# Package 'groupdata2'

June 6, 2020

```
Title Creating Groups from Data
Version 1.2.1
Description Methods for dividing data into groups.
      Create balanced partitions and cross-validation folds.
      Perform time series windowing and general grouping and splitting of data.
      Balance existing groups with up- and downsampling.
Depends R (>= 3.5)
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{\bf URL} \ {\tt https://github.com/ludvigolsen/groupdata2}
BugReports https://github.com/ludvigolsen/groupdata2/issues
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```

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## **R** topics documented:

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## Description

#### **Maturing**

Checks whether two grouping factors contain the same groups, looking only at the group members, allowing for different group names / identifiers.

## Usage

```
all_groups_identical(x, y)
```

## **Arguments**

x, y Two grouping factors (vectors/factors with group identifiers) to compare.

**N.B.** Both are converted to character vectors.

## **Details**

Both factors are sorted by x. A grouping factor is created with new groups starting at the values in y which differ from the previous row (i.e. group() with  $method = "1\_starts"$  and n = "auto"). A similar grouping factor is created for x, to have group identifiers range from 1 to the number of groups. The two generated grouping factors are tested for equality.

## Value

Whether **all** groups in x are the same in y, *memberwise*. (logical)

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

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#### See Also

Other grouping functions: fold(), group\_factor(), group(), partition(), splt()

## **Examples**

```
# Attach groupdata2
library(groupdata2)
# Same groups, different identifiers
x1 \leftarrow c(1, 1, 2, 2, 3, 3)
x2 \leftarrow c(2, 2, 1, 1, 4, 4)
all_groups_identical(x1, x2) \# TRUE
# Same groups, different identifier types
x1 <- c(1, 1, 2, 2, 3, 3)
x2 <- c("a", "a", "b", "b", "c", "c")
all_groups_identical(x1, x2) # TRUE
# Not same groups
# Note that all groups must be the same to return TRUE
x1 \leftarrow c(1, 1, 2, 2, 3, 3)
x2 \leftarrow c(1, 2, 2, 3, 3, 3)
all_groups_identical(x1, x2) # FALSE
# Different number of groups
x1 \leftarrow c(1, 1, 2, 2, 3, 3)
x2 \leftarrow c(1, 1, 1, 2, 2, 2)
all_groups_identical(x1, x2) # FALSE
```

balance

Balance groups by up- and downsampling.

## Description

### **Maturing**

Uses up- and/or downsampling to fix the group sizes to the min, max, mean, or median group size or to a specific number of rows. Has a range of methods for balancing on ID level.

## Usage

```
balance(
  data,
  size,
  cat_col,
  id_col = NULL,
  id_method = "n_ids",
  mark_new_rows = FALSE,
  new_rows_col_name = ".new_row"
)
```

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#### **Arguments**

data

Data frame.

size

Size to fix group sizes to. Can be a specific number, given as a whole number, or one of the following strings: "min", "max", "mean", "median".

**number:** Fix each group to have the size of the specified number of row. Uses downsampling for groups with too many rows and upsampling for groups with too few rows.

**min:** Fix each group to have the size of smallest group in the dataset. Uses downsampling on all groups that have too many rows.

**max:** Fix each group to have the size of largest group in the dataset. Uses upsampling on all groups that have too few rows.

**mean:** Fix each group to have the mean group size in the dataset. The mean is rounded. Uses downsampling for groups with too many rows and upsampling for groups with too few rows.

**median:** Fix each group to have the median group size in the dataset. The median is rounded. Uses downsampling for groups with too many rows and upsampling for groups with too few rows.

cat\_col

Name of categorical variable to balance by. (Character)

id\_col

Name of factor with IDs. (Character)

IDs are considered entities, e.g. allowing us to add or remove all rows for an ID. How this is used is up to the id\_method.

E.g. If we have measured a participant multiple times and want make sure that we keep all these measurements. Then we would either remove/add all measurements for the participant or leave in all measurements for the participant.

id\_method

Method for balancing the IDs. (Character)

n\_ids, n\_rows\_c, distributed, or nested.

**n\_ids** (**default**): Balances on ID level only. It makes sure there are the same number of IDs for each category. This might lead to a different number of rows between categories.

**n\_rows\_c:** Attempts to level the number of rows per category, while only removing/adding entire IDs. This is done in 2 steps:

- 1. If a category needs to add all its rows one or more times, the data is repeated.
- 2. Iteratively, the ID with the number of rows closest to the lacking/excessive number of rows is added/removed. This happens until adding/removing the closest ID would lead to a size further from the target size than the current size. If multiple IDs are closest, one is randomly sampled.

**distributed:** Distributes the lacking/excess rows equally between the IDs. If the number to distribute can not be equally divided, some IDs will have 1 row more/less than the others.

**nested:** Calls balance() on each category with IDs as cat\_col. I.e. if size is "min", IDs will have the size of the smallest ID in their category.

mark\_new\_rows Add column with 1s for added rows, and 0s for original rows. (Logical) new\_rows\_col\_name

Name of column marking new rows. Defaults to ".new\_row".

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#### **Details**

**Without** id\_col: Upsampling is done with replacement for added rows, while the original data remains intact. Downsampling is done without replacement, meaning that rows are not duplicated but only removed.

With id\_col: See id\_method description.

#### Value

Data frame with added and/or deleted rows. Ordered by cat\_col and (potentially) id\_col.

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

Other sampling functions: downsample(), upsample()

```
# Attach packages
library(groupdata2)
# Create data frame
df <- data.frame(</pre>
  "participant" = factor(c(1, 1, 2, 3, 3, 3, 4, 4, 5, 5, 5, 5)),
  "diagnosis" = factor(c(0, 0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 0)),
  "trial" = c(1, 2, 1, 1, 2, 3, 4, 1, 2, 1, 2, 3, 4),
  "score" = sample(c(1:100), 13)
)
# Using balance() with specific number of rows
balance(df, 3, cat_col = "diagnosis")
# Using balance() with min
balance(df, "min", cat_col = "diagnosis")
# Using balance() with max
balance(df, "max", cat_col = "diagnosis")
# Using balance() with id_method "n_ids"
# With column specifying added rows
balance(df, "max",
  cat_col = "diagnosis"
  id_col = "participant",
  id_method = "n_ids",
  mark_new_rows = TRUE
# Using balance() with id_method "n_rows_c"
# With column specifying added rows
balance(df, "max",
  cat_col = "diagnosis",
  id_col = "participant",
  id_method = "n_rows_c",
```

```
mark_new_rows = TRUE
)

# Using balance() with id_method "distributed"
# With column specifying added rows
balance(df, "max",
   cat_col = "diagnosis",
   id_col = "participant",
   id_method = "distributed",
   mark_new_rows = TRUE
)

