, "RiskGroup2", "Species")
rec

## Import steps
json_file <- system.file("extdata", "test.json", package = "dar")
rec <- import_steps(rec, json_file)
rec

## If the json file contains 'bake', the Recipe is automatically prepared.
json_file <- system.file("extdata", "test_bake.json", package = "dar")
rec <- recipe(metaHIV_phy, "RiskGroup2", "Species") |> import_steps(json_file)

rec cool(rec)
```

intersection_df

Returns data.frame with OTU intersection between methods

Description

Returns data.frame with OTU intersection between methods

Usage

```
intersection_df(rec, steps = steps_ids(rec, "da"), tidy = FALSE)
## S4 method for signature 'Recipe'
intersection_df(rec, steps = steps_ids(rec, "da"), tidy = FALSE)
## S4 method for signature 'PrepRecipe'
intersection_df(rec, steps = steps_ids(rec, "da"), tidy = FALSE)
```

Arguments

rec	A Recipe object.
steps	character vector with step_ids to take in account.
tidy	Boolan indicating if result must be in tidy format.

Value

data.frame class object

20 intersection_plt

Examples

```
data(test_prep_rec)

df <- intersection_df(test_prep_rec)
head(df)

## intersection_df function needs a prep-Recipe. If you pass a a non-prep
## recipe the output is an error.
data(test_rec)
err <- testthat::expect_error(intersection_df(test_rec))
err</pre>
```

intersection_plt

Plot results using UpSet plot

Description

Plot results using UpSet plot

Usage

```
intersection_plt(
   rec,
   steps = steps_ids(rec, "da"),
   ordered_by = c("freq", "degree"),
   font_size = 2
)

## S4 method for signature 'Recipe'
intersection_plt(rec, steps, font_size)

## S4 method for signature 'PrepRecipe'
intersection_plt(
   rec,
   steps = steps_ids(rec, "da"),
   ordered_by = c("freq", "degree"),
   font_size = 2
)
```

Arguments

rec A Recipe object.

steps Character vector with step_ids to take in account.

ordered_by How the intersections in the matrix should be ordered by. Options include fre-

quency (entered as "freq"), degree, or both in any order.

font_size Size of the font.

metaHIV_phy 21

Value

UpSet plot

Examples

```
data(test_prep_rec)
## Running the function returns a UpSet plot ordered by frequency.
intersection_plt(test_prep_rec)

## Alternatively, you can order the plot by degree
intersection_plt(test_prep_rec, ordered_by = "degree")

## If you want to exclude a method for the plot, you can remove it with the
## step parameter. In the following example we eliminate from the graph the
## results of maaslin
intersection_plt(test_prep_rec, steps = steps_ids(test_prep_rec, "da")[-1])

## intersection_plt function needs a PrepRecipe. If you pass a a non-prep
## Recipe the output is an error.
data(test_rec)
err <- testthat::expect_error(intersection_plt(test_rec))
err</pre>
```

metaHIV_phy

Phyloseq object from metaHIV project

Description

A Phyloseq object containing abundance counts and sample_data for metaHIV project. Count reads were annotated with Metaphlan3.

Usage

```
data("metaHIV_phy")
```

Format

A phyloseq object with 451 taxas, 30 samples, 3 sample variables and 7 taxonomic ranks.

Source

s3://fcatala-09142020-eu-west-1/cloud_test/SpeciesQuantification/Kraken2

22 mutual_plt

mutual_plt

Mutual finding plot

Description

Plots number of differentially abundant features mutually found by defined number of methods, colored by the differential abundance direction and separated by comparison.

Usage

```
mutual_plt(
  rec,
  count_cutoff = NULL,
  comparisons = NULL,
  steps = steps_ids(rec, type = "da"),
  top_n = 20
)
## S4 method for signature 'Recipe'
mutual_plt(
  rec,
  count_cutoff = NULL,
  comparisons = NULL,
  steps = steps_ids(rec, type = "da"),
  top_n = 20
)
## S4 method for signature 'PrepRecipe'
mutual_plt(
  rec,
  count_cutoff = NULL,
  comparisons = NULL,
  steps = steps_ids(rec, type = "da"),
  top_n = 20
)
```

Arguments

rec	A Recipe or Recipe step.
count_cutoff	Indicates the minimum number of methods in which an OTU must be present (Default: NULL). If count_cutoff is NULL count_cutoff is equal to length(steps_ids(rec, "da")) $*2/3$.
comparisons	By default, this function plots all comparisons. However, if the user indicates the comparison or comparisons of interest, only the selected ones will be plotted.
steps	Character vector with step_ids to take in account. Default all "da" methods.
top_n	Maximum number of taxa to represent. Default: 20.

otu_table 23

Value

ggplot2

Examples

```
data(test_prep_rec)
## Running the function returns a tile plot,
mutual_plt(test_prep_rec)
## The count_cutoff indicates the minimum number of methods in which an OTU
## must be present. By default the value is equal to
## length(steps_ids(rec, "da")) * 2 / 3 but it is customizable.
mutual_plt(
  test_prep_rec,
  count_cutoff = length(steps_ids(test_prep_rec, "da"))
## A single comparisons can be plotted through the comparison parameter.
mutual_plt(test_prep_rec, comparisons = c("hts_msm"))
## If you want to exclude a method for the plot, you can remove it with the
## step parameter. In the following example we eliminate from the graph the
## results of maaslin.
mutual_plt(test_prep_rec, steps = steps_ids(test_prep_rec, "da")[-1])
## mutual_plt function needs a PrepRecipe. If you pass a a non-PrepRecipe
## the output is an error.
data(test_rec)
err <- testthat::expect_error(mutual_plt(test_rec))</pre>
err
```

otu_table

Extracts otu_table from phyloseq inside a Recipe

Description

Extracts otu_table from phyloseq inside a Recipe

Usage

```
otu_table(rec)
## S4 method for signature 'Recipe'
otu_table(rec)
```

Arguments

rec

A Recipe or Recipe step.

24 overlap_df

Value

A tibble

Examples

```
data(metaHIV_phy)

## Define recipe
rec <-
   recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")

## Extract otu_table from phyloseq object
otu_table(rec)</pre>
```

overlap_df

Overlap of significant OTUs between tested methods.

Description

Overlap of significant OTUs between tested methods.

Usage

```
overlap_df(rec, steps = steps_ids(rec, "da"), type = "all")
## S4 method for signature 'Recipe'
overlap_df(rec, steps = steps_ids(rec, "da"), type = "all")
## S4 method for signature 'PrepRecipe'
overlap_df(rec, steps = steps_ids(rec, "da"), type = "all")
```

Arguments

rec A Recipe object.

steps Character vector with step_ids to take in account.

type Indicates whether to use all taxa ("all") or only those that are differentially abun-

dant in at least one method ("da"). Default as "all".

Value

df

pastry_df 25

Examples

```
data(test_prep_rec)
## Running the function returns a UpSet plot ordered by frequency.
df <- overlap_df(test_prep_rec, steps_ids(test_prep_rec, "da"))
head(df)

## If you want to exclude a method for the plot, you can remove it with the
## step parameter. In the following example we eliminate from the graph the
## results of maaslin
overlap_df(test_prep_rec, steps = steps_ids(test_prep_rec, "da")[-1])

## overlap_df function needs a prep-Recipe. If you pass a a non-prep
## Recipe the output is an error.
data(test_rec)
err <- testthat::expect_error(overlap_df(test_rec))
err</pre>
```

pastry_df

Pastery data for step id generation

Description

Tibble contain

Format

A tbl_df object with 228 unique pasteries.

Value

tibble with pastry names

Source

https://raw.githubusercontent.com/prasertcbs/basic-dataset/master/pastry.csv

```
phyloseq_or_null-class
```

Recipe-class object

Description

A Recipe is a description of the steps to be applied to a data set in order to prepare it for data analysis.

26 phy_qc

Usage

```
## S4 method for signature 'PrepRecipe'
show(object)
```

Arguments

object

A Recipe object.

Value

Recipe-class object

Slots

phyloseq Phyloseq-class object.

var_info A tibble that contains the current set of terms in the data set. This initially defaults to the same data contained in var_info.

tax_info A tibble that contains the current set of taxonomic levels that will be used in the analysis. steps List of step-class objects that will be used by DA.

phy_qc

Phyloseq Quality Control Metrics

Description

phy_qc() returns a tibble. It will have information about some important metrics about the sparsity of the count matrix. The content of the table is as follows:

- var_levels: levels of the categorical variable of interest. "all" refers to all rows of the dataset (without splitting by categorical levels).
- n: total number of values in the count matrix.
- n_zero: number of zeros in the count matrix.
- pct_zero: percentage of zeros in the count matrix.
- pct_all_zero: percentage of taxa with zero counts in all samples.
- pct_singletons: percentage of taxa with counts in a single sample.
- pct_doubletons: percentage of taxa with counts in two samples.
- count_mean: average of the mean counts per sample.
- count_min: average of the min counts per sample.
- count_max: average of the max counts per sample.

