

# Package ‘diggit’

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**Author** Mariano J Alvarez <reef103@gmail.com>

**Maintainer** Mariano J Alvarez <reef103@gmail.com>

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by the DIGGIT algorithm

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## R topics documented:

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|       |                                                                |
|-------|----------------------------------------------------------------|
| aecdf | <i>Approximate empirical commulative distribution function</i> |
|-------|----------------------------------------------------------------|

---

**Description**

This function generates an empirical null model that computes a normalized statistics and p-value

**Usage**

```
aecdf(dnull, symmetric = FALSE)
```

**Arguments**

|           |                                                                                                                       |
|-----------|-----------------------------------------------------------------------------------------------------------------------|
| dnull     | Numerical vector representing the null model                                                                          |
| symmetric | Logical, whether the distribution should be treated as symmetric around zero and only one tail should be approximated |

**Value**

function with two parameters, x and alternative

---

|      |                          |
|------|--------------------------|
| aqtl | <i>Inference of aQTL</i> |
|------|--------------------------|

---

**Description**

This function infers aQTLs from F-CNVs and VIPER activity

**Usage**

```
aqtl(x, ...)
```

```
## S4 method for signature 'diggit'
```

```
aqtl(x, mr = 0.01, mr.adjust = c("none", "fdr",
  "bonferroni"), fcnv = 0.01, fcnv.adjust = c("none", "fdr", "bonferroni"),
  method = c("spearman", "mi", "pearson", "kendall"), mindy = FALSE,
  cores = 1, verbose = TRUE)
```

Arguments

|             |                                                                                                                                                                     |
|-------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| x           | Object of class diggit                                                                                                                                              |
| ...         | Additional parameters to pass to the function                                                                                                                       |
| mr          | Either a numerical value between 0 and 1 indicating the p-value threshold for the Master Regulator (MR) selection, or a vector of character strings listing the MRs |
| mr.adjust   | Character string indicating the multiple hypothesis test correction for the MRs                                                                                     |
| fcnv        | Either a numerical value between 0 and 1 indicating the p-value threshold for the F-CNV, or a vector of character strings listing the F-CNVs                        |
| fcnv.adjust | Character string indicating the multiple hypothesis test correction for the F-CNVs                                                                                  |
| method      | Character string indicating the method for computing the association between F-CNV and regulator activity (aQTL analysis)                                           |
| mindy       | Logical, whether only post-translational modulators of each evaluated TF should be considered as putative genetic driver                                            |
| cores       | Integer indicating the number of cores to use (1 for Windows-based systems)                                                                                         |
| verbose     | Logical, whether progress should be reported                                                                                                                        |

Value

Updated diggit object with viper and aqtl slots

Examples

```
data(gbm.expression, package="diggitdata")
data(gbm.cnv, package="diggitdata")
data(gbm.aracne, package="diggitdata")
dobj <- diggitClass(expset=gbmExprs, cnv=gbmCNV, regulon=gbmTFregulon)
dobj <- fCNV(dobj)
dobj <- aqtl(dobj, mr=c("CEBPD", "STAT3"), fcnv.adjust="fdr")
dobj
diggitAqtl(dobj)[, 1:4]
```

---

|             |                                     |
|-------------|-------------------------------------|
| conditional | <i>Conditional analysis of CNVs</i> |
|-------------|-------------------------------------|

---

Description

This function performs the conditional analysis of fCNVs

**Usage**

```
conditional(x, ...)

## S4 method for signature 'diggit'
conditional(x, pheno = "cond", group1, group2 = NULL,
  cnv = 0.2, mr = 0.01, mr.adjust = c("none", "fdr", "bonferroni"),
  modul = 0.01, modul.adjust = c("none", "fdr", "bonferroni"),
  fet.pval = 0.05, cores = 1, verbose = TRUE)
```

