

# Package ‘ComplexSim’

January 16, 2024

**Title** ComplexSim: Simulate high dimensional Omics data with covariance structure with time and subjects

**Version** 0.0.0.9000

**Description** This R package allows simulation using both Gaussian and Negative Binomial distribution with different set ups of the parameters, that is, mean and variance of Gaussian, mean and dispersion parameter of Negative Binomial, and one can switch between the two distributions to get equivalent simulation for benchmarking different models. The simulation functions have flexible parametrization that represent the treatment effect, time effect, correlation structure and subject level variability and correlation. One can use the simulation functions to explore different designs and the impact on the data.

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**Encoding** UTF-8

**Roxygen** list(markdown = TRUE)

**RoxygenNote** 7.2.3

**Depends** R (>= 3.5.0),  
stats,  
methods,  
utils,  
graphics,  
rlang

**Imports** purrr,  
emmeans,  
reshape2,  
dplyr,  
ggplot2,  
nlme,  
RhpcBLASctl

**Suggests** ggplot2, knitr, rmarkdown

**VignetteBuilder** knitr

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CovCor_err	<i>Title The correlation and covariance</i>
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**Description**

Title The correlation and covariance

**Usage**

CovCor\_err(data, condition, plot.line = FALSE, plot.heat = FALSE)

**Arguments**

data	Simulated data frame
condition	A specific group level
plot.line	Plot the line graph (TRUE or FALSE)
plot.heat	Plot the heatmap (TRUE or FALSE)

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CovHeatPlot	<i>Title Plot the variance-covariance matrix in heatmap</i>
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**Description**

Title Plot the variance-covariance matrix in heatmap

**Usage**

CovHeatPlot(CMatrix)

**Arguments**

CMatrix	A squared matrix with numeric elements
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CovMarginal_sim	<i>Title Generate the mariginal variance matrix</i>
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**Description**

Title Generate the mariginal variance matrix

**Usage**

CovMarginal\_sim(CorrSub, SigmaGroup, CorrRep, SigmaRep, sigmaRE = NULL)

**Arguments**

- CorrSub            Subject level correlation matrix, dim nq\*nq
- SigmaGroup        Group level variance, length q
- CorrRep           Correlation matrix between repeated measures, dim m\*m
- SigmaRep          Variance of repeated measures, length m

**Value**

Marginal covariance matrix cross samples, dim nqm\*nqm

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fVarAR1	<i>Title AR(1) correlation matrix</i>
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**Description**

Title AR(1) correlation matrix

**Usage**

fVarAR1(rho, d)

**Arguments**

- rho                Correlation coefficient
- d                  Dimension of repeated measures

**Value**

AR(1) correlation matrix

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fVarCS	<i>Title CS correaltion matrix</i>
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**Description**

Title CS correaltion matrix

**Usage**

fVarCS(rho, d)

**Arguments**

rho	Correlation coefficient
d	Dimension of repeated measures

**Value**

CS correlation matrix

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plot_prof	<i>Title Plot gene profiles</i>
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**Description**

Title Plot gene profiles

**Usage**

plot\_prof(data)

**Arguments**

data	Simulated data frame of gene profiles
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wrap_design	<i>Title wrap_design &lt;- function(n,m,q, SingleGroup = FALSE, eps = FALSE)</i>
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### Description

Title wrap\_design <- function(n,m,q, SingleGroup = FALSE, eps = FALSE)

### Usage

```
wrap_design(n, m, q, SingleGroup = FALSE, eps = FALSE)
```

### Arguments

n	Number of patients in each group. (Need >50 individuals to have a reasonable estimated covariance structure.)
m	Number of repeated visits (time points).
q	Number of groups (eg., control and multiple treatment groups).
SingleGroup	Whether the individuals are in single group or multiple groups.

### Value

Model matrix with desired design.