```
phy_qc(rec)
## S4 method for signature 'Recipe'
phy_qc(rec)
```

prep 27

Arguments

rec A Recipe or Recipe step.

Value

A tibble

Examples

```
data(metaHIV_phy)
## Define Recipe
rec <- recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")
phy_qc(rec)</pre>
```

prep

Performs all the steps defined in a Recipe

Description

For a Recipe with at least one preprocessing or DA operation run the steps in a convenient order.

Usage

```
prep(rec, parallel = TRUE, workers = 4, force = FALSE)
## S4 method for signature 'Recipe'
prep(rec, parallel = TRUE, workers = 4, force = FALSE)
```

Arguments

rec A Recipe object. and furrr packages.

parallel if FALSE, no palatalization. if TRUE, parallel execution using future and furrr

packages.

workers Number of workers for palatalization.

force Force the reexecution of all steps. This remove previous results.

Value

A PrepRecipe object.

28 PrepRecipe-class

Examples

```
data(metaHIV_phy)
## Define Recipe
rec <-
  recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Class") |>
  step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
  step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.03 * length(x))") |>
  step_maaslin()
## Prep Recipe
da_results <- prep(rec)</pre>
## If you try
## Consensus strategy
n methods <- 2
da_results <- bake(da_results, count_cutoff = n_methods)</pre>
da_results
## If you try to run prep on an object of class PrepRecipe it returns an
err <- testthat::expect_error(prep(da_results))</pre>
err
## You can force the overwrite with:
prep(rec, force = TRUE)
## This function can operate in parallel thanks to future and furrr packages.
prep(rec, parallel = TRUE, workers = 2)
```

PrepRecipe-class

PrepRecipe-class object

Description

A PrepRecipe is Recipe with the results corresponding to the steps defined in the Recipe.

Value

PrepRecipe-class object

Slots

results Contains the results of all defined analysis in the Recipe.

bakes Contains the executed bakes.

prep_recipe 29

prep_recipe

Create a PrepRecipe.

Description

A PrepRecipe is Recipe with the results corresponding to the steps defined in the Recipe.

Usage

```
prep_recipe(rec, results, bakes)
```

Arguments

rec A Recipe object.
results list with the results
bakes list with saved bakes

Value

An object of class PrepRecipe.

rand_id

Make a random identification field for steps

Description

Make a random identification field for steps

Usage

```
rand_id(prefix = "step")
```

Arguments

prefix

A single character string

Value

A character string with the prefix and random letters separated by and underscore.

```
rand_id("step")
```

30 read_data

read_data

Loads Phyloseq data

Description

This function returns a validated Phyloseq object by loading it directly from a file with the .rds extension. Alternatively, this function can also take three text files as input that will be used to construct and validate the Phyloseq object: - Counts matrix with the otu_id in the first column. - Taxonomic annotation matrix with the otu_id in the first column. - Metadata annotation with sample_id in the first column.

Usage

```
read_data(data_path)
validate_otu(otu)
validate_sample_data(sample_data)
validate_tax_table(tax_table)
validate_phyloseq(phy, slots = c("sample_data", "tax_table"))
read_phyloseq(file_path)
read_file(file_path, ext = c(".txt|.csv|.tsv"))
```

Arguments

data_path List of length 1 or 3, with the paths of the input files.

Value

a phylseq-class object

```
# From a phyloseq object saved with .rds extension.
system.file("extdata", "metaHIV_phy.rds", package = "dar") |>
    read_data()

# From the three components of a phyloseq object saved as a plain text.
data_path <- c(
    system.file("extdata", "metaHIV_counts.txt", package = "dar"),
    system.file("extdata", "metaHIV_metadata.txt", package = "dar"),
    system.file("extdata", "metaHIV_taxas.txt", package = "dar"))
)
read_data(data_path)</pre>
```

recipe 31

rec	1	pe

Create a Recipe for preprocessing data

Description

A Recipe is a description of the steps to be applied to a data set in order to prepare it for data analysis.

Usage

```
recipe(
  microbiome_object = NULL,
  var_info = NULL,
  tax_info = NULL,
  steps = list()
)
```

Arguments

microbiome_object

Phyloseq-class object or TreeSummarizedExperiment-class object.

var_info A character string of column names corresponding to variables that will be used

in any context.

tax_info A character string of taxonomic levels that will be used in any context.

steps list with steps.

Value

An object of class Recipe with sub-objects:

phyloseq object of class phyloseq with taxa abundance information.

var_info A tibble that contains the current set of terms in the data set. This initially

defaults to the same data contained in var_info.

tax_info A tibble that contains the current set of taxonomic levels that will be used in the

analysis.

```
data(metaHIV_phy)

## Define recipe
rec <-
    recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Phylum") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.3 * length(x))") |>
    step_metagenomeseq(rm_zeros = 0.01) |>
    step_maaslin()
```

32 recipes_pkg_check

```
## Prep recipe
da_results <- prep(rec)</pre>
## Consensus strategy
n\_methods <- 2
da_results <- bake(da_results, count_cutoff = n_methods)</pre>
## Results
cool(da_results)
## You can also crate a recipe without var and tax info
rec <- recipe(metaHIV_phy)</pre>
rec
## And define them later
rec <- rec |>
  add_var("RiskGroup2") |>
  add_tax("Genus")
rec
## When trying to add an identical step to an existing one, the system
## returns an information message.
rec <- step_ancom(rec)</pre>
rec <- step_ancom(rec)</pre>
## The same with bake
da_results <- bake(da_results)</pre>
da_results <- bake(da_results)</pre>
```

recipes_pkg_check

Update packages

Description

This will check to see if all required packages are installed.

Usage

```
recipes_pkg_check(pkg = NULL, step_name, ...)
```

Arguments

pkg A character string for the package being checked step_name Name of the step.

... Extra arguments to pass to utils::install.packages()

required_deps 33

Value

Nothing is returned but a message is printed to the console about which packages (if any) should be installed along with code to do so.

required_deps

Returns required pakcages for Recipe object

Description

Returns required pakcages for Recipe object

Usage

```
required_deps(rec)
## S4 method for signature 'Recipe'
required_deps(rec)
```

Arguments

rec

A Recipe object

Value

character

```
data(test_rec)
## The function returns instructions to install any uninstalled dependencies
## needed to run the Recipe steps
dar:::required_deps(test_rec)
## The function also works with PrepRecipe-class objects
data(test_prep_rec)
dar:::required_deps(test_prep_rec)
```

34 step

sample_data

Extracts sample_data from phyloseq inside a Recipe

Description

Extracts sample_data from phyloseq inside a Recipe

Usage

```
sample_data(rec)
## S4 method for signature 'Recipe'
sample_data(rec)
```

Arguments

rec

A Recipe or Recipe step.

Value

A tibble

Examples

```
data(metaHIV_phy)

## Define recipe
rec <-
   recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")

## Extract sample_data from phyloseq object
sample_data(rec)</pre>
```

step

Overall Wrappers to Make New step_X or check_Y Objects

Description

step sets the class of the step and check is for checks.

```
step(subclass, ..., .prefix = "step_")
check(subclass, ..., .prefix = "check_")
```

steps_ids 35

Arguments

subclass A character string for the resulting class. For example, if subclass = "blah"

the step object that is returned has class step_blah or check_blah depending

on the context.

... All arguments to the operator that should be returned.

.prefix Prefix to the subclass created.

Value

An updated step or check with the new class.

steps_ids

Get step_ids from recipe

Description

Get step_ids from recipe

Usage

```
steps_ids(rec, type = "all")
```

Arguments

rec A Recipe object.

type character vector indicating the type class. Options c("all", "da", "prepro").

Value

character vector

```
data(test_rec)
## We can extract the step identifiers from a Recipe with `step_ids`
ids <- steps_ids(test_rec)
ids

## With the `type` parameter, extract the prepro and da steps separately.
da_ids <- steps_ids(test_rec, type = "da")
da_ids

prepro_ids <- steps_ids(test_rec, type = "prepro")
prepro_ids</pre>
```

36 step_aldex

step_aldex

ALDEx2 analysis

Description

A differential abundance analysis for the comparison of two or more conditions. For example, single-organism and meta-RNA-seq high-throughput sequencing assays, or of selected and unselected values from in-vitro sequence selections. Uses a Dirichlet-multinomial model to infer abundance from counts, that has been optimized for three or more experimental replicates. Infers sampling variation and calculates the expected false discovery rate given the biological and sampling variation using the Wilcox rank test or Welches t-test (aldex.ttest) or the glm and Kruskal Wallis tests (aldex.glm). Reports both P and fdr values calculated by the Benjamini Hochberg correction (Not supported in dar package).