# Using balance() with id_method "nested"
# With column specifying added rows
balance(df, "max",
   cat_col = "diagnosis",
   id_col = "participant",
   id_method = "nested",
   mark_new_rows = TRUE
)
```

differs\_from\_previous Find values in a vector that differ from the previous value.

#### **Description**

### **Maturing**

Finds values, or indices of values, that differ from the previous value by some threshold(s).

Operates with both a positive and a negative threshold. Depending on direction, it checks if the difference to the previous value is:

- greater than or equal to the positive threshold.
- less than or equal to the negative threshold.

## Usage

```
differs_from_previous(
  data,
  col = NULL,
  threshold = NULL,
  direction = "both",
  return_index = FALSE,
  include_first = FALSE,
  handle_na = "ignore",
  factor_conversion_warning = TRUE
)
```

#### **Arguments**

data

Data frame or Vector

N.B. If checking a factor, it is converted to a character vector. This means that factors can only be used when threshold is NULL. Conversion will generate a

warning, which can be turned off by setting factor\_conversion\_warning to FALSE.

col

Name of column to find values that differ in. Used when data is data frame. (Character)

threshold

Threshold to check difference to previous value to. NULL, numeric scalar or numeric vector with length 2.

**NULL:** Checks if the value is different from the previous value.

Ignores direction.

N.B. Works for both numeric and character vectors.

**Numeric scalar:** Positive number. Negative threshold is the negated number. N.B. Only works for numeric vectors.

**Numeric vector with length 2:** Given as c(negative threshold, positive threshold).

Negative threshold must be a negative number and positive threshold must be a positive number.

N.B. Only works for numeric vectors.

direction

both, positive or negative. (character)

**both:** Checks whether the difference to the previous value is

- greater than or equal to the positive threshold.
- less than or equal to the negative threshold.

**positive:** Checks whether the difference to the previous value is

• greater than or equal to the positive threshold.

negative: Checks whether the difference to the previous value is

• less than or equal to the negative threshold.

return\_index

Return indices of values that differ. (Logical)

include\_first

Whether to include first element in vector in output. (Logical)

handle na

How to handle NAs in the column.

"ignore": Removes the NAs before finding the differing values, ensuring that the first value after an NA will be correctly identified as new, if it differs from the value before the NA(s).

"as\_element": Treats all NAs as the string "NA". This means, that threshold must be NULL when using this method.

Numeric scalar: A numeric value to replace NAs with.

factor\_conversion\_warning

Generate warning when converting factor to character. (Logical)

## Value

Vector with either differing values or indices of differing values.

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

## See Also

Other l\_starts tools: find\_missing\_starts(), find\_starts(), group\_factor(), group()

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#### **Examples**

```
# Attach packages
library(groupdata2)
# Create a data frame
df <- data.frame(</pre>
  "a" = factor(c("a", "a", "b", "b", "c", "c")),
  "n" = c(1, 3, 6, 2, 2, 4)
# Get differing values in column 'a' with no threshold.
# This will simply check, if it is different to the previous value or not.
differs_from_previous(df, col = "a")
# Get indices of differing values in column 'a' with no threshold.
differs_from_previous(df, col = "a", return_index = TRUE)
# Get values, that are 2 or more greater than the previous value
differs_from_previous(df, col = "n", threshold = 2, direction = "positive")
# Get values, that are 4 or more less than the previous value
differs_from_previous(df, col = "n", threshold = 4, direction = "negative")
# Get values, that are either 2 or more greater than the previous value
# or 4 or more less than the previous value
differs_from_previous(df, col = "n", threshold = c(-4, 2), direction = "both")
```

downsample

Downsampling of rows in a data frame.

## Description

## Maturing

Uses random downsampling to fix the group sizes to the smallest group in the data frame.

```
Wraps balance().
```

## Usage

```
downsample(data, cat_col, id_col = NULL, id_method = "n_ids")
```

### **Arguments**

data Data frame.

cat\_col Name of categorical variable to balance by. (Character)

id\_col Name of factor with IDs. (Character)

IDs are considered entities, e.g. allowing us to add or remove all rows for an ID. How this is used is up to the id\_method.

E.g. If we have measured a participant multiple times and want make sure that we keep all these measurements. Then we would either remove/add all measurements for the participant or leave in all measurements for the participant.

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id\_method

Method for balancing the IDs. (Character)

n\_ids, n\_rows\_c, distributed, or nested.

**n\_ids** (**default**): Balances on ID level only. It makes sure there are the same number of IDs for each category. This might lead to a different number of rows between categories.

**n\_rows\_c:** Attempts to level the number of rows per category, while only removing/adding entire IDs. This is done in 2 steps:

- 1. If a category needs to add all its rows one or more times, the data is repeated.
- Iteratively, the ID with the number of rows closest to the lacking/excessive number of rows is added/removed. This happens until adding/removing the closest ID would lead to a size further from the target size than the current size. If multiple IDs are closest, one is randomly sampled.

**distributed:** Distributes the lacking/excess rows equally between the IDs. If the number to distribute can not be equally divided, some IDs will have 1 row more/less than the others.

**nested:** Calls balance() on each category with IDs as cat\_col. I.e. if size is "min", IDs will have the size of the smallest ID in their category.

#### **Details**

**Without** id\_col: Downsampling is done without replacement, meaning that rows are not duplicated but only removed.

With id\_col: See id\_method description.

#### Value

Data frame with some rows removed. Ordered by cat\_col and (potentially) id\_col.

## Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

### See Also

Other sampling functions: balance(), upsample()

```
# Attach packages
library(groupdata2)

# Create data frame
df <- data.frame(
   "participant" = factor(c(1, 1, 2, 3, 3, 3, 3, 4, 4, 5, 5, 5, 5)),
   "diagnosis" = factor(c(0, 0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 0, 0)),
   "trial" = c(1, 2, 1, 1, 2, 3, 4, 1, 2, 1, 2, 3, 4),
   "score" = sample(c(1:100), 13)
)

# Using downsample()
downsample(df, cat_col = "diagnosis")</pre>
```

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```
# Using downsample() with id_method "n_ids"
# With column specifying added rows
downsample(df,
  cat_col = "diagnosis",
  id_col = "participant",
  id_method = "n_ids"
)
# Using downsample() with id_method "n_rows_c"
# With column specifying added rows
downsample(df,
  cat_col = "diagnosis",
  id_col = "participant",
  id_method = "n_rows_c"
)
# Using downsample() with id_method "distributed"
downsample(df,
 cat_col = "diagnosis",
id_col = "participant",
  id_method = "distributed"
# Using downsample() with id_method "nested"
downsample(df,
  cat_col = "diagnosis",
  id_col = "participant",
  id_method = "nested"
)
```

find\_missing\_starts Find start positions that cannot be found in data.