**Arguments**

|              |                                                                                                                                        |
|--------------|----------------------------------------------------------------------------------------------------------------------------------------|
| x            | Object of class diggit                                                                                                                 |
| ...          | Additional parameters to pass to the function                                                                                          |
| pheno        | Character string indicating the feature for sample groups                                                                              |
| group1       | Character string indicating the treatment group                                                                                        |
| group2       | Optional character string indicating the reference group                                                                               |
| cnv          | Single number or vector of two numbers indicating the thresholds for CNVs                                                              |
| mr           | Either vector of character strings indicating the MR genes, or number indicating the corrected p-value threshold for selecting the MRs |
| mr.adjust    | Character string indicating the multiple-hypothesis correction to apply to the MR p-values                                             |
| modul        | Number indicating the p-value threshold for a modulator to be considered associated with the MR activity                               |
| modul.adjust | Character string indicating the multiple-hypothesis correction to apply to the aQTL results                                            |
| fet.pval     | Number indicating the FET p-value threshold for the association between CNVs and sample groups                                         |
| cores        | Integer indicating the number of cores to use (1 for Windows-based systems)                                                            |
| verbose      | Logical, whether progress should be reported                                                                                           |

**Value**

Object of class diggit with conditional analysis results

**Examples**

```
data(gbm.expression, package="diggitdata")
data(gbm.cnv, package="diggitdata")
data(gbm.aracne, package="diggitdata")
dobj <- diggitClass(expset=gbmExprs, cnv=gbmCNV, regulon=gbmTFregulon)
dobj <- fCNV(dobj)
dobj <- aqtl(dobj, mr=c("CEBPD", "STAT3"), fcnv.adjust="fdr", verbose=FALSE)
dobj <- conditional(dobj, pheno="subtype", group1="MES", group2="PN", mr="STAT3", verbose=FALSE)
dobj
```

---

|             |                         |
|-------------|-------------------------|
| correlation | <i>Correlation test</i> |
|-------------|-------------------------|

---

## Description

This function computes the correlation between x and y given both are numeric vectors, between the columns of x if it is a numeric matrix, or between the columns of x and y if both are numeric matrixes

## Usage

```
correlation(x, y = NULL, method = c("pearson", "spearman", "kendall"),  
           pairwise = FALSE)
```

## Arguments

|          |                                                                                                                             |
|----------|-----------------------------------------------------------------------------------------------------------------------------|
| x        | Numeric vector or matrix                                                                                                    |
| y        | Optional numeric vector or matrix                                                                                           |
| method   | Character string indicating the correlation method                                                                          |
| pairwise | Logical, wether columns of x and y should be compared in a pairwise manner.<br>x and y must have the same number of columns |

## Details

This function computes correlation and associated p-values

## Value

Numeric value, vector or matrix of results

## Examples

```
x <- seq(0, 10, length=50)  
y <- x+rnorm(length(x), sd=2)  
correlation(x, y)
```

---

 diggit-class

*The diggit class*


---

## Description

This class stores parameters and results of the diggit algorithm

This function generates diggit class objects

## Usage

```
diggitClass(expset = NULL, cnv = NULL, regulon = NULL, mindy = NULL,
            fcnv = NULL, mr = NULL, viper = NULL, aqtl = NULL,
            conditional = NULL)
```

## Arguments

|             |                                                                                                         |
|-------------|---------------------------------------------------------------------------------------------------------|
| expset      | ExpressionSet object or numeric matrix of expression data, with features in rows and samples in columns |
| cnv         | Numeric matrix of CNV data                                                                              |
| regulon     | Regulon class object containing the transcriptional interactome                                         |
| mindy       | Regulon class object containing the post-translational interactome                                      |
| fcnv        | Vector of F-CNV p-values                                                                                |
| mr          | Vector of master regulator Z-score (NES)                                                                |
| viper       | Numeric matrix of VIPER results                                                                         |
| aqtl        | Numeric matrix of aQTL p-values                                                                         |
| conditional | List containing the conditional analysis results                                                        |