```
step_aldex(
  rec,
 max_significance = 0.05,
 mc.samples = 128,
 denom = "all",
  rarefy = FALSE,
  id = rand_id("aldex")
)
## S4 method for signature 'Recipe'
step_aldex(
  rec.
 max_significance = 0.05,
 mc.samples = 128,
 denom = "all",
 rarefy = FALSE,
  id = rand_id("aldex")
)
## S4 method for signature 'PrepRecipe'
step_aldex(
  rec,
 max_significance = 0.05,
 mc.samples = 128,
 denom = "all",
  rarefy = FALSE,
  id = rand_id("aldex")
)
```

step_aldex 37

Arguments

rec

A Recipe object. The step will be added to the sequence of operations for this Recipe.

max_significance

Benjamini-Hochberg corrected P value of Welch's t test cutoff.

mc.samples

The number of Monte Carlo instances to use to estimate the underlying distributions; since we are estimating central tendencies, 128 is usually sufficient, but larger numbers may be .

denom

An any variable (all, iqlr, zero, lvha, median, user) indicating features to use as the denominator for the Geometric Mean calculation The default "all" uses the geometric mean abundance of all features. Using "median" returns the median abundance of all features. Using "iqlr" uses the features that are between the first and third quartile of the variance of the clr values across all samples. Using "zero" uses the non-zero features in each grop as the denominator. This approach is an extreme case where there are many nonzero features in one condition but many zeros in another. Using "lvha" uses features that have low variance (bottom quartile) and high relative abundance (top quartile in every sample). It is also possible to supply a vector of row indices to use as the denominator. Here, the experimentalist is determining a-priori which rows are thought to be invariant. In the case of RNA-seq, this could include ribosomal protein genes and and other house-keeping genes. This should be used with caution because the offsets may be different in the original data and in the data used by the function because features that are 0 in all samples are removed by aldex.clr.

rarefy

Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed without a set seed.

id

A character string that is unique to this step to identify it.

Details

The run_aldex function is a wrapper that performs log-ratio transformation and statistical testing in a single line of code. Specifically, this function: (a) generates Monte Carlo samples of the Dirichlet distribution for each sample, (b) converts each instance using a log-ratio transform, then (c) returns test results for two sample (Welch's t, Wilcoxon) test. This function also estimates effect size for two sample analyses.

Value

An object of class Recipe

See Also

Other Diff taxa steps: step_ancom(), step_corncob(), step_deseq(), step_lefse(), step_maaslin(), step_metagenomeseq(), step_wilcox()

Examples

```
data(metaHIV_phy)
## Init Recipe
rec <-
 recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
 step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
 step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.4 * length(x))")
rec
## Define ALDEX step with default parameters and prep
 step_aldex(rec) |>
 prep(parallel = FALSE)
rec
## Wearing rarefaction only for this step
rec <-
 recipe(metaHIV_phy, "RiskGroup2", "Species") |>
 step_aldex(rarefy = TRUE)
rec
```

step_ancom

ANCOM analysis

Description

Determine taxa whose absolute abundances, per unit volume, of the ecosystem (e.g., gut) are significantly different with changes in the covariate of interest (e.g., group). The current version of ancombc2 function implements Analysis of Compositions of Microbiomes with Bias Correction (ANCOM-BC2) in cross-sectional and repeated measurements data. In addition to the two-group comparison, ANCOM-BC2 also supports testing for continuous covariates and multi-group comparisons, including the global test, pairwise directional test, Dunnett's type of test, and trend test.

Usage

```
step_ancom(
  rec,
  fix_formula = get_var(rec)[[1]],
  rand_formula = NULL,
  p_adj_method = "holm",
  prv_cut = 0.1,
  lib_cut = 0,
  s0_perc = 0.05,
  group = NULL,
```

```
struc_zero = FALSE,
 neg_lb = FALSE,
  alpha = 0.05,
 n_cl = 1,
  verbose = FALSE,
 global = FALSE,
 pairwise = FALSE,
 dunnet = FALSE,
  trend = FALSE,
 rarefy = FALSE,
 id = rand_id("ancom")
)
## S4 method for signature 'Recipe'
step_ancom(
  rec,
  fix_formula = get_var(rec)[[1]],
  rand_formula = NULL,
 p_adj_method = "holm",
 prv_cut = 0.1,
 lib\_cut = 0,
  s0_perc = 0.05,
 group = NULL,
  struc_zero = FALSE,
 neg_lb = FALSE,
  alpha = 0.05,
 n_cl = 1,
  verbose = FALSE,
  global = FALSE,
 pairwise = FALSE,
 dunnet = FALSE,
  trend = FALSE,
  rarefy = FALSE,
  id = rand_id("ancom")
)
## S4 method for signature 'PrepRecipe'
step_ancom(
  rec,
 fix_formula = get_var(rec)[[1]],
  rand_formula = NULL,
 p_adj_method = "holm",
 prv_cut = 0.1,
 lib\_cut = 0,
  s0_perc = 0.05,
  group = NULL,
  struc_zero = FALSE,
  neg_1b = FALSE,
```

```
alpha = 0.05,
n_cl = 1,
verbose = FALSE,
global = FALSE,
pairwise = FALSE,
dunnet = FALSE,
trend = FALSE,
rarefy = FALSE,
id = rand_id("ancom")
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

fix_formula the character string expresses how the microbial absolute abundances for each

taxon depend on the fixed effects in metadata. When specifying the fix_formula, make sure to include the group variable in the formula if it is not NULL.

rand_formula the character string expresses how the microbial absolute abundances for each

taxon depend on the random effects in metadata. ANCOM-BC2 follows the lmerTest package in formulating the random effects. See ?lmerTest::lmer for

more details. Default is NULL.

p_adj_method character. method to adjust p-values. Default is "holm". Options include

"holm", "hochberg", "hommel", "bonferroni", "BH", "BY", "fdr", "none". See

?stats::p.adjust for more details.

prv_cut a numerical fraction between 0 and 1. Taxa with prevalences less than prv_cut

will be excluded in the analysis. For instance, suppose there are 100 samples, if a taxon has nonzero counts presented in less than 10 samples, it will not be

further analyzed. Default is 0.10.

lib_cut a numerical threshold for filtering samples based on library sizes. Samples with

library sizes less than lib cut will be excluded in the analysis. Default is 0, i.e.

do not discard any sample.

s0_perc a numerical fraction between 0 and 1. Inspired by Significance Analysis of

Microarrays (SAM) methodology, a small positive constant is added to the denominator of ANCOM-BC2 test statistic corresponding to each taxon to avoid the significance due to extremely small standard errors, especially for rare taxa. This small positive constant is chosen as s0_perc-th percentile of standard error

values for each fixed effect. Default is 0.05 (5th percentile).

group character. The name of the group variable in metadata. group should be discrete.

Specifying group is required for detecting structural zeros and performing multigroup comparisons (global test, pairwise directional test, Dunnett's type of test, and trend test). Default is NULL. If the group of interest contains only two

categories, leave it as NULL.

struc_zero logical. Whether to detect structural zeros based on group. Default is FALSE.

See Details for a more comprehensive discussion on structural zeros.

neg_lb logical. Whether to classify a taxon as a structural zero using its asymptotic

lower bound. Default is FALSE.

alpha numeric. Level of significance. Default is 0.05.

n_cl numeric. The number of nodes to be forked. For details, see ?parallel::makeCluster.

Default is 1 (no parallel computing).

verbose logical. Whether to generate verbose output during the ANCOM-BC2 fitting

process. Default is FALSE.

global logical. Whether to perform the global test. Default is FALSE.

pairwise logical. Whether to perform the pairwise directional test. Default is FALSE. dunnet logical. Whether to perform the Dunnett's type of test. Default is FALSE.

trend logical. Whether to perform trend test. Default is FALSE.

rarefy Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the

standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

id A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_corncob(), step_deseq(), step_lefse(), step_maaslin(), step_metagenomeseq(), step_wilcox()
```

```
data(metaHIV_phy)
## Init Recipe
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.4 * length(x))")

rec

## Define step with default parameters and prep
rec <-
    step_ancom(rec) |>
    prep(parallel = FALSE)

rec

## Wearing rarefaction only for this step
rec <-</pre>
```

42 step_corncob

```
recipe(metaHIV_phy, "RiskGroup2", "Species") |>
step_ancom(rarefy = TRUE)
rec
```

step_corncob

corncob analysis

Description

Corncob an individual taxon regression model that uses abundance tables and sample data. corncob is able to model differential abundance and differential variability, and addresses each of the challenges presented below:

Usage

```
step_corncob(
  rec,
  phi.formula = stats::formula(~1),
  formula_null = stats::formula(~1),
  phi.formula_null = stats::formula(~1),
  link = "logit",
  phi.link = "logit",
  test = "Wald",
 boot = FALSE,
 B = 1000,
  filter_discriminant = TRUE,
  fdr_cutoff = 0.05,
  fdr = "fdr",
  log2FC = 0,
  rarefy = FALSE,
  id = rand_id("corncob")
)
## S4 method for signature 'Recipe'
step_corncob(
  rec,
  phi.formula = stats::formula(~1),
  formula_null = stats::formula(~1),
  phi.formula_null = stats::formula(~1),
  link = "logit",
  phi.link = "logit",
  test = "Wald",
  boot = FALSE,
 B = 1000,
  filter_discriminant = TRUE,
  fdr_cutoff = 0.05,
```

step_corncob 43