## Description

#### **Maturing**

Tells you which values and (optionally) skip\_to numbers that are recursively removed when using the l\_starts method with remove\_missing\_starts set to TRUE.

## Usage

```
find_missing_starts(data, n, starts_col = NULL, return_skip_numbers = TRUE)
```

## **Arguments**

data	Data frame or Vector
n	List of starting positions.
	Skip values by c(value, skip_to_number) where skip_to_number is the nth appearance of the value in the vector.
	See group_factor for explanations and examples of using the $l\_starts$ method.
starts_col	Name of column with values to match when data is a data frame. Pass 'index' to use row names. (Character)

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```
return_skip_numbers
```

Return skip\_to numbers along with values (Logical).

## Value

List of start values and skip\_to numbers or vector of the start values. Returns NULL if no values found

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

```
Other l_starts tools: differs_from_previous(), find_starts(), group_factor(), group()
```

## **Examples**

```
# Attach packages
library(groupdata2)

# Create a data frame

df <- data.frame(
    "a" = c("a", "a", "b", "b", "c", "c"),
    stringsAsFactors = FALSE
)

# Create list of starts
starts <- c("a", "e", "b", "d", "c")

# Find missing starts with skip_to numbers
find_missing_starts(df, starts, starts_col = "a")

# Find missing starts without skip_to numbers
find_missing_starts(df, starts,
    starts_col = "a",
    return_skip_numbers = FALSE
)</pre>
```

find\_starts

Find start positions of groups in data.

## Description

## Maturing

Finds values or indices of values that are not the same as the previous value.

E.g. to use with the l\_starts method.

Wraps differs\_from\_previous().

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#### **Usage**

```
find_starts(
 data,
  col = NULL,
  return_index = FALSE,
 handle_na = "ignore",
  factor_conversion_warning = TRUE
```

## **Arguments**

data Data frame or Vector

> N.B. If checking a factor, it is converted to a character vector. Conversion will generate a warning, which can be turned off by setting factor\_conversion\_warning

to FALSE.

Name of column to find starts in. Used when data is data frame. (Character) col

return\_index Return indices of starts. (Logical) handle\_na How to handle NAs in the column.

> "ignore": Removes the NAs before finding the differing values, ensuring that the first value after an NA will be correctly identified as new, if it differs from the value before the NA(s).

"as\_element": Treats all NAs as the string "NA". This means, that threshold

must be NULL when using this method.

**Numeric scalar:** A numeric value to replace NAs with.

factor\_conversion\_warning

Generate warning when converting factor to character. (Logical)

#### Value

Vector with either start values or indices of start values.

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

```
Other l_starts tools: differs_from_previous(), find_missing_starts(), group_factor(),
group()
```

```
# Attach packages
library(groupdata2)
# Create a data frame
df <- data.frame(</pre>
  "a" = c("a", "a", "b", "b", "c", "c"),
  stringsAsFactors = FALSE
```

```
# Get start values for new groups in column 'a'
find_starts(df, col = "a")
# Get indices of start values for new groups
# in column 'a'
find_starts(df,
  col = "a",
  return_index = TRUE
## Use found starts with l_starts method
# Notice: This is equivalent to n = 'auto'
# with l_starts method
# Get start values for new groups in column 'a'
starts <- find_starts(df, col = "a")</pre>
# Use starts in group() with 'l_starts' method
group(df,
 n = starts, method = "l_starts",
  starts_col = "a"
# Similar but with indices instead of values
# Get indices of start values for new groups
# in column 'a'
starts_ind <- find_starts(df,</pre>
 col = "a".
  return_index = TRUE
# Use starts in group() with 'l_starts' method
  n = starts_ind, method = "l_starts",
  starts_col = "index"
```

fold

Create balanced folds for cross-validation.

## Description

#### Stable

Divides data into groups by a range of methods. Balances a given categorical variable and/or numerical variable between folds and keeps (if possible) all data points with a shared ID (e.g. participant\_id) in the same fold. Can create multiple unique fold columns for repeated cross-validation.

## Usage