## Details

see [diggit-methods](#) for related methods

## Value

Object of class diggit

## Slots

expset: ExpressionSet object containing the gene expression data  
 cnv: Matrix containing the CNV data  
 regulon: Regulon object containing the transcriptional interactome  
 mindy: Regulon object containing the post-translational interactome  
 fcnv: Numeric vector containing the p-values for functional CNVs  
 mr: Numeric vector of normalized enrichment scores for the MARINa analysis

viper: Numeric matrix of normalized enrichment scores for the VIPER analysis  
 aqtl: Numeric matrix of association p-values for the aQTL analysis  
 conditional: List containing the conditional analysis results

### Examples

```
data(gbm.expression, package="diggitdata")
data(gbm.aracne, package="diggitdata")
dobj <- diggitClass(expset=gbmExprs, regulon=gbmTFregulon)
print(dobj)
```

fCNV

*Inference of functional CNVs*

### Description

This function infers functional CNVs by computing their association with gene expression

### Usage

```
fCNV(x, ...)

## S4 method for signature 'diggit'
fCNV(x, expset = NULL, cnv = NULL,
     method = c("spearman", "mi", "pearson", "kendall"), cores = 1,
     verbose = TRUE)

## S4 method for signature 'ExpressionSet'
fCNV(x, cnv, method = c("spearman", "mi", "pearson",
                        "kendall"), cores = 1, verbose = TRUE)

## S4 method for signature 'matrix'
fCNV(x, cnv, method = c("spearman", "mi", "pearson",
                        "kendall"), cores = 1, verbose = TRUE)

## S4 method for signature 'data.frame'
fCNV(x, cnv, method = c("spearman", "mi", "pearson",
                        "kendall"), cores = 1, verbose = TRUE)
```

### Arguments

|        |                                                                                                                                 |
|--------|---------------------------------------------------------------------------------------------------------------------------------|
| x      | Object of class diggit, expressionSet object or numeric matrix of expression data, with features in rows and samples in columns |
| ...    | Additional arguments                                                                                                            |
| expset | Optional numeric matrix of expression data                                                                                      |
| cnv    | Optional numeric matrix of CNVs                                                                                                 |

|         |                                                                                                  |
|---------|--------------------------------------------------------------------------------------------------|
| method  | Character string indicating the method for computing the association between CNVs and expression |
| cores   | Integer indicating the number of cores to use (1 for Windows-based systems)                      |
| verbose | Logical, whether to report analysis progress                                                     |

**Value**

Objet of class diggit with updated fCNV slot

**Examples**

```
data(gbm.expression, package="diggitdata")
data(gbm.cnv, package="diggitdata")
genes <- intersect(rownames(gbmExprs), rownames(gbmCNV))[1:100]
gbmCNV <- gbmCNV[match(genes, rownames(gbmCNV)), ]
dgo <- diggitClass(expset=gbmExprs, cnv=gbmCNV)

dgo <- fCNV(dgo)
dgo
diggitFcnv(dgo)[1:5]
dgo <- fCNV(gbmExprs, gbmCNV)
print(dgo)
diggitFcnv(dgo)[1:5]
dgo <- fCNV(exprs(gbmExprs), gbmCNV)
dgo
diggitFcnv(dgo)[1:5]
dgo <- fCNV(as.data.frame(exprs(gbmExprs)), gbmCNV)
dgo
diggitFcnv(dgo)[1:5]
```

---

marina

---

*Inference of Master Regulators*


---

**Description**

This function infers the master regulators for the transition between two phenotypes

**Usage**

```
marina(x, ...)

## S4 method for signature 'matrix'
marina(x, y = NULL, mu = 0, regulon, per = 1000,
       cores = 1, verbose = TRUE)

## S4 method for signature 'ExpressionSet'
marina(x, pheno = "cond", group1, group2 = NULL,
       mu = 0, regulon, per = 1000, cores = 1, verbose = TRUE)
```



```
## S4 method for signature 'diggit'
marina(x, pheno, group1, group2 = NULL, mu = 0,
       regulon = NULL, per = 1000, cores = 1, verbose = TRUE)
```