```
fdr = "fdr",
  log2FC = 0,
  rarefy = FALSE,
  id = rand_id("corncob")
## S4 method for signature 'PrepRecipe'
step_corncob(
  rec,
  phi.formula = stats::formula(~1),
  formula_null = stats::formula(~1),
  phi.formula_null = stats::formula(~1),
  link = "logit",
  phi.link = "logit",
  test = "Wald",
  boot = FALSE,
  B = 1000,
  filter_discriminant = TRUE,
  fdr_cutoff = 0.05,
  fdr = "fdr",
  log2FC = 0,
 rarefy = FALSE,
  id = rand_id("corncob")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

phi.formula An object of class formula without the response: a symbolic description of the

model to be fitted to the dispersion.

formula_null Formula for mean under null, without response.

phi.formula_null

Formula for overdispersion under null, without response.

link Link function for abundance covariates, defaults to "logit".

phi.link Link function for dispersion covariates, defaults to "logit".

test Character. Hypothesis testing procedure to use. One of "Wald" or "LRT" (like-

lihood ratio test).

boot Boolean. Defaults to FALSE. Indicator of whether or not to use parametric

bootstrap algorithm. (See pbWald and pbLRT).

B Optional integer. Number of bootstrap iterations. Ignored if boot is FALSE.

Otherwise, defaults to 1000.

filter_discriminant

Boolean. Defaults to TRUE. If FALSE, discriminant taxa will not be filtered

out.

fdr_cutoff Integer. Defaults to 0.05. Desired type 1 error rate.

44 step_corncob

fdr Character. Defaults to "fdr". False discovery rate control method, see p.adjust

for more options.

log2FC cutoff.

rarefy Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the

standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

id A character string that is unique to this step to identify it.

Details

· different sequencing depth

- · excessive zeros from unobserved taxa
- high variability of empirical relative abundances (overdispersion)
- · within-taxon correlation
- hypothesis testing with categorical and continuous covariates

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_ancom(), step_deseq(), step_lefse(), step_maaslin(), step_metagenomeseq(), step_wilcox()
```

```
data(metaHIV_phy)

## Init Recipe
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.3 * length(x))")

rec

## Define step with default parameters and prep
rec <-
    step_corncob(rec) |>
    prep(parallel = FALSE)
```

step_deseq 45

step_deseq

DESeq2 analysis

Description

Differential expression analysis based on the Negative Binomial (a.k.a. Gamma-Poisson) distribution. This function performs a default analysis through the steps: 1) estimation of size factors: estimateSizeFactors. 2) estimation of dispersion: estimateDispersions. 3) Negative Binomial GLM fitting and Wald statistics: nbinomWaldTest. For complete details on each step, see the manual pages of the respective functions. After the DESeq function returns a DESeqDataSet object, results tables (log2 fold changes and p-values) can be generated using the results function. Shrunken LFC can then be generated using the lfcShrink function.

Usage

```
step_deseq(
  rec,
  test = "Wald",
  fitType = "local",
  betaPrior = FALSE,
  type = "ashr",
  max\_significance = 0.05,
  log2FC = 0,
  rarefy = FALSE,
  id = rand_id("deseq")
)
## S4 method for signature 'Recipe'
step_deseq(
  rec,
  test = "Wald",
  fitType = "local",
  betaPrior = FALSE,
  type = "ashr",
 max_significance = 0.05,
 log2FC = 0,
  rarefy = FALSE,
  id = rand_id("deseq")
)
## S4 method for signature 'PrepRecipe'
step_deseq(
  rec,
  test = "Wald",
  fitType = "local",
  betaPrior = FALSE,
  type = "ashr",
```

46 step_deseq

```
max_significance = 0.05,
log2FC = 0,
rarefy = FALSE,
id = rand_id("deseq")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

test Either "Wald" or "LRT", which will then use either Wald significance tests (de-

fined by nbinomWaldTest), or the likelihood ratio test on the difference in deviance between a full and reduced model formula (defined by nbinomLRT).

fitType either "parametric", "local", "mean", or "glmGamPoi" for the type of fitting of

dispersions to the mean intensity. See estimateDispersions for description.

betaPrior whether or not to put a zero-mean normal prior on the non-intercept coefficients

See nbinomWaldTest for description of the calculation of the beta prior. In versions >=1.16, the default is set to FALSE, and shrunken LFCs are obtained af-

terwards using lfcShrink.

type "apeglm" is the adaptive Student's t prior shrinkage estimator from the 'apeglm'

package; "ashr" is the adaptive shrinkage estimator from the 'ashr' package, using a fitted mixture of normals prior - see the Stephens (2016) reference below for citation; "normal" is the 2014 DESeq2 shrinkage estimator using a Normal

prior.

max_significance

The q-value threshold for significance.

log2FC cutoff.

rarefy Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the

standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

id A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_ancom(), step_corncob(), step_lefse(), step_maaslin(), step_metagenomeseq(), step_wilcox()
```

Examples

```
data(metaHIV_phy)

## Init Recipe
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.4 * length(x))")

rec

## Define step with default parameters and prep
rec <-
    step_deseq(rec) |>
    prep(parallel = FALSE)

rec

## Wearing rarefaction only for this step
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Species") |>
    step_deseq(rarefy = TRUE)
```

step_filter_by_abundance

Filter taxa by abundance

Description

This is a convenience wrapper around the filter_taxa function. It is intended to speed up filtering complex experimental objects with one function call. In the case of filter_by_abundance, the filtering will be based on the relative abundance of each taxon. The taxa retained in the dataset are those where the sum of their abundance is greater than the product of the total abundance and the provided threshold.

Usage

```
step_filter_by_abundance(
   rec,
   threshold = 0.01,
   id = rand_id("filter_by_abundance")
)
## S4 method for signature 'Recipe'
step_filter_by_abundance(
   rec,
```

```
threshold = 0.01,
  id = rand_id("filter_by_abundance")
)

## S4 method for signature 'PrepRecipe'
step_filter_by_abundance(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_abundance")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

threshold The relative abundance threshold for filtering taxa, expressed as a proportion of

the total abundance. For example, a threshold of 0.01 means that a taxon must make up at least 1% of the total abundance to be retained. The default value is

0.01.

id A character string that is unique to this step to identify it.

Details

The function calculates the total abundance of all taxa in the phyloseq object. It then compares this total abundance to the abundance of each individual taxon. If a taxon's abundance is less than the threshold times the total abundance, that taxon is removed from the phyloseq object.

Value

A Recipe object that has been filtered based on abundance.

Note

This function modifies rec in place, you might want to make a copy of rec before modifying it if you need to preserve the original object.

See Also

```
filter_taxa
Other filter phy steps: step_filter_by_prevalence(), step_filter_by_rarity(), step_filter_by_variance(),
step_filter_taxa()
```

```
data(metaHIV_phy)
## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Phylum")
rec</pre>
```

```
## Define filter_by_abundance step with default parameters
rec <- step_filter_by_abundance(rec, threshold = 0.01)
rec</pre>
```

```
step_filter_by_prevalence
```

Filter taxa by prevalence

Description

This is a convenience function around the filter_taxa function. It is designed to speed up filtering complex experimental objects with one function call. In the case of run_filter_by_prevalence, the filtering will be based on the prevalence of each taxon. The taxa retained in the dataset are those where the prevalence is greater than the provided threshold.

Usage

```
step_filter_by_prevalence(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_prevalence")
)
## S4 method for signature 'Recipe'
step_filter_by_prevalence(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_prevalence")
)
## S4 method for signature 'PrepRecipe'
step_filter_by_prevalence(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_prevalence")
)
```

Arguments

rec	A Recipe object. The step will be added to the sequence of operations for this Recipe.
threshold	The prevalence threshold for filtering taxa, expressed as a proportion of the total number of samples. For example, a threshold of 0.01 means that a taxon must be present in at least 1% of the samples to be retained. The default value is 0.01.
id	A character string that is unique to this step to identify it.

Details

The function calculates the prevalence of all taxa in the phyloseq object as the proportion of samples in which they are present. It then compares this prevalence to the threshold. If a taxon's prevalence is less than the threshold, that taxon is removed from the phyloseq object.

Value

A Recipe object that has been filtered based on prevalence.

Note

This function modifies rec in place, you might want to make a copy of rec before modifying it if you need to preserve the original object.