```
fold(
  data,
  k = 5,
  cat_col = NULL,
```

```
num_col = NULL,
  id_col = NULL,
 method = "n_dist",
  id_aggregation_fn = sum,
  extreme_pairing_levels = 1,
  num_fold_cols = 1,
  unique_fold_cols_only = TRUE,
 max_iters = 5,
 handle_existing_fold_cols = "keep_warn",
 parallel = FALSE
)
```

#### **Arguments**

Data frame. data

k Dependent on method.

Number of folds (default), fold size, with more (see method).

Given as whole number or percentage (0 < n < 1).

cat\_col Name of categorical variable to balance between folds.

> E.g. when predicting a binary variable (a or b), we usually want both classes represented in every fold.

N.B. If also passing an id\_col, cat\_col should be constant within each ID.

num\_col Name of numerical variable to balance between folds.

> N.B. When used with id\_col, values for each ID are aggregated using id\_aggregation\_fn before being balanced.

N.B. When passing num\_col, the method parameter is ignored.

Name of factor with IDs. This will be used to keep all rows that share an ID in the same fold (if possible).

> E.g. If we have measured a participant multiple times and want to see the effect of time, we want to have all observations of this participant in the same fold.

n\_dist, n\_fill, n\_last, n\_rand, greedy, or staircase.

Notice: examples are sizes of the generated groups based on a vector with 57 elements.

- **n dist (default):** Divides the data into a specified number of groups and distributes excess data points across groups (e.g.11, 11, 12, 11, 12). n is number of groups
- **n\_fill:** Divides the data into a specified number of groups and fills up groups with excess data points from the beginning (e.g.12, 12, 11, 11, 11). n is number of groups
- **n last:** Divides the data into a specified number of groups. It finds the most equal group sizes possible, using all data points. Only the last group is able to differ in size (e.g.11, 11, 11, 11, 13). n is number of groups
- **n\_rand:** Divides the data into a specified number of groups. Excess data points are placed randomly in groups (only 1 per group) (e.g.12, 11, 11, 11, 12). n is number of groups

**greedy:** Divides up the data greedily given a specified group size (e.g.10, 10, 10, 10, 10, 7). n is group size

id\_col

method

**staircase:** Uses step size to divide up the data. Group size increases with 1 step for every group, until there is no more data (e.g.5, 10, 15, 20, 7). n is step size

id\_aggregation\_fn

Function for aggregating values in num\_col for each ID, before balancing num\_col.

N.B. Only used when num\_col and id\_col are both specified.

extreme\_pairing\_levels

How many levels of extreme pairing to do when balancing folds by a numerical column (i.e. num\_col is specified).

**Extreme pairing**: Rows/pairs are ordered as smallest, largest, second smallest, second largest, etc. If extreme\_pairing\_levels > 1, this is done "recursively" on the extreme pairs. See "Details/num\_col" for more.

N.B. Larger values work best with large datasets. If set too high, the result might not be stochastic. Always check if an increase actually makes the folds more balanced. See example.

If num\_fold\_cols > 1, columns will be named " $.folds_1$ ", " $.folds_2$ ", etc. Otherwise simply ".folds".

N.B. If unique\_fold\_cols\_only is TRUE, we can end up with fewer columns than specified, see max\_iters.

N.B. If data has existing fold columns, see handle\_existing\_fold\_cols.

unique\_fold\_cols\_only

Check if fold columns are identical and keep only unique columns.

As the number of column comparisons can be time consuming, we can run this part in parallel. See parallel.

N.B. We can end up with fewer columns than specified in num\_fold\_cols, see max\_iters.

N.B. Only used when num\_fold\_cols > 1 or data has existing fold columns.

max\_iters

Maximum number of attempts at reaching num\_fold\_cols unique fold columns. When only keeping unique fold columns, we risk having fewer columns than expected. Hence, we repeatedly create the missing columns and remove those that are not unique. This is done until we have num\_fold\_cols unique fold columns or we have attempted max\_iters times. In some cases, it is not possible to create num\_fold\_cols unique combinations of the dataset, e.g. when specifying cat\_col, id\_col and num\_col. max\_iters specifies when to stop trying. Note that we can end up with fewer columns than specified in num\_fold\_cols.

N.B. Only used num\_fold\_cols > 1.

handle\_existing\_fold\_cols

How to handle existing fold columns. Either "keep\_warn", "keep", or "remove". To add extra fold columns, use "keep" or "keep\_warn". Note that existing fold columns might be renamed.

To replace the existing fold columns, use "remove".

parallel

Whether to parallelize the fold column comparisons, when unique\_fold\_cols\_only is TRUE.

Requires a registered parallel backend. Like doParallel::registerDoParallel.

## Details

cat\_col:

- 1. Data is subset by cat\_col.
- 2. Subsets are grouped and merged.

#### id\_col:

1. Groups are created from unique IDs.

#### num\_col:

1. Rows are shuffled.

\strong{Note} that this will only affect rows with the same value in \code{num\_col}. \item Extreme pairing 1: Rows are ordered as smallest, largest, second smallest, second large Each pair get a group identifier.

\item If \code{extreme\_pairing\_levels > 1}: The group identifiers are reordered as smallest, largest, second smallest, second largest, etc., by the sum of \code{num\_col} in the representation (of pairs) get a new set of group identifiers, and the process is repeated \code{extreme\_pairing\_levels-2} times. Note that the group identifiers at the last level wi \code{2^extreme\_pairing\_levels} rows, why you should be careful when choosing that setting.

\item The final group identifiers are folded, and the fold identifiers are transferred to the

N.B. When doing extreme pairing of an unequal number of rows, the row with the smallest value is placed in a group by itself, and the order is instead: smallest, second smallest, largest, third smallest, second largest, etc.

### cat\_col AND id\_col:

- 1. Data is subset by cat\_col.
- 2. Groups are created from unique IDs in each subset.
- 3. Subsets are merged.

## cat\_col AND num\_col:

- 1. Data is subset by cat\_col.
- 2. Subsets are grouped by num\_col.
- 3. Subsets are merged such that the largest group (by sum of num\_col) from the first category is merged with the smallest group from the second category, etc.

### num\_col AND id\_col:

- 1. Values in num\_col are aggregated for each ID, using id\_aggregation\_fn.
- 2. The IDs are grouped, using the aggregated values as "num\_col".
- 3. The groups of the IDs are transferred to the rows.

### cat\_col AND num\_col AND id\_col:

- 1. Values in num\_col are aggregated for each ID, using id\_aggregation\_fn.
- 2. IDs are subset by cat\_col.
- 3. The IDs in each subset are grouped, by using the aggregated values as "num\_col".
- 4. The subsets are merged such that the largest group (by sum of the aggregated values) from the first category is merged with the smallest group from the second category, etc.
- 5. The groups of the IDs are transferred to the rows.

#### Value

Data frame with grouping factor for subsetting in cross-validation.

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

```
partition for balanced partitions
Other grouping functions: all_groups_identical(), group_factor(), group(), partition(),
splt()
```

```
# Attach packages
library(groupdata2)
library(dplyr)
# Create data frame
df <- data.frame(</pre>
  "participant" = factor(rep(c("1", "2", "3", "4", "5", "6"), 3)),
  "age" = rep(sample(c(1:100), 6), 3),
  "diagnosis" = factor(rep(c("a", "b", "a", "a", "b", "b"), 3)),
  "score" = sample(c(1:100), 3 * 6)
df <- df %>% arrange(participant)
dfsession <- rep(c("1", "2", "3"), 6)
# Using fold()
## Without balancing
df_folded <- fold(df, 3, method = "n_dist")</pre>
## With cat_col
df_folded <- fold(df, 3,</pre>
 cat_col = "diagnosis",
 method = "n_dist"
)
## With id_col
df_folded <- fold(df, 3,</pre>
 id_col = "participant",
 method = "n_dist"
)
## With num_col
# Note: 'method' would not be used in this case
df_folded <- fold(df, 3, num_col = "score")</pre>
# With cat_col and id_col
df_folded <- fold(df, 3,</pre>
 cat_col = "diagnosis",
  id_col = "participant", method = "n_dist"
## With cat_col, id_col and num_col
df_folded <- fold(df, 3,</pre>
 cat_col = "diagnosis",
  id_col = "participant", num_col = "score"
```

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```
)
# Order by folds
df_folded <- df_folded %>% arrange(.folds)
## Multiple fold columns
# Useful for repeated cross-validation
# Note: Consider running in parallel
df_folded <- fold(df, 3,</pre>
  cat_col = "diagnosis",
  id_col = "participant", num_fold_cols = 5,
  unique_fold_cols_only = TRUE,
 max_iters = 4
)
## Check if additional extreme_pairing_levels
\#\# improve the numerical balance
set.seed(2) # try with seed 1 as well
df_folded_1 <- fold(df, 3,</pre>
  num_col = "score",
  extreme_pairing_levels = 1
df_folded_1 %>%
  dplyr::group_by(.folds) %>%
  dplyr::summarise(
    sum_score = sum(score),
    mean_score = mean(score)
set.seed(2) # try with seed 1 as well
df_folded_2 <- fold(df, 3,
  num_col = "score",
  extreme_pairing_levels = 2
df_folded_2 %>%
  dplyr::group_by(.folds) %>%
  dplyr::summarise(
    sum_score = sum(score),
    mean_score = mean(score)
  )
```

group

Create groups from your data.