### Arguments

|         |                                                                                                  |
|---------|--------------------------------------------------------------------------------------------------|
| x       | Object of class diggit, expressionSet object or numerical matrix containing the test samples     |
| ...     | Additional arguments                                                                             |
| y       | Numerical matrix containing the control samples                                                  |
| mu      | Number indicating the control mean when y is omitted                                             |
| regulon | Transcriptional interactome                                                                      |
| per     | Integer indicating the number of permutations to compute the marina null model                   |
| cores   | Integer indicating the number of cores to use (1 for Windows-based systems)                      |
| verbose | Logical, whether progress should be reported                                                     |
| pheno   | Character string indicating the phenotype data to use                                            |
| group1  | Vector of character strings indicating the category from phenotype pheno to use as test group    |
| group2  | Vector of character strings indicating the category from phenotype pheno to use as control group |

### Value

Updated diggit object with Master Regulator results

### Examples

```
cores <- 3*(Sys.info()[1] != "Windows")+1
data(gbm.expression, package="diggitdata")
data(gbm.aracne, package="diggitdata")

eset <- exprs(gbmExprs)
samples <- pData(gbmExprs)[["subtype"]]
x <- eset[, samples=="MES"]
y <- eset[, samples=="PN"]
dgo <- marina(x, y, regulon=gbmTFregulon, per=100, cores=cores)
dgo
diggitMR(dgo)[1:5]
dgo <- marina(gbmExprs, pheno="subtype", group1="MES", group2="PN", regulon=gbmTFregulon, per=100, cores=cores)
dgo
diggitMR(dgo)[1:5]
x <- diggitClass(expset=gbmExprs, regulon=gbmTFregulon)
dgo <- marina(x, pheno="subtype", group1="MES", group2="PN", per=100, cores=cores)
dgo
diggitMR(dgo)[1:5]
```

---

|            |                           |
|------------|---------------------------|
| mutualInfo | <i>Mutual information</i> |
|------------|---------------------------|

---

## Description

This function estimates the mutual information between  $x$  and  $y$  given both are numeric vectors, between the columns of  $x$  if it is a numeric matrix, or between the columns of  $x$  and  $y$  if both are numeric matrixes

## Usage

```
mutualInfo(x, y = NULL, per = 0, pairwise = FALSE, bw = 100,
  cores = 1, verbose = TRUE)
```

## Arguments

|                       |                                                                                                                                 |
|-----------------------|---------------------------------------------------------------------------------------------------------------------------------|
| <code>x</code>        | Numeric vector or matrix                                                                                                        |
| <code>y</code>        | Optional numeric vector or matrix                                                                                               |
| <code>per</code>      | Integer indicating the number of permutations to compute p-values                                                               |
| <code>pairwise</code> | Logical, wether columns of $x$ and $y$ should be compared in a pairwise maner. $x$ and $y$ must have the same number of columns |
| <code>bw</code>       | Integer indicating the grid size for integrating the joint probability density                                                  |
| <code>cores</code>    | Integer indicating the number of cores to use (1 for Windows-based systems)                                                     |
| <code>verbose</code>  | Logical, whether progression bars should be shown                                                                               |

## Details

This function estimates the mutual information between continuous variables using a fix bandwidth implementation

## Value

Numeric value, vector or matrix of results

## Examples

```
x <- seq(0, pi, length=100)
y <- 5*sin(x)+rnorm(100)
cor.test(x, y)
mutualInfo(x, y, per=100)
```

---

plot,diggit-method      *Diggit plot*


---

## Description

This function generate plots for the diggit conditional analysis

## Usage

```
## S4 method for signature 'diggit'
plot(x, mr = NULL, cluster = NULL, sub = NULL, ...)
```

## Arguments

|         |                                                              |
|---------|--------------------------------------------------------------|
| x       | Diggit class object                                          |
| mr      | Optional vector of character strings indicating the MR names |
| cluster | Optional vector of cluster names                             |
| sub     | Optional sub-title for the plot                              |
| ...     | Additional parameters to pass to the plot function           |