See Also

```
filter_taxa
Other filter phy steps: step_filter_by_abundance(), step_filter_by_rarity(), step_filter_by_variance(),
step_filter_taxa()
```

Examples

```
data(metaHIV_phy)

## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Phylum")
rec

## Define step_filter_by_prevalence step with default parameters
rec <- step_filter_by_prevalence(rec, threshold = 0.01)
rec</pre>
```

```
step_filter_by_rarity Filter taxa by rarity
```

Description

This is a convenience function around the filter_taxa function. It is designed to speed up filtering complex experimental objects with one function call. In the case of run_filter_by_rarity, the filtering will be based on the rarity of each taxon. The taxa retained in the dataset are those where the sum of their rarity is less than the provided threshold.

step_filter_by_rarity 51

Usage

```
step_filter_by_rarity(rec, threshold = 0.01, id = rand_id("filter_by_rarity"))
## S4 method for signature 'Recipe'
step_filter_by_rarity(rec, threshold = 0.01, id = rand_id("filter_by_rarity"))
## S4 method for signature 'PrepRecipe'
step_filter_by_rarity(rec, threshold = 0.01, id = rand_id("filter_by_rarity"))
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

threshold The rarity threshold for filtering taxa, expressed as a proportion of the total

number of samples. For example, a threshold of 0.01 means that a taxon must be present in less than 1% of the samples to be retained. The default value is

0.01.

id A character string that is unique to this step to identify it.

Details

The function calculates the rarity of all taxa in the phyloseq object as the proportion of samples in which they are present. It then compares this rarity to the threshold. If a taxon's rarity is greater than the threshold, that taxon is removed from the phyloseq object.

Value

A Recipe object that has been filtered based on rarity.

Note

This function modifies rec in place, you might want to make a copy of rec before modifying it if you need to preserve the original object.

See Also

```
filter_taxa
Other filter phy steps: step_filter_by_abundance(), step_filter_by_prevalence(), step_filter_by_variance(),
step_filter_taxa()
```

```
data(metaHIV_phy)
## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Phylum")
rec
## Define step_filter_by_rarity step with default parameters</pre>
```

```
rec <- step_filter_by_rarity(rec, threshold = 0.01)
rec</pre>
```

```
step_filter_by_variance
```

Filter taxa by variance

Description

This is a convenience function around the filter_taxa function. It is designed to speed up filtering complex experimental objects with one function call. In the case of run_filter_by_variance, the filtering will be based on the variance of each taxon. The taxa retained in the dataset are those where the variance of their abundance is greater than the provided threshold.

Usage

```
step_filter_by_variance(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_variance")
)
## S4 method for signature 'Recipe'
step_filter_by_variance(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_variance")
)
## S4 method for signature 'PrepRecipe'
step_filter_by_variance(
  rec,
  threshold = 0.01,
  id = rand_id("filter_by_variance")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this Recipe.

threshold The variance threshold for filtering taxa. The default value is 0.01.

id A character string that is unique to this step to identify it.

Details

The function calculates the variance of all taxa in the phyloseq object. It then compares this variance to the variance of each individual taxon. If a taxon's variance is less than the threshold, that taxon is removed from the phyloseq object.

step_filter_taxa 53

Value

A Recipe object that has been filtered based on variance.

Note

This function modifies rec in place, you might want to make a copy of rec before modifying it if you need to preserve the original object.

See Also

```
filter_taxa
Other filter phy steps: step_filter_by_abundance(), step_filter_by_prevalence(), step_filter_by_rarity(),
step_filter_taxa()
```

Examples

```
data(metaHIV_phy)
## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Phylum")
rec

## Define step_filter_by_variance step with default parameters
rec <- step_filter_by_variance(rec, threshold = 0.01)
rec</pre>
```

step_filter_taxa

Filter taxa based on across-sample OTU abundance criteria

Description

This function is directly analogous to the genefilter function for microarray filtering, but is used for filtering OTUs from phyloseq objects. It applies an arbitrary set of functions — as a function list, for instance, created by filterfun — as across-sample criteria, one OTU at a time. It takes as input a phyloseq object, and returns a logical vector indicating whether or not each OTU passed the criteria. Alternatively, if the "prune" option is set to FALSE, it returns the already-trimmed version of the phyloseq object.

Usage

```
step_filter_taxa(rec, .f, id = rand_id("filter_taxa"))
## S4 method for signature 'Recipe'
step_filter_taxa(rec, .f, id = rand_id("filter_taxa"))
```

54 step_lefse

Arguments

rec	A Recipe object. The step will be added to the sequence of operations for this Recipe.
.f	A function or list of functions that take a vector of abundance values and return a logical. Some canned useful function types are included in the genefilter-package.
id	A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other filter phy steps: step_filter_by_abundance(), step_filter_by_prevalence(), step_filter_by_rarity(), step_filter_by_variance()
```

Examples

```
data(metaHIV_phy)
## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Phylum")
rec

## Define filter taxa step with default parameters
rec <-
   step_filter_taxa(rec, .f = "function(x) sum(x > 0) >= (0.03 * length(x))")
rec
```

step_lefse

lefse analysis

Description

Lefser is metagenomic biomarker discovery tool that is based on LEfSe tool and is published by Huttenhower et al. 2011. Lefser is the R implementation of the LEfSe method. Using statistical analyses, lefser compares microbial populations of healthy and diseased subjects to discover differencially expressed microorganisms. Lefser than computes effect size, which estimates magnitude of differential expression between the populations for each differentially expressed microorganism. Subclasses of classes can also be assigned and used within the analysis.

step_lefse 55

Usage

```
step_lefse(
  rec,
  kruskal.threshold = 0.05,
 wilcox.threshold = 0.05,
 lda.threshold = 2,
 blockCol = NULL,
  assay = 1L,
  trim.names = FALSE,
  rarefy = TRUE,
  id = rand_id("lefse")
)
## S4 method for signature 'Recipe'
step_lefse(
  rec,
  kruskal.threshold = 0.05,
 wilcox.threshold = 0.05,
  lda.threshold = 2,
 blockCol = NULL,
  assay = 1L,
  trim.names = FALSE,
  rarefy = TRUE,
 id = rand_id("lefse")
)
## S4 method for signature 'PrepRecipe'
step_lefse(
  rec,
  kruskal.threshold = 0.05,
 wilcox.threshold = 0.05,
  lda.threshold = 2,
 blockCol = NULL,
  assay = 1L,
  trim.names = FALSE,
 rarefy = TRUE,
  id = rand_id("lefse")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this Recipe.

kruskal.threshold

numeric(1) The p-value for the Kruskal-Wallis Rank Sum Test (default 0.05).

wilcox.threshold

numeric(1) The p-value for the Wilcoxon Rank-Sum Test when 'blockCol' is present (default 0.05).

56 step_lefse

lda. threshold numeric(1) The effect size threshold (default 2.0).

blockCol character(1) Optional column name in 'colData(expr)' indicating the blocks,

usually a factor with two levels (e.g., 'c("adult", "senior")'; default NULL).

assay The i-th assay matrix in the 'SummarizedExperiment' ('expr'; default 1).

trim.names If 'TRUE' extracts the most specific taxonomic rank of organism.

rarefy Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the

standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

id A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_ancom(), step_corncob(), step_deseq(), step_maaslin(), step_metagenomeseq(), step_wilcox()
```

```
data(metaHIV_phy)

## Init Recipe
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.3 * length(x))")

rec

## Define step with default parameters
rec <- step_lefse(rec)
rec

## Running lefse without rarefaction (not recommended)
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Species") |>
    step_lefse(rarefy = FALSE)

rec
```

step_maaslin 57

step_maaslin

MaAsLin2 analysis

Description

MaAsLin2 finds associations between microbiome meta-omics features and complex metadata in population-scale epidemiological studies. The software includes multiple analysis methods (including support for multiple covariates and repeated measures), filtering, normalization, and transform options to customize analysis for your specific study.

Usage

```
step_maaslin(
  rec,
 min_abundance = 0,
 min_prevalence = 0.1,
 min_variance = 0,
  normalization = "TSS",
  transform = "LOG",
  analysis_method = "LM",
 max_significance = 0.25,
  random_effects = NULL,
  correction = "BH",
  standardize = TRUE,
  reference = NULL,
  rarefy = FALSE,
  id = rand_id("maaslin")
)
## S4 method for signature 'Recipe'
step_maaslin(
  rec,
 min_abundance = 0,
 min_prevalence = 0.1,
 min_variance = 0,
  normalization = "TSS",
  transform = "LOG",
  analysis_method = "LM",
 max_significance = 0.25,
  random_effects = NULL,
  correction = "BH",
  standardize = TRUE,
  reference = NULL,
  rarefy = FALSE,
  id = rand_id("maaslin")
)
```

58 step_maaslin

```
## S4 method for signature 'PrepRecipe'
step_maaslin(
  rec,
 min_abundance = 0,
 min_prevalence = 0.1,
 min_variance = 0,
  normalization = "TSS",
  transform = "LOG",
  analysis_method = "LM".
 max_significance = 0.25,
  random_effects = NULL,
  correction = "BH",
  standardize = TRUE,
  reference = NULL,
  rarefy = FALSE,
  id = rand_id("maaslin")
)
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

min_abundance The minimum abundance for each feature.