## **Description**

## Stable

Divides data into groups by a range of methods. Creates a grouping factor with 1s for group 1, 2s for group 2, etc. Returns a data frame grouped by the grouping factor for easy use in %>% pipelines.

## Usage

```
group(
  data,
```

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```
n,
method = "n_dist",
starts_col = NULL,
force_equal = FALSE,
allow_zero = FALSE,
return_factor = FALSE,
descending = FALSE,
randomize = FALSE,
col_name = ".groups",
remove_missing_starts = FALSE)
```

#### **Arguments**

data

Data frame or vector.

n

Dependent on method.

Number of groups (default), group size, list of group sizes, list of group starts, step size or prime number to start at. See method.

Passed as whole number(s) and/or percentage(s) (0 < n < 1) and/or character.

Method l\_starts allows 'auto'.

method

greedy,  $n\_dist$ ,  $n\_fill$ ,  $n\_last$ ,  $n\_rand$ ,  $l\_sizes$ ,  $l\_starts$ , staircase, or primes.

**Notice**: examples are sizes of the generated groups based on a vector with 57 elements.

**greedy:** Divides up the data greedily given a specified group size (e.g.10, 10, 10, 10, 10, 7). n is group size

- **n\_dist (default):** Divides the data into a specified number of groups and distributes excess data points across groups (e.g.11, 11, 12, 11, 12). n is number of groups
- **n\_fill:** Divides the data into a specified number of groups and fills up groups with excess data points from the beginning (e.g.12, 12, 11, 11, 11). n is number of groups
- **n\_last:** Divides the data into a specified number of groups. It finds the most equal group sizes possible, using all data points. Only the last group is able to differ in size (e.g.11, 11, 11, 11, 13). n is number of groups
- **n\_rand:** Divides the data into a specified number of groups. Excess data points are placed randomly in groups (only 1 per group) (e.g.12, 11, 11, 11, 12). n is number of groups

**l\_sizes:** Divides up the data by a list of group sizes. Excess data points are placed in an extra group at the end. (e.g.n = list(0.2, 0.3) outputs group swith sizes(11, 17, 29)). n is a list of group sizes

**l\_starts:** Starts new groups at specified values of vector.

n is a list of starting positions. Skip values by c(value, skip\_to\_number) where skip\_to\_number is the nth appearance of the value in the vector. Groups automatically start from first data point.

```
E.g.n = c(1,3,7,25,50) outputs groups with sizes (2,4,18,25,8). To skip: given vector c("a","e","o","a","e","o"), n = list("a","e",c("o",2)) outputs groups gro
```

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If passing n='auto' the starting positions are automatically found with find\_starts(). Note that all NAs are first replaced by a single unique value, meaning that they will also cause group starts.

**staircase:** Uses step size to divide up the data. Group size increases with 1 step for every group, until there is no more data (e.g.5, 10, 15, 20, 7). n is step size

**primes:** Uses prime numbers as group sizes. Group size increases to the next prime number until there is no more data. (e.g.5,7,11,13,17,4).

n is the prime number to start at

 $starts\_col \qquad \quad Name \ of \ column \ with \ values \ to \ match \ in \ method \ l\_starts \ when \ data \ is \ a \ data$ 

frame. Pass 'index' to use row names. (Character)

between methods. (Logical)

allow\_zero Whether n can be passed as 0. (Logical) return\_factor Return only grouping factor. (Logical)

descending Change direction of method. (Not fully implemented) (Logical)

randomize Randomize the grouping factor (Logical)

col\_name Name of added grouping factor

remove\_missing\_starts

Recursively remove elements from the list of starts that are not found. For method l\_starts only. (Logical)

#### Value

Data frame grouped by new grouping factor

## Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

### See Also

```
Other grouping functions: all_groups_identical(), fold(), group_factor(), partition(), splt()

Other staircase tools: %primes%(), %staircase%(), group_factor()

Other l_starts tools: differs_from_previous(), find_missing_starts(), find_starts(), group_factor()
```

```
# Attach packages
library(groupdata2)
library(dplyr)

# Create data frame
df <- data.frame(
   "x" = c(1:12),
   "species" = factor(rep(c("cat", "pig", "human"), 4)),
   "age" = sample(c(1:100), 12)
)</pre>
```

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```
# Using group()
df_grouped <- group(df, 5, method = "n_dist")

# Using group() with dplyr pipeline to get mean age
df_means <- df %>%
    group(5, method = "n_dist") %>%
    dplyr::summarise(mean_age = mean(age))

# Using group_factor() with l_starts
# "c('pig',2)" skips to the second appearance of
# "pig" after the first appearance of "cat"
df_grouped <- group(df,
    list("cat", c("pig", 2), "human"),
    method = "l_starts",
    starts_col = "species"
)</pre>
```

groupdata2

groupdata2: A package for creating groups from data

## **Description**

Methods for dividing data into groups. Create balanced partitions and cross-validation folds. Perform time series windowing and general grouping and splitting of data. Balance existing groups with up- and downsampling.

## **Details**

The groupdata2 package provides six main functions: group, group\_factor, splt, partition, fold, and balance.

#### group

Create groups from your data.

Divides data into groups by a range of methods. Creates a grouping factor with 1s for group 1, 2s for group 2, etc. Returns a data frame grouped by the grouping factor for easy use in dplyr pipelines.

Go to group

## group\_factor

Create grouping factor for subsetting your data.

Divides data into groups by a range of methods. Creates and returns a grouping factor with 1s for group 1, 2s for group 2, etc.

Go to group\_factor

## splt

Split data by a range of methods.

Divides data into groups by a range of methods. Splits data by these groups.

Go to splt

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#### partition

Create balanced partitions (e.g. training/test sets).

Splits data into partitions. Balances a given categorical variable between partitions and keeps (if possible) all data points with a shared ID (e.g. participant\_id) in the same partition.

Go to partition

#### fold

Create balanced folds for cross-validation.

Divides data into groups (folds) by a range of methods. Balances a given categorical variable between folds and keeps (if possible) all data points with the same ID (e.g. participant\_id) in the same fold.

Go to fold

#### balance

Balance the sizes of your groups with up- and downsampling.

Uses up- and/or downsampling to fix the group sizes to the min, max, mean, or median group size or to a specific number of rows. Has a range of methods for balancing on ID level.

Go to balance

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

group\_factor

Create grouping factor for subsetting your data.

#### **Description**

#### Stable

Divides data into groups by a range of methods. Creates and returns a grouping factor with 1s for group 1, 2s for group 2, etc.

