Package 'ClustImpute'

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Title K-Means Clustering with Build-in Missing Data Imputation

Type Package

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|---|
| Description This k-means algorithm is able to cluster data with missing values and as a by-product completes the data set. The implementation can deal with missing values in multiple variables and is computationally efficient since it iteratively uses the current cluster assignment to define a plausible distribution for missing value imputation. Weights are used to shrink early random draws for missing values (i.e., draws based on the cluster assignments after few iterations) towards the global mean of each feature. This shrinkage slowly fades out after a fixed number of iterations to reflect the increasing credibility of cluster assignments. See the vignette for details. |
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Description

Internal function of ClustImpute: check new centroids for duplicate rows and replace with random draws in this case.

Usage

```
check_replace_dups(centroids, X, seed)
```

Arguments

centroids Matrix of centroids

X Underlying data matrix (without missings)

seed Seed used for random sampling

Value

Returns centroids where duplicate rows are replaced by random draws

ClustImpute K-means clustering with build-in missing data imputation

Description

Clustering algorithm that produces a missing value imputation using on the go. The (local) imputation distribution is defined by the currently assigned cluster. The first draw is by random imputation.

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Usage

```
ClustImpute(
   X,
   nr_cluster,
   nr_iter = 10,
   c_steps = 1,
   wf = default_wf,
   n_end = 10,
   seed_nr = 150519,
   assign_with_wf = TRUE,
   shrink_towards_global_mean = TRUE
)
```

Arguments

X Data frame with only numeric values or NAs

nr_cluster Number of clusters
nr_iter Iterations of procedure

c_steps Number of clustering steps per iteration

wf Weight function. Linear up to n_end by default. Used to shrink X towards zero

or the global mean (default). See shrink_towards_global_mean

n_end Steps until convergence of weight function to 1

seed_nr Number for set.seed()

assign_with_wf Default is TRUE. If set to False, then the weight function is only applied in the

centroid computation, but ignored in the cluster assignment.

shrink_towards_global_mean

By default TRUE. The weight matrix w is applied on the difference of X from

the global mean m, i.e, (x-m)*w+m

Value

complete_data Completed data without NAs

clusters For each row of complete_data, the associated cluster

centroids For each cluster, the coordinates of the centroids in tidy format

centroids_matrix For each cluster, the coordinates of the centroids in matrix format

imp_values_mean Mean of the imputed variables per draw

imp_values_sd Standard deviation of the imputed variables per draw

Examples

```
# Random Dataset
set.seed(739)
n <- 750 # numer of points
nr_other_vars <- 2
mat <- matrix(rnorm(nr_other_vars*n),n,nr_other_vars)</pre>
```

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```
me<-4 # mean
x <- c(rnorm(n/3,me/2,1),rnorm(2*n/3,-me/2,1))
y <- c(rnorm(n/3,0,1),rnorm(n/3,me,1),rnorm(n/3,-me,1))
dat <- cbind(mat,x,y)
dat<- as.data.frame(scale(dat)) # scaling

# Create NAs
dat_with_miss <- miss_sim(dat,p=.1,seed_nr=120)

# Run ClustImpute
res <- ClustImpute(dat_with_miss,nr_cluster=3)

# Plot complete data set and cluster assignment
ggplot2::ggplot(res$complete_data,ggplot2::aes(x,y,color=factor(res$clusters))) +
ggplot2::geom_point()

# View centroids
res$centroids</pre>
```

default_wf

K-means clustering with build-in missing data imputation

Description

Default weight function. One minus the return value is multiplied with missing(=imputed) values. It starts with 1 and goes to 0 at n_end.

Usage

```
default_wf(n, n_end = 10)
```

Arguments

n current step

n_end steps until convergence of weight function to 0

Value

value between 0 and 1

Examples

```
x <- 0:20
plot(x,1-default_wf(x))</pre>
```

miss_sim 5

| of missings |
|-------------|
| (|

Description

Simulates missing at random using a normal copula to create correlations between the missing (type="MAR"). Missings appear in each column of the provided data frame with the same ratio.

Usage