min_prevalence The minimum percent of samples for which a feature is detected at minimum

abundance.

min_variance Keep features with variance greater than.

normalization The normalization method to apply. Default: "TSS". Choices: "TSS", "CLR",

"CSS", "NONE", "TMM".

transform The transform to apply. Default: "LOG". Choices: "LOG", "LOGIT", "AST",

"NONE".

analysis_method

The analysis method to apply. Default: "LM". Choices: "LM", "CPLM",

"ZICP", "NEGBIN", "ZINB".

max_significance

The q-value threshold for significance.

random_effects The random effects for the model, comma-delimited for multiple effects.

correction The correction method for computing the q-value.

standardize Apply z-score so continuous metadata are on the same scale.

reference The factor to use as a reference for a variable with more than two levels provided

as a string of 'variable, reference' semi-colon delimited for multiple variables.

rarefy Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the

standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

step_metagenomeseq 59

id

A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_ancom(), step_corncob(), step_deseq(), step_lefse(), step_metagenomeseq(), step_wilcox()
```

Examples

```
data(metaHIV_phy)
## Init Recipe
rec <-
 recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
 step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
 step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.4 * length(x))")
rec
## Define step with default parameters and prep
 step_maaslin(rec) |>
 prep(parallel = FALSE)
rec
## Wearing rarefaction only for this step
rec <-
 recipe(metaHIV_phy, "RiskGroup2", "Species") |>
 step_maaslin(rarefy = TRUE)
rec
```

step_metagenomeseq

MetagenomeSeq analysis

Description

metagenomeSeq is designed to determine features (be it Operational Taxanomic Unit (OTU), species, etc.) that are differentially abundant between two or more groups of multiple samples. metagenome-Seq is designed to address the effects of both normalization and under-sampling of microbial communities on disease association detection and the testing of feature correlations.

step_metagenomeseq

Usage

```
step_metagenomeseq(
  rec,
  zeroMod = NULL,
 useCSSoffset = TRUE,
 useMixedModel = FALSE,
 max_significance = 0.05,
 log2FC = 0,
  rarefy = FALSE,
 rm_zeros = 0,
  id = rand_id("metagenomeseq")
)
## S4 method for signature 'Recipe'
step_metagenomeseq(
  rec,
  zeroMod = NULL,
  useCSSoffset = TRUE,
  useMixedModel = FALSE,
 max_significance = 0.05,
 log2FC = 0,
  rarefy = FALSE,
 rm_zeros = 0,
 id = rand_id("metagenomeseq")
)
## S4 method for signature 'PrepRecipe'
step_metagenomeseq(
  rec,
  zeroMod = NULL,
 useCSSoffset = TRUE,
  useMixedModel = FALSE,
 max_significance = 0.05,
  log2FC = 0,
  rarefy = FALSE,
 rm\_zeros = 0,
  id = rand_id("metagenomeseq")
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

zeroMod The zero model, the model to account for the change in the number of OTUs

observed as a linear effect of the depth of coverage.

useCSSoffset Boolean, whether to include the default scaling parameters in the model or not.

useMixedModel Estimate the correlation between duplicate features or replicates using dupli-

cateCorrelation.

step_metagenomeseq 61

max_significance

The q-value threshold for significance.

log2FC cutoff.

rarefy Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the

standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

rm_zeros Proportion of samples of the same categorical level with more than 0 counts.

id A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_ancom(), step_corncob(), step_deseq(), step_lefse(), step_maaslin(), step_wilcox()
```

```
data(metaHIV_phy)
## Init Recipe
rec <-
 recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
 step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
 step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.02 * length(x))")
rec
## Define step with default parameters and prep
 step_metagenomeseq(rec, rm_zeros = 0.01) |>
 prep(parallel = FALSE)
rec
## Wearing rarefaction only for this step
rec <-
 recipe(metaHIV_phy, "RiskGroup2", "Species") |>
 step_metagenomeseq(rarefy = TRUE)
rec
```

62 step_rarefaction

step_rarefaction	Resample an OTU table such that all samples have the same library size.
------------------	---

Description

Please note that the authors of phyloseq do not advocate using this as a normalization procedure, despite its recent popularity. Our justifications for using alternative approaches to address disparities in library sizes have been made available as an article in PLoS Computational Biology. See phyloseq_to_deseq2 for a recommended alternative to rarefying directly supported in the phyloseq package, as well as the supplemental materials for the PLoS-CB article and the phyloseq extensions repository on GitHub. Nevertheless, for comparison and demonstration, the rarefying procedure is implemented here in good faith and with options we hope are useful. This function uses the standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. This kind of resampling can be performed with and without replacement, with replacement being the more computationally-efficient, default setting. See the replace parameter documentation for more details. We recommended that you explicitly select a random number generator seed before invoking this function, or, alternatively, that you explicitly provide a single positive integer argument as rngseed.

Usage

```
step_rarefaction(rec, id = rand_id("rarefaction"))
## S4 method for signature 'Recipe'
step_rarefaction(rec, id = rand_id("rarefaction"))
## S4 method for signature 'PrepRecipe'
step_rarefaction(rec, id = rand_id("rarefaction"))
```

Arguments

rec A Recipe object. The step will be added to the sequence of operations for this

Recipe.

id A character string that is unique to this step to identify it.

Value

An object of class Recipe

```
data(metaHIV_phy)
## Init Recipe
```

step_subset_taxa 63

```
rec <-
  recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Phylum") |>
  step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
  step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.03 * length(x))")

rec

## Define step with default parameters and prep
rec <- step_rarefaction(rec)

rec</pre>
```

step_subset_taxa

Subset taxa by taxonomic level

Description

This is a convenience function around the subset_taxa function from the phyloseq package. It is designed to speed up subsetting complex experimental objects with one function call. In the case of run_subset_taxa, the subsetting will be based on the taxonomic level of each taxon. The taxa retained in the dataset are those where the taxonomic level matches the provided taxa.

Usage

```
step_subset_taxa(rec, tax_level, taxa, id = rand_id("subset_taxa"))
## S4 method for signature 'Recipe'
step_subset_taxa(rec, tax_level, taxa, id = rand_id("subset_taxa"))
## S4 method for signature 'PrepRecipe'
step_subset_taxa(rec, tax_level, taxa, id = rand_id("subset_taxa"))
```

Arguments

rec	A Recipe object. The step will be added to the sequence of operations for this Recipe.
tax_level	The taxonomic level for subsetting taxa.
taxa	The taxa to be retained in the dataset.
id	A character string that is unique to this step to identify it.

Details

The function subsets the taxa in the phyloseq object based on the provided taxonomic level and taxa. Only the taxa that match the provided taxa at the given taxonomic level are retained in the phyloseq object.

step_to_expr

Value

A Recipe object that has been subsetted based on taxonomic level.

Note

This function modifies rec in place, you might want to make a copy of rec before modifying it if you need to preserve the original object.

See Also

```
subset_taxa
```

Examples

```
data(metaHIV_phy)

## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Species")
rec

## Define step_subset_taxa step with default parameters
rec <- step_subset_taxa(
   rec,
   tax_level = "Kingdom",
   taxa = c("Bacteria", "Archaea")
)
rec</pre>
```

step_to_expr

Extracts parameters from steps and makes a character vector with the expression to evaluate

Description

Extracts parameters from steps and makes a character vector with the expression to evaluate

Usage

```
step_to_expr(step)
```

Arguments

step

object of class step

Value

character vector

step_wilcox 65

step_wilcox

Wilcox analysis

Description

Performs a wilcox test to determine features (be it Operational Taxanomic Unit (OTU), species, etc.) that are differentially abundant between two or more groups of multiple samples.

Usage

```
step_wilcox(
  rec.
  norm_method = "compositional",
 max_significance = 0.05,
 p_adj_method = "BH",
 rarefy = FALSE,
  id = rand_id("wilcox")
)
## S4 method for signature 'Recipe'
step_wilcox(
  rec,
  norm_method = "compositional",
 max_significance = 0.05,
 p_adj_method = "BH",
  rarefy = FALSE,
  id = rand_id("wilcox")
)
## S4 method for signature 'PrepRecipe'
step_wilcox(
  rec,
  norm_method = "compositional",
 max_significance = 0.05,
 p_adj_method = "BH",
 rarefy = FALSE,
  id = rand_id("wilcox")
)
```

Arguments

rec

A Recipe object. The step will be added to the sequence of operations for this Recipe.

norm_method

Transformation to apply. The options include: 'compositional' (ie relative abundance), 'Z', 'log10', 'log10p', 'hellinger', 'identity', 'clr', 'alr', or any method from the vegan::decostand function.

step_wilcox

max_significance

The q-value threshold for significance.

p_adj_method

Character. Specifying the method to adjust p-values for multiple comparisons. Default is "BH" (Benjamini-Hochberg procedure).

rarefy

Boolean indicating if OTU counts must be rarefyed. This rarefaction uses the standard R sample function to resample from the abundance values in the otu_table component of the first argument, physeq. Often one of the major goals of this procedure is to achieve parity in total number of counts between samples, as an alternative to other formal normalization procedures, which is why a single value for the sample.size is expected. If 'no_seed', rarefaction is performed

without a set seed.

id

A character string that is unique to this step to identify it.

Value

An object of class Recipe

See Also