## Usage

```
group_factor(
  data,
  n,
  method = "n_dist",
  starts_col = NULL,
  force_equal = FALSE,
  allow_zero = FALSE,
  descending = FALSE,
  randomize = FALSE,
  remove_missing_starts = FALSE
)
```

group\_factor 23

## **Arguments**

data Data frame or vector.

n Dependent on method.

Number of groups (default), group size, list of group sizes, list of group starts, step size or prime number to start at. See method.

Passed as whole number(s) and/or percentage(s) (0 < n < 1) and/or character.

Method l\_starts allows 'auto'.

method

greedy,  $n\_dist$ ,  $n\_fill$ ,  $n\_last$ ,  $n\_rand$ ,  $l\_sizes$ ,  $l\_starts$ , staircase, or primes.

**Notice**: examples are sizes of the generated groups based on a vector with 57 elements.

**greedy:** Divides up the data greedily given a specified group size (e.g.10, 10, 10, 10, 10, 7). n is group size

- **n\_dist** (**default**): Divides the data into a specified number of groups and distributes excess data points across groups (e.g.11, 11, 12, 11, 12). n is number of groups
- **n\_fill:** Divides the data into a specified number of groups and fills up groups with excess data points from the beginning (e.g.12, 12, 11, 11, 11). n is number of groups
- **n\_last:** Divides the data into a specified number of groups. It finds the most equal group sizes possible, using all data points. Only the last group is able to differ in size (e.g.11, 11, 11, 11, 13). n is number of groups
- **n\_rand:** Divides the data into a specified number of groups. Excess data points are placed randomly in groups (only 1 per group) (e.g.12, 11, 11, 11, 12). n is number of groups

**l\_sizes:** Divides up the data by a list of group sizes. Excess data points are placed in an extra group at the end. (e.g.n = list(0.2, 0.3)outputsgroupswithsizes(11, 17, 29)). n is a list of group sizes

**l\_starts:** Starts new groups at specified values of vector.

n is a list of starting positions. Skip values by c(value, skip\_to\_number) where skip\_to\_number is the nth appearance of the value in the vector. Groups automatically start from first data point.

```
E.g.n = c(1,3,7,25,50) outputs groups with sizes (2,4,18,25,8). To skip: given vector c("a","e","o","a","e","o"), n = list("a","e",c("o",2)) outputs groups gro
```

If passing n = 'auto' the starting positions are automatically found with find\_starts().

Note that all NAs are first replaced by a single unique value, meaning that they will also cause group starts.

**staircase:** Uses step size to divide up the data. Group size increases with 1 step for every group, until there is no more data (e.g.5, 10, 15, 20, 7). n is step size

**primes:** Uses prime numbers as group sizes. Group size increases to the next prime number until there is no more data. (e.g.5, 7, 11, 13, 17, 4). n is the prime number to start at

starts\_col

Name of column with values to match in method 1\_starts when data is a data frame. Pass 'index' to use row names. (Character)

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force\_equal Create equal groups by discarding excess data points. Implementation varies between methods. (Logical)

allow\_zero Whether n can be passed as 0. (Logical)

descending Change direction of method. (Not fully implemented) (Logical)

randomize Randomize the grouping factor (Logical)

remove\_missing\_starts

Recursively remove elements from the list of starts that are not found. For method l\_starts only. (Logical)

#### Value

Grouping factor with 1s for group 1, 2s for group 2, etc.

## Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

```
Other grouping functions: all_groups_identical(), fold(), group(), partition(), splt()
Other staircase tools: %primes%(), %staircase%(), group()
Other l_starts tools: differs_from_previous(), find_missing_starts(), find_starts(), group()
```

```
# Attach packages
library(groupdata2)
library(dplyr)
# Create a data frame
df <- data.frame(</pre>
  x'' = c(1:12),
  "species" = factor(rep(c("cat", "pig", "human"), 4)),
  "age" = sample(c(1:100), 12)
# Using group_factor() with n_dist
groups <- group_factor(df, 5, method = "n_dist")</pre>
df$groups <- groups
# Using group_factor() with greedy
groups <- group_factor(df, 5, method = "greedy")</pre>
df$groups <- groups</pre>
# Using group_factor() with l_sizes
groups <- group_factor(df, list(0.2, 0.3), method = "l_sizes")</pre>
df$groups <- groups
# Using group_factor() with l_starts
groups <- group_factor(df, list("cat", c("pig", 2), "human"),</pre>
  method = "l_starts", starts_col = "species"
df$groups <- groups</pre>
```

partition 25

partition

Create balanced partitions.

## Description

#### Stable

Splits data into partitions. Balances a given categorical variable and/or numerical variable between partitions and keeps (if possible) all data points with a shared ID (e.g. participant\_id) in the same partition.

## Usage

```
partition(
  data,
  p = 0.2,
  cat_col = NULL,
  num_col = NULL,
  id_col = NULL,
  id_aggregation_fn = sum,
  extreme_pairing_levels = 1,
  force_equal = FALSE,
  list_out = TRUE
)
```

#### **Arguments**

data	Data frame.		
р	List or vector of partition sizes. Given as whole number(s) and/or percentage(s) (0 < n < 1). E.g. $c(0.2,3,0.1)$ .		
cat_col	Name of categorical variable to balance between partitions.		
	E.g. when training and testing a model for predicting a binary variable (a or b), we usually want both classes represented in both the training set and the test set. N.B. If also passing an id_col, cat_col should be constant within each ID.		
num_col	Name of numerical variable to balance between partitions.		
	N.B. When used with id_col, values in num_col for each ID are aggregated using id_aggregation_fn before being balanced.		
id_col	Name of factor with IDs. Used to keep all rows that share an ID in the same partition (if possible).		
	E.g. If we have measured a participant multiple times and want to see the effect of time, we want to have all observations of this participant in the same partition.		
id_aggregation_fn			

Id\_aggregation\_fn

Function for aggregating values in num\_col for each ID, before balancing num\_col. N.B. Only used when num\_col and id\_col are both specified.

extreme\_pairing\_levels

How many levels of extreme pairing to do when balancing partitions by a numerical column (i.e. num\_col is specified).

**Extreme pairing**: Rows/pairs are ordered as smallest, largest, second smallest, second largest, etc. If extreme\_pairing\_levels > 1, this is done "recursively" on the extreme pairs. See "Details/num\_col" for more.

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N.B. Larger values work best with large datasets. If set too high, the result might not be stochastic. Always check if an increase actually makes the partitions more balanced. See example.

force\_equal Discard excess data. (Logical)
list\_out Return partitions in a list. (Logical)

#### **Details**

#### cat col:

- 1. Data is subset by cat\_col.
- 2. Subsets are partitioned and merged.

#### id\_col:

1. Partitions are created from unique IDs.

#### num col:

1. Rows are shuffled.

\strong{Note} that this will only affect rows with the same value in \code{num\_col}. \item Extreme pairing 1: Rows are ordered as smallest, largest, second smallest, second large Each pair get a group identifier.