```
miss_sim(dat, p = 0.2, type = "MAR", seed_nr = 123)
```

Arguments

| dat | Data frame with only numeric values |
|---------|--|
| р | Fraction of missings (for entire data frame) |
| type | Type of missingness. Either MCAR (=missing completely at random) or MAR (=missing at random) |
| seed_nr | Number for set.seed() |

Value

data frame with only numeric values and NAs

Examples

```
data(cars)
cars_with_missings <- miss_sim(cars,p = .2,seed_nr = 4)
summary(cars_with_missings)</pre>
```

```
plot.kmeans_ClustImpute
```

Plot showing marginal distribution by cluster assignment

Description

Returns a plot with the marginal distributions by cluster and feature. The plot shows histograms or boxplots and , as a ggplot object, can be modified further.

Usage

```
## S3 method for class 'kmeans_ClustImpute'
plot(
    x,
    type = "hist",
    vline = "centroids",
    hist_bins = 30,
    color_bins = "#56B4E9",
    color_vline = "#E69F00",
    size_vline = 2,
    ...
)
```

Arguments

| X | an object returned from ClustImpute |
|-------------|---|
| type | either "hist" to plot a histogram or "box" for a boxplot |
| vline | for "hist" a vertical line is plotted showing either the centroid value or the mean of all data points grouped by cluster and feature |
| hist_bins | number of bins for histogram |
| color_bins | color for the histogram bins |
| color_vline | color for the vertical line |
| size_vline | size of the vertical line |
| | currently unused |

Value

Returns a ggplot object

Description

Prediction method

Usage

```
## S3 method for class 'kmeans_ClustImpute'
predict(object, newdata, ...)
```

Arguments

object Object of class kmeans_ClustImpute

newdata Data frame

... additional arguments affecting the predictions produced - not currently used

Value

integer value (cluster assignment)

Examples

```
# Random Dataset
set.seed(739)
n <- 750 # numer of points
nr_other_vars <- 2
mat <- matrix(rnorm(nr_other_vars*n),n,nr_other_vars)
me<-4 # mean
x <- c(rnorm(n/3,me/2,1),rnorm(2*n/3,-me/2,1))
y <- c(rnorm(n/3,0,1),rnorm(n/3,me,1),rnorm(n/3,-me,1))
dat <- cbind(mat,x,y)
dat<- as.data.frame(scale(dat)) # scaling
# Create NAs
dat_with_miss <- miss_sim(dat,p=.1,seed_nr=120)
res <- ClustImpute(dat_with_miss,nr_cluster=3)
predict(res,newdata=dat[1,])</pre>
```

```
print.kmeans_ClustImpute
```

Print method for ClustImpute

Description

Returns a plot with the marginal distributions by cluster and feature. The plot shows histograms or boxplots and , as a ggplot object, can be modified further.

Usage

```
## S3 method for class 'kmeans_ClustImpute'
print(x, ...)
```

Arguments

```
x an object returned from ClustImpute
```

... currently unused

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Value

No return value (print function)

var_reduction

Reduction of variance

Description

Computes one minus the ratio of the sum of all within cluster variances by the overall variance

Usage

```
var_reduction(clusterObj)
```

Arguments

clusterObj

Object of class kmeans_ClustImpute

Value

integer value typically between 0 and 1

Examples

```
# Random Dataset
set.seed(739)
n <- 750 # numer of points
nr_other_vars <- 2
mat <- matrix(rnorm(nr_other_vars*n),n,nr_other_vars)
me<-4 # mean
x <- c(rnorm(n/3,me/2,1),rnorm(2*n/3,-me/2,1))
y <- c(rnorm(n/3,0,1),rnorm(n/3,me,1),rnorm(n/3,-me,1))
dat <- cbind(mat,x,y)
dat<- as.data.frame(scale(dat)) # scaling

# Create NAs
dat_with_miss <- miss_sim(dat,p=.1,seed_nr=120)
res <- ClustImpute(dat_with_miss,nr_cluster=3)
var_reduction(res)</pre>
```

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