```
Other Diff taxa steps: step_aldex(), step_ancom(), step_corncob(), step_deseq(), step_lefse(), step_maaslin(), step_metagenomeseq()
```

```
data(metaHIV_phy)

## Init Recipe
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Phylum") |>
    step_subset_taxa(tax_level = "Kingdom", taxa = c("Bacteria", "Archaea")) |>
    step_filter_taxa(.f = "function(x) sum(x > 0) >= (0.4 * length(x))")

rec

## Define step with default parameters and prep
rec <-
    step_wilcox(rec) |>
    prep(parallel = FALSE)

rec

## Wearing rarefaction only for this step
rec <-
    recipe(metaHIV_phy, "RiskGroup2", "Species") |>
    step_wilcox(rarefy = TRUE)
```

tax_table 67

tax_table

Extracts tax_table from phyloseq inside a Recipe

Description

Extracts tax_table from phyloseq inside a Recipe

Usage

```
tax_table(rec)
## S4 method for signature 'Recipe'
tax_table(rec)
```

Arguments

rec

A Recipe or Recipe step.

Value

A tibble

Examples

```
data(metaHIV_phy)

## Define recipe
rec <-
   recipe(metaHIV_phy, var_info = "RiskGroup2", tax_info = "Species")

## Extract tax_table from phyloseq object
tax_table(rec)</pre>
```

test_prep_rec

PrepRecipe for metaHIV_phy data

Description

A Recipe created for a metaHIV_phy object uning "Riskgroup2" as a var_info and "Genus" as a tax_info. Also includes step_deseq, step_maaslin and step_metagenomeSeq.

Usage

```
data("test_prep_rec")
```

Format

A PrepRecipe object.

68 tidyeval

test_rec

Recipe for metaHIV_phy data

Description

A Recipe created for a metaHIV_phy object uning "Riskgroup2" as a var_info and "Genus" as a tax_info.

Usage

```
data("test_rec")
```

Format

A Recipe object.

tidyeval

Tidy eval helpers

Description

This page lists the tidy eval tools reexported in this package from rlang. To learn about using tidy eval in scripts and packages at a high level, see the dplyr programming vignette and the ggplot2 in packages vignette. The Metaprogramming section of Advanced R may also be useful for a deeper dive.

• The tidy eval operators {{,!!, and !!! are syntactic constructs which are specially interpreted by tidy eval functions. You will mostly need {{, as !! and !!! are more advanced operators which you should not have to use in simple cases.

The curly-curly operator {{ allows you to tunnel data-variables passed from function arguments inside other tidy eval functions. {{ is designed for individual arguments. To pass multiple arguments contained in dots, use . . . in the normal way.

```
my_function <- function(data, var, ...) {
  data %>%
    group_by(...) %>%
    summarise(mean = mean({{ var }}))
}
```

• enquo() and enquos() delay the execution of one or several function arguments. The former returns a single expression, the latter returns a list of expressions. Once defused, expressions will no longer evaluate on their own. They must be injected back into an evaluation context with !! (for a single expression) and !!! (for a list of expressions).

tidyeval 69

```
my_function <- function(data, var, ...) {
    # Defuse
    var <- enquo(var)
    dots <- enquos(...)

# Inject
    data %>%
        group_by(!!!dots) %>%
        summarise(mean = mean(!!var))
}
```

In this simple case, the code is equivalent to the usage of {{ and ... above. Defusing with enquo() or enquos() is only needed in more complex cases, for instance if you need to inspect or modify the expressions in some way.

• The .data pronoun is an object that represents the current slice of data. If you have a variable name in a string, use the .data pronoun to subset that variable with [[.

```
my_var <- "disp"
mtcars %>% summarise(mean = mean(.data[[my_var]]))
```

• Another tidy eval operator is :=. It makes it possible to use glue and curly-curly syntax on the LHS of =. For technical reasons, the R language doesn't support complex expressions on the left of =, so we use := as a workaround.

```
my_function <- function(data, var, suffix = "foo") {
    # Use `{{` to tunnel function arguments and the usual glue
    # operator `{` to interpolate plain strings.
    data %>%
        summarise("{{ var }}_mean_{suffix}" := mean({{ var }}))
}
```

• Many tidy eval functions like dplyr::mutate() or dplyr::summarise() give an automatic name to unnamed inputs. If you need to create the same sort of automatic names by yourself, use as_label(). For instance, the glue-tunnelling syntax above can be reproduced manually with:

```
my_function <- function(data, var, suffix = "foo") {
  var <- enquo(var)
  prefix <- as_label(var)
  data %>%
    summarise("{prefix}_mean_{suffix}" := mean(!!var))
}
```

Expressions defused with enquo() (or tunnelled with {{}) need not be simple column names, they can be arbitrarily complex. as_label() handles those cases gracefully. If your code assumes a simple column name, use as_name() instead. This is safer because it throws an error if the input is not a name as expected.

Value

The function does not return a value explicitly.

70 to_tibble

Examples

```
# `enquo()` defuses the expression supplied by your user
f <- function(arg) {</pre>
  rlang::enquo(arg)
}
f(1 + 1)
# `enquos()` works with arguments and dots. It returns a list of
# expressions
f <- function(...) {</pre>
  rlang::enquos(...)
f(1 + 1, 2 * 10)
# Let's create some symbols:
foo <- quote(foo)</pre>
bar <- rlang::sym("bar")</pre>
# as_name() converts symbols to strings:
foo
rlang::as_name(foo)
typeof(bar)
typeof(rlang::as_name(bar))
# as_name() unwraps quosured symbols automatically:
rlang::as_name(rlang::quo(foo))
# as_label() is useful with quoted expressions:
rlang::as_label(rlang::expr(foo(bar)))
rlang::as_label(rlang::expr(foobar))
# It works with any R object. This is also useful for quoted
# arguments because the user might unquote constant objects:
rlang::as_label(1:3)
rlang::as_label(base::list)
```

to_tibble

Wrapper to convert phyloseq slots to tibble

Description

Wrapper to convert phyloseq slots to tibble

use_rarefy 71

Usage

```
to_tibble(df, id_name = "otu_id")
```

Arguments

df output of otu_table(), sample_data() or tax_table() phyloseq functions.

id_name Name of the new column generated from rownames

Value

tibble

Examples

```
data(test_rec)
otu_table <-
  get_phy(test_rec) |>
  phyloseq::otu_table()

dar:::to_tibble(otu_table)
```

use_rarefy

Perform Rarefaction on Phyloseq Object

Description

This function performs rarefaction on a phyloseq object if the rarefy parameter is set to TRUE. Rarefaction is a process that randomly subsamples the data to a specified depth. This is done to account for differences in sequencing depth between samples. However, this process is not without controversy. Rarefaction can lead to loss of information and can also lead to false positives in differential abundance testing. For more information, see https://microbiomejournal.biomedcentral.com/articles/10.1186/s40168-019-0650-2

Usage

```
use_rarefy(phy, rarefy)
```

Arguments

phy A phyloseq object.

rarefy A logical value indicating whether to perform rarefaction. If 'no_seed', rarefac-

tion is performed without a set seed. If FALSE, no rarefaction is performed.

Value

A phyloseq object after rarefaction if rarefy is TRUE or "no_seed", otherwise the original phyloseq object is returned.

72 zero_otu

Examples

```
data(metaHIV_phy)
## With seed
# phy_rarefied <- dar:::use_rarefy(metaHIV_phy, TRUE)
## Witout seed
# phy_rarefied <- dar:::use_rarefy(metaHIV_phy, "no_seed")</pre>
```

zero_otu

Extract outs with all 0 values in at least on level of the variable

Description

Extract outs with all 0 values in at least on level of the variable

Usage

```
zero_otu(obj, var = NULL, pct_cutoff = 0)
## S4 method for signature 'Recipe'
zero_otu(obj, var = NULL, pct_cutoff = 0)
## S4 method for signature 'phyloseq'
zero_otu(obj, var = NULL, pct_cutoff = 0)
```

Arguments

obj A Recipe or phyloseq object.

var Variable of interest. Must be present in the metadata.

pct_cutoff Minimum of pct counts samples with counts for each taxa.

Value

character vector