\item If \code{extreme\_pairing\_levels > 1}: The group identifiers are reordered as smallest,
largest, second smallest, second largest, etc., by the sum of \code{num\_col} in the represent
These pairs (of pairs) get a new set of group identifiers, and the process is repeated
\code{extreme\_pairing\_levels-2} times. Note that the group identifiers at the last level wi

\code{2^extreme\_pairing\_levels} rows, why you should be careful when choosing that setting. \item The final group identifiers are shuffled, and their order is applied to the full datase \item The ordered dataset is split by the sizes in \code{p}.

N.B. When doing extreme pairing of an unequal number of rows, the row with the largest value is placed in a group by itself, and the order is instead: smallest, second largest, second smallest, third largest, ..., largest.

## cat\_col AND id\_col:

- 1. Data is subset by cat\_col.
- 2. Partitions are created from unique IDs in each subset.
- 3. Subsets are merged.

#### cat\_col AND num\_col:

- 1. Data is subset by cat\_col.
- 2. Subsets are partitioned by num\_col.
- 3. Subsets are merged.

#### num\_col AND id\_col:

- 1. Values in num\_col are aggregated for each ID, using id\_aggregation\_fn.
- 2. The IDs are partitioned, using the aggregated values as "num\_col".
- 3. The partition identifiers are transferred to the rows of the IDs.

#### cat\_col AND num\_col AND id\_col:

- 1. Values in num\_col are aggregated for each ID, using id\_aggregation\_fn.
- 2. IDs are subset by cat\_col.
- 3. The IDs for each subset are partitioned, by using the aggregated values as "num\_col".
- 4. The partition identifiers are transferred to the rows of the IDs.

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#### Value

```
If list_out is TRUE:
```

A list of partitions where partitions are data frames.

If list\_out is FALSE:

A data frame with grouping factor for subsetting.

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

Other grouping functions: all\_groups\_identical(), fold(), group\_factor(), group(), splt()

```
# Attach packages
library(groupdata2)
library(dplyr)
# Create data frame
df <- data.frame(</pre>
  "participant" = factor(rep(c("1", "2", "3", "4", "5", "6"), 3)),
  "age" = rep(sample(c(1:100), 6), 3),
  "diagnosis" = factor(rep(c("a", "b", "a", "a", "b", "b"), 3)),
  "score" = sample(c(1:100), 3 * 6)
df <- df %>% arrange(participant)
df$session <- rep(c("1", "2", "3"), 6)
# Using partition()
# Without balancing
partitions <- partition(data = df, p = c(0.2, 0.3))
# With cat_col
partitions <- partition(data = df, p = 0.5, cat_col = "diagnosis")</pre>
# With id_col
partitions <- partition(data = df, p = 0.5, id_col = "participant")</pre>
# With num_col
partitions <- partition(data = df, p = 0.5, num_col = "score")</pre>
# With cat_col and id_col
partitions <- partition(</pre>
 data = df,
 p = 0.5,
 cat_col = "diagnosis",
  id_col = "participant"
# With cat_col, num_col and id_col
partitions <- partition(</pre>
  data = df,
```

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```
p = 0.5
  cat_col = "diagnosis",
  num_col = "score",
  id_col = "participant"
# Return data frame with grouping factor
# with list_out = FALSE
partitions <- partition(df, c(0.5), list_out = FALSE)</pre>
# Check if additional extreme_pairing_levels
# improve the numerical balance
set.seed(2) # try with seed 1 as well
partitions_1 <- partition(</pre>
 data = df,
  p = 0.5,
 num_col = "score",
  extreme_pairing_levels = 1,
 list_out = FALSE
partitions_1 %>%
  dplyr::group_by(.partitions) %>%
  dplyr::summarise(
    sum_score = sum(score),
    mean_score = mean(score)
set.seed(2) # try with seed 1 as well
partitions_2 <- partition(</pre>
 data = df,
  p = 0.5,
 num_col = "score",
 extreme_pairing_levels = 2,
  list_out = FALSE
partitions_2 %>%
  dplyr::group_by(.partitions) %>%
  dplyr::summarise(
    sum_score = sum(score),
    mean_score = mean(score)
  )
```

splt

Split data by a range of methods.

## **Description**

## Stable

Divides data into groups by a range of methods. Splits data by these groups.

## Usage

```
splt(
  data,
  n,
```

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```
method = "n_dist",
  starts_col = NULL,
  force_equal = FALSE,
  allow_zero = FALSE,
  descending = FALSE,
  randomize = FALSE,
  remove_missing_starts = FALSE)
```

#### **Arguments**

data

Data frame or vector.

n

Dependent on method.

Number of groups (default), group size, list of group sizes, list of group starts, step size or prime number to start at. See method.

Passed as whole number(s) and/or percentage(s) (0 < n < 1) and/or character.

Method l\_starts allows 'auto'.

method

greedy,  $n\_dist$ ,  $n\_fill$ ,  $n\_last$ ,  $n\_rand$ ,  $l\_sizes$ ,  $l\_starts$ , staircase, or primes.

**Notice**: examples are sizes of the generated groups based on a vector with 57 elements.

**greedy:** Divides up the data greedily given a specified group size (e.g.10, 10, 10, 10, 10, 7). n is group size

- **n\_dist** (**default**): Divides the data into a specified number of groups and distributes excess data points across groups (e.g.11, 11, 12, 11, 12). n is number of groups
- **n\_fill:** Divides the data into a specified number of groups and fills up groups with excess data points from the beginning (e.g.12, 12, 11, 11, 11). n is number of groups
- **n\_last:** Divides the data into a specified number of groups. It finds the most equal group sizes possible, using all data points. Only the last group is able to differ in size (e.g.11, 11, 11, 11, 13). n is number of groups
- **n\_rand:** Divides the data into a specified number of groups. Excess data points are placed randomly in groups (only 1 per group) (e.g.12, 11, 11, 11, 12). n is number of groups

**l\_sizes:** Divides up the data by a list of group sizes. Excess data points are placed in an extra group at the end. (e.g.n = list(0.2, 0.3) outputs group swith sizes(11, 17, 29)). n is a list of group sizes

**l\_starts:** Starts new groups at specified values of vector.

n is a list of starting positions. Skip values by c(value, skip\_to\_number) where skip\_to\_number is the nth appearance of the value in the vector. Groups automatically start from first data point.

```
E.g.n = c(1,3,7,25,50) outputs groups with sizes (2,4,18,25,8). To skip: given vector c("a","e","o","a","e","o"), n = list("a","e",c("o",2)) outputs groups gro
```

If passing n='auto' the starting positions are automatically found with find\_starts(). Note that all NAs are first replaced by a single unique value, meaning that they will also cause group starts.