## Value

Nothing, plots are generated in the default output device

## Examples

```
data(gbm.expression, package="diggitdata")
data(gbm.cnv, package="diggitdata")
data(gbm.aracne, package="diggitdata")
dobj <- diggitClass(expset=gbmExprs, cnv=gbmCNV, regulon=gbmTFregulon)
dobj <- fCNV(dobj)
dobj <- aqtl(dobj, mr=c("CEBPD", "STAT3"), fcnv.adjust="fdr", verbose=FALSE)
dobj <- conditional(dobj, pheno="subtype", group1="MES", group2="PN", mr="STAT3", verbose=FALSE)
plot(dobj, cluster="3")
```

---

print,diggit-method      *Basic methods for class diggit*


---

## Description

This document lists a series of basic methods for the class diggit

**Usage**

```
## S4 method for signature 'diggit'
print(x, pval = 0.05)

## S4 method for signature 'diggit'
show(object)

## S4 method for signature 'diggit'
exprs(object)

## S4 method for signature 'diggit'
diggitCNV(x)

## S4 method for signature 'diggit'
diggitRegulon(x)

## S4 method for signature 'diggit'
diggitMindy(x)

## S4 method for signature 'diggit'
diggitFcv(x)

## S4 method for signature 'diggit'
diggitMR(x)

## S4 method for signature 'diggit'
diggitViper(x)

## S4 method for signature 'diggit'
diggitAqtl(x)

## S4 method for signature 'diggit'
diggitConditional(x)

## S4 method for signature 'diggit'
summary(object)

## S4 method for signature 'diggit'
head(x, rows = 4, cols = 4)

## S4 method for signature 'diggit'
mindyFiltering(x, mr = 0.01, mr.adjust = c("none", "fdr",
      "bonferroni"))
```

**Arguments**

|      |                                                |
|------|------------------------------------------------|
| x    | Object of class diggit                         |
| pval | P-value threshold for the conditional analysis |

|           |                                                                                                                                                                     |
|-----------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| object    | Object of class diggit                                                                                                                                              |
| rows      | Integer indicating the maximum number of rows to show                                                                                                               |
| cols      | Integer indicating the maximum number of columns to show                                                                                                            |
| mr        | Either a numerical value between 0 and 1 indicating the p-value threshold for the Master Regulator (MR) selection, or a vector of character strings listing the MRs |
| mr.adjust | Character string indicating the multiple hypothesis test correction for the MRs                                                                                     |

## Value

print returns summary information about the diggit object

show returns summary information about the object of class diggit

exprs returns the ExpressionSet object containing the expression profile data

diggitCNV returns a matrix containing the CNV data

diggitRegulon returns a regulon object containing the transcriptional interactome

diggitMindy returns a regulon object containing the post-translational interactome

diggitFcnv returns a vector of p-values for the F-CNVs

diggitMR returns a vector of master regulators NES

diggitViper returns a matrix of VIPER results

diggitAqtl returns a matrix of aQTLs (p-value)

diggitConditional returns a list containing the conditional analysis results

summary returns the integrated results from the conditional analysis

head returns a list containing a reduced view for an object of class diggit

mindyFiltering returns a diggit class object with CNV and aQTL slots filtered to contain only MINDy post-translational modulators of the MRs

## Examples

```
data(gbm.expression, package="diggitdata")
data(gbm.cnv, package="diggitdata")
data(gbm.aracne, package="diggitdata")
dobj <- diggitClass(expset=gbmExprs, cnv=gbmCNV, regulon=gbmTFregulon)
print(dobj)
show(dobj)
exprs(dobj)
diggitCNV(dobj)[1:3, 1:3]
diggitRegulon(dobj)
diggitMindy(dobj)
diggitFcnv(dobj)
diggitMR(dobj)
diggitViper(dobj)
diggitAqtl(dobj)
diggitConditional(dobj)
head(dobj)
data(gbm.expression, package="diggitdata")
```

```
data(gbm.cnv, package="diggitdata")
data(gbm.mindy, package="diggitdata")
dobj <- diggitClass(expset=gbmExprs, cnv=gbmCNV, mindy=gbmMindy)
dobj <- fCNV(dobj)
dobj
dobj <- mindyFiltering(dobj, mr=c("STAT3", "CEBPD"))
dobj
```

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