```
data(metaHIV_phy)
## Init Recipe
rec <- recipe(metaHIV_phy, "RiskGroup2", "Species")
## Extract outs with all 0 values
zero_otu(rec)</pre>
```

%>%

%>% Pipe operator

Description

Pipe operator

Value

The result of calling rhs(lhs).

Index

* Bake steps	step_subset_taxa, 63	
bake, 8	.data(tidyeval), 68	
* Diff taxa steps	.env (tidyeval), 68	
step_aldex, 36	:=(tidyeval), 68	
step_ancom, 38	% > %, 73	
step_corncob, 42		
step_deseq, 45	abundance_plt, 4	
step_lefse, 54	abundance_plt,PrepRecipe-method	
step_maaslin,57	(abundance_plt), 4	
step_metagenomeseq, 59	abundance_plt,Recipe-method	
step_wilcox, 65	(abundance_plt), 4	
* datasets	add_step, 6	
metaHIV_phy, 21	$add_step, PrepRecipe-method(add_step), 6$	
test_prep_rec, 67	<pre>add_step,Recipe-method(add_step), 6</pre>	
test_rec, 68	add_tax, 6	
* filter phy steps	<pre>add_tax,PrepRecipe-method(add_tax),6</pre>	
step_filter_by_abundance, 47	add_{tax} , Recipe-method (add_tax), 6	
step_filter_by_prevalence, 49	add_var, 7	
step_filter_by_rarity,50	add_var,PrepRecipe-method(add_var),7	
step_filter_by_variance, 52	add_var,Recipe-method(add_var),7	
step_filter_taxa, 53	as_label(tidyeval),68	
* internal	as_name(tidyeval),68	
%>%, 7 3	halta 0	
add_step, 6	bake, 8	
dar-package, 4	bake, PrepRecipe-method (bake), 8	
<pre>get_comparisons, 15</pre>	bake, Recipe-method (bake), 8	
pastry_df, 25	check (step), 34	
prep_recipe, 29	contains_rarefaction, 10	
read_data, 30	cool, 11	
recipes_pkg_check,32	cool, PrepRecipe-method (cool), 11	
required_deps, 33	cool, Recipe-method (cool), 11	
step, 34	corr_heatmap, 12	
step_to_expr,64	corr_heatmap,PrepRecipe-method	
tidyeval, 68	(corr_heatmap), 12	
to_tibble, 70	corr_heatmap,Recipe-method	
use_rarefy, 71	(corr_heatmap), 12	
* rarefaction phy steps		
step_rarefaction, 62	dar (dar-package), 4	
* subset phy steps	dar-package, 4	

INDEX 75

enquo (tidyeval), 68	phy_qc, 26
enquo(), 68	phy_qc , Recipe-method (phy_qc), 26
enquos (tidyeval), 68	<pre>phyloseq_or_null-class, 25</pre>
enquos(), 68	prep, 27
exclusion_plt, 13	<pre>prep,Recipe-method(prep), 27</pre>
exclusion_plt,PrepRecipe-method	prep_recipe, 29
(exclusion_plt), 13	PrepRecipe (prep_recipe), 29
exclusion_plt,Recipe-method	PrepRecipe-class, 28
(exclusion_plt), 13	
export_steps, 14	rand_id, 29
	read_data, 30
filter_taxa, 48, 50, 51, 53	<pre>read_file (read_data), 30</pre>
find_intersections, 14	read_phyloseq (read_data), 30
	Recipe (recipe), 31
get_comparisons, 15	recipe, 31
get_phy, 16	Recipe(), 6
<pre>get_phy,Recipe-method(get_phy), 16</pre>	Recipe-class (phyloseq_or_null-class)
get_tax, 17	25
<pre>get_tax,Recipe-method(get_tax), 17</pre>	recipes_pkg_check, 32
get_var, 17	required_deps, 33
<pre>get_var, Recipe-method(get_var), 17</pre>	required_deps,Recipe-method
	(required_deps), 33
<pre>import_steps, 18</pre>	(
intersection_df, 19	sample_data, 34
<pre>intersection_df,PrepRecipe-method</pre>	<pre>sample_data,Recipe-method</pre>
(intersection_df), 19	(sample_data), 34
<pre>intersection_df,Recipe-method</pre>	show, PrepRecipe-method
(intersection_df), 19	(phyloseq_or_null-class), 25
intersection_plt, 20	step, 34
<pre>intersection_plt,PrepRecipe-method</pre>	step_aldex, 36, 41, 44, 46, 56, 59, 61, 66
(intersection_plt), 20	step_aldex,PrepRecipe-method
<pre>intersection_plt,Recipe-method</pre>	(step_aldex), 36
$(intersection_plt), 20$	step_aldex,Recipe-method(step_aldex)
	36
metaHIV_phy, 21	step_ancom, 37, 38, 44, 46, 56, 59, 61, 66
mutual_plt, 22	step_ancom, PrepRecipe-method
mutual_plt,PrepRecipe-method	(step_ancom), 38
(mutual_plt), 22	step_ancom, Recipe-method (step_ancom)
<pre>mutual_plt,Recipe-method(mutual_plt),</pre>	38
22	step_corncob, 37, 41, 42, 46, 56, 59, 61, 66
	step_corncob, PrepRecipe-method
otu_table, 23	(step_corncob), 42
otu_table, Recipe-method (otu_table), 23	step_corncob,Recipe-method
overlap_df, 24	(step_corncob), 42
overlap_df,PrepRecipe-method	
(overlap_df), 24	step_deseq, 37, 41, 44, 45, 56, 59, 61, 66
<pre>overlap_df,Recipe-method(overlap_df),</pre>	step_deseq,PrepRecipe-method
24	(step_deseq), 45
nactry of 25	<pre>step_deseq,Recipe-method(step_deseq)</pre>
pastry_df, 25	45

76 INDEX

step_filter_by_abundance, 47, 50, 51, 53, 54	<pre>step_subset_taxa,PrepRecipe-method (step_subset_taxa), 63</pre>
step_filter_by_abundance,PrepRecipe-method	step_subset_taxa,Recipe-method
(step_filter_by_abundance), 47	(step_subset_taxa), 63
step_filter_by_abundance, Recipe-method	step_to_expr, 64
(step_filter_by_abundance), 47	step_wilcox, 37, 41, 44, 46, 56, 59, 61, 65
	step_wilcox, 97, 47, 44, 40, 50, 52, 01, 03
step_filter_by_prevalence, 48, 49, 51, 53,	(step_wilcox), 65
54	step_wilcox,Recipe-method
step_filter_by_prevalence,PrepRecipe-method	
(step_filter_by_prevalence), 49	(step_wilcox), 65
step_filter_by_prevalence,Recipe-method	steps_ids, 35
<pre>(step_filter_by_prevalence), 49</pre>	subset_taxa, 64
step_filter_by_rarity, 48, 50, 50, 53, 54	tax_table, 67
<pre>step_filter_by_rarity,PrepRecipe-method</pre>	tax_table, Recipe-method (tax_table), 67
<pre>(step_filter_by_rarity), 50</pre>	test_prep_rec, 67
<pre>step_filter_by_rarity,Recipe-method</pre>	
<pre>(step_filter_by_rarity), 50</pre>	test_rec, 68 tibble_or_NULL-class
step_filter_by_variance, 48, 50, 51, 52,	
54	(phyloseq_or_null-class), 25
<pre>step_filter_by_variance,PrepRecipe-method</pre>	tidyeval, 68
<pre>(step_filter_by_variance), 52</pre>	to_tibble, 70
<pre>step_filter_by_variance,Recipe-method</pre>	use_rarefy, 71
(step_filter_by_variance), 52	utils::install.packages(), 32
step_filter_taxa, 48, 50, 51, 53, 53	utilismstall.packages(), 32
step_filter_taxa,Recipe-method	validate_otu(read_data), 30
(step_filter_taxa), 53	validate_phyloseq (read_data), 30
step_lefse, 37, 41, 44, 46, 54, 59, 61, 66	validate_sample_data (read_data), 30
step_lefse,PrepRecipe-method	validate_tax_table (read_data), 30
(step_lefse), 54	variate_tax_table (read_aata), 50
step_lefse, Recipe-method (step_lefse),	zero_otu, 72
54	zero_otu,phyloseq-method(zero_otu),72
step_maaslin, 37, 41, 44, 46, 56, 57, 61, 66	zero_otu, Recipe-method (zero_otu), 72
step_maaslin, PrepRecipe-method	- , , , , , , , , , , , , , , , , , , ,
(step_maaslin), 57	
step_maaslin,Recipe-method	
(step_maaslin), 57	
step_metagenomeseq, <i>37</i> , <i>41</i> , <i>44</i> , <i>46</i> , <i>56</i> , <i>59</i> , 59, <i>66</i>	
<pre>step_metagenomeseq,PrepRecipe-method</pre>	
(step_metagenomeseq), 59	
<pre>step_metagenomeseq,Recipe-method</pre>	
(step_metagenomeseq), 59	
step_rarefaction, 62	
step_rarefaction, PrepRecipe-method	
(step_rarefaction), 62	
step_rarefaction, Recipe-method	
(step_rarefaction), 62	
step subset taxa. 63	