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**staircase:** Uses step size to divide up the data. Group size increases with 1 step for every group, until there is no more data (e.g.5, 10, 15, 20, 7). n is step size

**primes:** Uses prime numbers as group sizes. Group size increases to the next prime number until there is no more data. (e.g.5, 7, 11, 13, 17, 4). n is the prime number to start at

starts\_col Name of column with values to match in method l\_starts when data is a data

frame. Pass 'index' to use row names. (Character)

force\_equal Create equal groups by discarding excess data points. Implementation varies

between methods. (Logical)

allow\_zero Whether n can be passed as 0. (Logical)

descending Change direction of method. (Not fully implemented) (Logical)

randomize Randomize the grouping factor (Logical)

remove\_missing\_starts

Recursively remove elements from the list of starts that are not found. For method l\_starts only. (Logical)

#### Value

List of the split data

## Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

## See Also

 $Other grouping \ functions: all\_groups\_identical(), fold(), group\_factor(), group(), partition()$ 

```
# Attach packages
library(groupdata2)
library(dplyr)

# Create data frame
df <- data.frame(
   "x" = c(1:12),
   "species" = factor(rep(c("cat", "pig", "human"), 4)),
   "age" = sample(c(1:100), 12)
)

# Using splt()
df_list <- splt(df, 5, method = "n_dist")</pre>
```

upsample 31

upsample

Upsampling of rows in a data frame.

## **Description**

#### **Maturing**

Uses random upsampling to fix the group sizes to the largest group in the data frame.

Wraps balance().

## Usage

```
upsample(
  data,
  cat_col,
  id_col = NULL,
  id_method = "n_ids",
  mark_new_rows = FALSE,
  new_rows_col_name = ".new_row")
```

#### **Arguments**

data

Data frame.

cat\_col

Name of categorical variable to balance by. (Character)

id\_col

Name of factor with IDs. (Character)

IDs are considered entities, e.g. allowing us to add or remove all rows for an ID. How this is used is up to the id\_method.

E.g. If we have measured a participant multiple times and want make sure that we keep all these measurements. Then we would either remove/add all measurements for the participant or leave in all measurements for the participant.

 $id\_method$ 

Method for balancing the IDs. (Character)

n\_ids, n\_rows\_c, distributed, or nested.

- **n\_ids** (**default**): Balances on ID level only. It makes sure there are the same number of IDs for each category. This might lead to a different number of rows between categories.
- **n\_rows\_c:** Attempts to level the number of rows per category, while only removing/adding entire IDs. This is done in 2 steps:
- If a category needs to add all its rows one or more times, the data is repeated.
- 2. Iteratively, the ID with the number of rows closest to the lacking/excessive number of rows is added/removed. This happens until adding/removing the closest ID would lead to a size further from the target size than the current size. If multiple IDs are closest, one is randomly sampled.

**distributed:** Distributes the lacking/excess rows equally between the IDs. If the number to distribute can not be equally divided, some IDs will have 1 row more/less than the others.

**nested:** Calls balance() on each category with IDs as cat\_col. I.e. if size is "min", IDs will have the size of the smallest ID in their category.

32 upsample

```
mark_new_rows Add column with 1s for added rows, and 0s for original rows. (Logical) new_rows_col_name
```

Name of column marking new rows. Defaults to ".new\_row".

#### **Details**

**Without** id\_col: Upsampling is done with replacement for added rows, while the original data remains intact.

With id\_col: See id\_method description.

#### Value

Data frame with added rows. Ordered by cat\_col and (potentially) id\_col.

#### Author(s)

Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>

#### See Also

Other sampling functions: balance(), downsample()

```
# Attach packages
library(groupdata2)
# Create data frame
df <- data.frame(</pre>
  "participant" = factor(c(1, 1, 2, 3, 3, 3, 4, 4, 5, 5, 5, 5)),
  "diagnosis" = factor(c(0, 0, 1, 0, 0, 0, 0, 1, 1, 0, 0, 0, 0)),
  "trial" = c(1, 2, 1, 1, 2, 3, 4, 1, 2, 1, 2, 3, 4),
  "score" = sample(c(1:100), 13)
)
# Using upsample()
upsample(df, cat_col = "diagnosis")
# Using upsample() with id_method "n_ids"
# With column specifying added rows
upsample(df,
  cat_col = "diagnosis",
  id_col = "participant",
  id_method = "n_ids",
  mark_new_rows = TRUE
# Using upsample() with id_method "n_rows_c"
# With column specifying added rows
upsample(df,
  cat_col = "diagnosis",
  id_col = "participant",
  id_method = "n_rows_c",
  mark_new_rows = TRUE
```

%primes% 33

```
# Using upsample() with id_method "distributed"
# With column specifying added rows
upsample(df,
    cat_col = "diagnosis",
    id_col = "participant",
    id_method = "distributed",
    mark_new_rows = TRUE
)

# Using upsample() with id_method "nested"
# With column specifying added rows
upsample(df,
    cat_col = "diagnosis",
    id_col = "participant",
    id_method = "nested",
    mark_new_rows = TRUE
)
```

%primes%

Find remainder from 'primes' method.

### **Description**

#### Stable

When using the primes method, the last group might not have the size of the associated prime number if there are not enough elements left. Use %primes% to find this remainder.

#### Usage

```
size %primes% start_at
```

## **Arguments**

```
size Size to group (Integer)
start_at Prime to start at (Integer)
```

#### Value

Remainder (Integer). Returns  $\emptyset$  if the last group has the size of the associated prime number.

## Author(s)

```
Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>
```

## See Also

```
Other staircase tools: %staircase%(), group_factor(), group()
Other remainder tools: %staircase%()
```

34 %staircase%

### **Examples**

```
# Attach packages
library(groupdata2)
100 %primes% 2
```

%staircase%

Find remainder from 'staircase' method.

## Description

#### Stable

When using the staircase method, the last group might not have the size of the second last group + step size. Use %staircase% to find this remainder.

## Usage

```
size %staircase% step_size
```

## **Arguments**

```
size Size to staircase (Integer)
step_size Step size (Integer)
```

## Value

Remainder (Integer). Returns 0 if the last group has the size of the second last group + step size.

#### Author(s)

```
Ludvig Renbo Olsen, <r-pkgs@ludvigolsen.dk>
```

## See Also

```
Other staircase tools: %primes%(), group_factor(), group()
Other remainder tools: %primes%()
```

```
# Attach packages
library(groupdata2)

100 %staircase% 2

# Finding remainder with value 0
size = 150
for (step_size in c(1:30)){
  if(size %staircase% step_size == 0){
    print(step_size)
}}
```

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