# Package 'heterocop'

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Type Package

**Version** 0.1.0.0

Title Semi-Parametric Estimation with Gaussian Copula

| <b>Description</b> A method for generating random vectors which are linked by a Gaussian copula. It also enables to estimate the correlation matrix of the Gaussian copula in order to identify independencies within the data. |
|---|
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| R topics documented:  |
| CopulaSim   |
| icgc_data   |
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| rho_estim   |

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# Description

This function enables the user to simulate data from a Gaussian copula and arbitrary marginal quantile functions

#### Usage

```
CopulaSim(n, R, qdist, random = FALSE)
```

# Arguments

| n      | the number of observations  |
|--------|---|
| R      | a correlation matrix of size dxd  |
| qdist  | a vector containing the names of the marginal quantile functions as well as the number of times they are present in the dataset |
| random | a boolean defining whether the order of the correlation coefficients should be  |

randomized

#### Value

a list containing an nxd data frame, the shuffled correlation matrix R, and the permutation leading to the new correlation matrix

# **Examples**

```
 \label{eq:matrix} $$M <= diag_block_matrix(c(3,4,5),c(0.7,0.8,0.2))$$    CopulaSim(20,M,c(rep("qnorm(0,1)",6),rep("qexp(0.5)",4),rep("qbinom(4,0.8)",2)),random=TRUE) $$
```

```
cor_network_graph cor_network_graph
```

## **Description**

This function enables the user to plot the graph corresponding to the correlations of the Gaussian copula

## Usage

```
cor_network_graph(R, TS, binary = TRUE, legend)
```

diag\_block\_matrix 3

#### **Arguments**

R a correlation matrix of size dxd (d is the number of variables)

TS a threshold for the absolute values of the correlation matrix coefficients

binary a boolean specifying whether the coefficients should be binarized, TRUE by

defaut (zero if the coefficient is less than the threshold in absolute value, 1 oth-

erwise). If FALSE, the edge width is proportional to the coefficient value.

legend a vector containing the type of each variable used to color the vertices

#### Value

a graph representing the correlations between the latent Gaussian variables

## **Examples**

```
R <- diag_block_matrix(c(3,4,5),c(0.7,0.8,0.2))
data <- CopulaSim(20,R,c(rep("qnorm(0,1)",6),rep("qexp(0.5)",4),
rep("qbinom(4,0.8)",2)),random=FALSE)[[1]]
cor_network_graph(R,TS=0.3,binary=TRUE,legend=c(rep("Normal",6),
rep("Exponential",4),rep("Binomial",2)))</pre>
```

diag\_block\_matrix

diag\_block\_matrix

#### **Description**

This function enables the user to generate a diagonal block-matrix with homogeneous blocks

#### Usage

```
diag_block_matrix(blocks, coeff)
```

#### **Arguments**

blocks a vector containing the sizes of the blocks

coeff a vector containing the coefficient corresponding to each block, the coefficients

must be between 0 and 1

#### Value

a diagonal block-matrix containing the specified coefficients

#### **Examples**

```
diag_block_matrix(c(3,4,5),c(0.3,0.4,0.8))
```

icgc\_data

gauss\_gen

gauss\_gen

#### **Description**

This function enables the user to generate gaussian vectors with correlation matrix R

## Usage

```
gauss_gen(R, n)
```

## **Arguments**

R a correlation matrix of size dxd n the number of observations

#### Value

a nxd data frame containing n observations of the d variables

## **Examples**

```
M <- diag_block_matrix(c(3,4,5),c(0.7,0.8,0.2))
gauss_gen(M,20)</pre>
```

icgc\_data

ICGC dataset

## **Description**

Dataset containing RNA counts, protein expression and mutations measured on breast cancer tumors.

## Usage

```
icgc_data
```

#### **Format**

A dataframe of 15 variables and 250 observations containing the following:

```
ACACA, AKT1S1, ANLN, ANXA1, AR RNA counts (discrete)
```

ACACA\_P, AKT1S1\_P, ANLN\_P,ANXA\_P,AR\_P protein expression measurements (discrete)

MU5219,MU4468,MU7870,MU4842,MU6962 5 mutations (binary)

matrix\_cor\_ts 5

| atrix_cor_ts matrix_cor_ts |
|----------------------------|
|----------------------------|

#### **Description**

This function enables the user to threshold matrix coefficients

# Usage

```
matrix_cor_ts(R, TS, binary = TRUE)
```

## **Arguments**

R a correlation matrix

TS a threshold

binary a boolean specifying whether the coefficients should be binarized, TRUE by

defaut (zero if the coefficient is less than the threshold in absolute value, 1 oth-

erwise)

#### Value

the thresholded input matrix

## **Examples**

```
M <- diag_block_matrix(c(3,4,5),c(0.7,0.8,0.2))
matrix_cor_ts(M,0.5)</pre>
```

| matrix_gen | matrix_gen |
|------------|------------|
|------------|------------|

# Description

This function enables the user to generate a sparse, nonnegative definite correlation matrix via the Cholesky decomposition

#### Usage

```
matrix_gen(d, gamma)
```

#### **Arguments**

d the number of variables

gamma an initial sparsity parameter for the lower triangular matrices in the Cholesky

decomposition, must be between 0 and 1

rho\_estim

# Value

a list containing the generated correlation matrix and its final sparsity parameter (ie the proportion of zeros)

## **Examples**

```
matrix_gen(15,0.81)
```

rho\_estim

rho\_estim

## **Description**

This function enables the user to estimate the correlation matrix of the Gaussian copula for a given dataset

## Usage

```
rho_estim(data, Type, parallel = TRUE)
```

## **Arguments**

data an nxd data frame containing n observations of d variables

Type a vector containing the type of the variables, "C" for continuous and "D" for

discrete

parallel a boolean encoding whether the computations should be parallelized

#### Value

the dxd estimated correlation matrix of the Gaussian copula

## **Examples**

```
 \label{eq:matrix} $$M <- diag_block_matrix(c(3,4,5),c(0.7,0.8,0.2))$$ data <- CopulaSim(20,M,c(rep("qnorm(0,1)",6),rep("qexp(0.5)",4),rep("qbinom(4,0.8)",2)),random=FALSE)[[1]]$$ rho_estim(data,c(rep("C",10),rep("D",2)),parallel=FALSE)$$
```

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