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wrap_simulation	<i>Title Simulate the log-scale expression of one gene</i>
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### Description

Title Simulate the log-scale expression of one gene

### Usage

```
wrap_simulation(  
  data,  
  SingleGroup,  
  beta0 = NULL,  
  beta1 = NULL,  
  beta2 = NULL,  
  lambda = NULL,  
  sigma = NULL,  
  mu = NULL,  
  tau = NULL,  
  act.cor = NULL  
)
```

**Arguments**

data	Design matrix in long format.
beta0	Mean of the global effect.
beta1	Mean of group effect.
beta2	Mean of time effect.
lambda	Coefficient of interaction terms.
sigma	Standard deviation of the simulated AR(1) sequence.
mu	Mean vector of random intercept and slope.
tau	Elements of variance-covariance matrix of random intercept and slope.
act.cor	Correlation parameter of the AR(1) structure.

**Value**

Data matrix in long data frame.

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wrap_sim_corr	<i>Title Simulate DGE List</i>
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**Description**

Title Simulate DGE List

**Usage**

```
wrap_sim_corr(
  data,
  N,
  eps_Signal,
  SingleGroup,
  coef.beta0 = NULL,
  coef.beta1 = NULL,
  coef.beta2 = NULL,
  coef.int = NULL,
  sigma = NULL,
  mu = NULL,
  tau = NULL,
  CovMarginal = NULL,
  act.cor = NULL
)
```

**Arguments**

data	Design matrix in long format.
N	Number of simulated genes in total.
eps_Signal	Proportion of signal genes.
coef.beta0	Mean of the global effect.
coef.beta1	Mean of group effect.

coef.beta2	Mean of time effect.
coef.int	Coefficient of interaction terms.
sigma	Standard deviation of the simulated AR(1) sequence.
mu	Mean vector of random intercept and slope.
tau	Elements of variance-covariance matrix of random intercept and slope.
CovMarginal	Marginal covariance.
act.cor	Correlation coefficient of the time effect.

**Value**

DGE list

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wrap_sim_DGEList	<i>Simulate Differential Gene Expression Data</i>
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**Description**

Simulates gene expression data for a given number of genes and samples, and returns a list containing the normalized counts matrix, sample phenotype data, and feature (gene) data.

**Usage**

```
wrap_sim_DGEList(
  n,
  m,
  q,
  N_gene,
  global_eff = NULL,
  trt_eff,
  trt_slope = NULL,
  inter = NULL,
  sigma = NULL,
  mu = NULL,
  tau = NULL,
  act.cor = NULL,
  distribution = NULL,
  SingleGroup = FALSE
)
```

**Arguments**

n	Integer, the number of biological replicates per group.
m	Integer, the number of time points.
q	Integer, the number of groups.
N_gene	Integer, the number of genes to simulate.
global_eff	Numeric vector or NULL, global effects for each gene.
trt_eff	Numeric vector, treatment effects for each gene.
trt_slope	Numeric vector or NULL, treatment slope effects for each gene.

inter	Numeric vector or NULL, interaction effects for each gene.
sigma	Numeric vector or NULL, residual standard deviations for each gene.
mu	Numeric vector or NULL, mean expression levels for each gene.
tau	Numeric vector or NULL, overdispersion parameters for each gene (applicable if distribution is "NB").
act.cor	Numeric vector or NULL, actual correlations for each gene.
distribution	Character string or NULL, specifies the distribution to use for simulation. If "NB", a negative binomial distribution is used.
SingleGroup	Logical, if TRUE, simulates data for a single group.

**Value**

A list with the following components:

- norm\_counts: Transposed normalized counts matrix with genes in rows and samples in columns.
- pheno\_data: Data frame containing phenotype data for the samples.
- feature\_data: Data frame containing feature (gene) data.

**Note**

The function assumes that the necessary libraries (such as dplyr, edgeR, and any other required packages) are already loaded in the R session. The actual simulation functions wrap\_simulation and wrap\_simulation\_NB are not defined within this documentation and should be provided for the function to work.

**Author(s)**

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**See Also**

[DGEList](#)

**Examples**

```
## Not run:
simulated_DGEList <- wrap_sim_DGEList(n = 5, m = 3, q = 2, N_gene = 1000,
                                     global_eff = rep(0, 1000), trt_eff = rep(1, 1000),
                                     trt_slope = rep(0.5, 1000), inter = rep(0.1, 1000),
                                     sigma = rep(1, 1000), mu = rep(10, 1000),
                                     tau = rep(0.2, 1000), act.cor = rep(0.3, 1000),
                                     distribution = "NB", SingleGroup = FALSE)

## End(Not run)
```



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