

# Package ‘LAVAKnock’

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**Type** Package

**Title** Local genetic correlation via knockoffs reduces confounding due to cross-trait assortative mating

**Version** 0.1

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**Description** Functions for LAVAKnock to conduct local genetic correlation analysis via knockoffs.

**License** GPL-3

**Depends** R(>= 3.6.0)

**Imports**

SKAT, Matrix, MASS, SPAtest, CompQuadForm, irlba, matrixsampling, corpcor, GhostKnockoff

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**Repository** CRAN

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## R topics documented:

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Example.Ghostknockoff-generation

*Data example of LAVA-Knock Z-scores with Ghostknockoff generation.*

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### Description

This example dataset contains the Z-scores for two phenotypes and the genotype matrix of a unit: chr1:58387484-70992905. Due to computational and memory size constraints, we use 100 snps as an example to generation knockoff Z-scores using Ghostknockoff.

### Usage

```
data("Ghostknockoff_generation.example")
```

### Format

An object of class list of length 5.

### Examples

```
data(Ghostknockoff_generation.example)
chr=Ghostknockoff_generation.example$chr
unit_start=Ghostknockoff_generation.example$unit_start
unit_end=Ghostknockoff_generation.example$unit_end
print(paste0(chr,chr,":",unit_start,-,unit_end))
#"chr1:58387484-70992905"
Zscore_0_unit=Ghostknockoff_generation.example$Zscore_0_unit
dim(Zscore_0_unit)
G_unit=Ghostknockoff_generation.example$G_unit
dim(G_unit)
```

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Example.LAVAKnock

*Data example of LAVA-Knock knockoff filter for multiple testing.*

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### Description

This example dataset contains the LAVAKnock bivariateresults on 1,468 windows. Each window has an original p-values and M=5 knockoff p-values

### Usage

```
data("Results_LAVAKnock.example")
```

### Format

An object of class data.frame with 1468 rows and 7 columns.

### Examples

```
data("Results_LAVAKnock.example")
dim(Results_LAVAKnock.example) #1468    7
```

---

`Example.LAVAKnock_bivariate`

*Data example for LAVA-Knock bivariate local genetic correlation analysis on one window.*

---

### Description

This example dataset contains a 100-Kb window on chr1:64,344,227-64,444,227, its genotype matrix `G_window` with  $n=20000$  samples and  $p=10$  variants, with the original and  $M=5$  knockoff Z-scores of 10 variants and 2 phenotypes

### Usage

```
data("LAVAKnock_bivariate.example")
```

### Format

An object of class `list` of length 4.

### Examples

```
data("LAVAKnock_bivariate.example")
window=LAVAKnock_bivariate.example$window
window
G_window=LAVAKnock_bivariate.example$G_window
dim(G_window) #20000 10
Zscore_pheno1_window=LAVAKnock_bivariate.example$Zscore_pheno1_window
dim(Zscore_pheno1_window) #10 6
Zscore_pheno2_window=LAVAKnock_bivariate.example$Zscore_pheno2_window
```

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`Example.LAVAKnock_univariate`

*Data example for LAVA-Knock univariate heritability test on one locus.*

---

### Description

This example dataset contains a locus on chr1:64,344,227-65,894,184, its genotype matrix `G_locus` with  $n=20000$  samples and  $p=197$  variants, with the original Z-score of 197 variants and 2 phenotypes

### Usage

```
data("LAVAKnock_univariate.example")
```

### Format

An object of class `list` of length 3.

**Examples**

```
data("LAVAKnock_univariate.example")

Zscore_0=LAVAKnock_univariate.example$Zscore_0
G_locus=LAVAKnock_univariate.example$G_locus
locus=LAVAKnock_univariate.example$locus
print(locus)
dim(G_locus) #20000 197
dim(Zscore_0) #197 2
```

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Ghostknockoff\_generation

*Conduct LAVA-Knock Ghostknockoff generation for a unit.*

---

**Description**

This function generate the knockoff Z-scores for a unit using Ghostknockoff with (shrinkage) empirical LD matrix.

**Usage**

```
Ghostknockoff_generation(G_unit, Zscore_0_unit, LD.threshold = 0.75, n = 20000)
```

**Arguments**

G_unit	The genotype matrix or the reference genotype for a unit, a n*p matrix
Zscore_0_unit	Zscores of a unit, a p*2 matrix for two phenotypes
LD.threshold	LD.threshold for single-linkage hierarchical clustering to filter out highly correlated variants. The recommended level is 0.75.
n	sample size.

**Value**

Zscore_pheno1	5 knockoff Zscores for phenotype 1.
Zscore_pheno2	5 knockoff Zscores for phenotype 2.

**Examples**

```
data(Ghostknockoff_generation.example)
Zscore_0_unit=Ghostknockoff_generation.example$Zscore_0_unit
dim(Zscore_0_unit)
G_unit=Ghostknockoff_generation.example$G_unit
dim(G_unit)

Results_Ghostknockoff_generation=Ghostknockoff_generation(G_unit,
Zscore_0_unit,LD.threshold=0.75,n=20000)
dim(Results_Ghostknockoff_generation$Zscore_pheno1)
dim(Results_Ghostknockoff_generation$Zscore_pheno2)
```

LAVAKnock

*Conduct LAVA-Knock knockoff filter for multiple windows.***Description**

This function conducts the knockoff filter of LAVA-Knock on multiple windows and select significant windows.

**Usage**

```
LAVAKnock(
  M = 5,
  p0 = Results_LAVAKnock.example$pval.orginal,
  p_ko = cbind(Results_LAVAKnock.example$pval.knockoff1,
    Results_LAVAKnock.example$pval.knockoff2, Results_LAVAKnock.example$pval.knockoff3,
    Results_LAVAKnock.example$pval.knockoff4, Results_LAVAKnock.example$pval.knockoff5),
  fdr = 0.1,
  window_id = Results_LAVAKnock.example$window,
  Rej.Bound = 20000
)
```

**Arguments**

M	number of knockoffs. The recommended number is 5.
p0	p-values of the original Z-scores of multiple windows, which is a $w \times 1$ vector for $w$ windows.
p_ko	matrix of the p-values for $M$ knockoffs, which is a $w \times M$ vector for $w$ windows.
fdr	target FDR level. The recommended level is 0.1.
window_id	id of the windows considered for multiple testing.
Rej.Bound	calculate ratios for top Rej.Bound tau values. The recommended level is 20000.

**Value**

W	knockoff statistics for each window.
Qvalue1	Qvalue for each window.
W.threshold	threshold of the W statistics with target fdr level.
window_sign	Significant windows with q-values less then the fdr threshold.

**Examples**

```
Results_LAVAKnock=LAVAKnock(M=5,p0=Results_LAVAKnock.example$pval.orginal,
p_ko=cbind(Results_LAVAKnock.example$pval.knockoff1,
  Results_LAVAKnock.example$pval.knockoff2,
  Results_LAVAKnock.example$pval.knockoff3,
  Results_LAVAKnock.example$pval.knockoff4,
  Results_LAVAKnock.example$pval.knockoff5),
fdr = 0.1,window_id=Results_LAVAKnock.example$window,Rej.Bound=20000)
Results_LAVAKnock$W.threshold#1.071494
sum(Results_LAVAKnock$W>=Results_LAVAKnock$W.threshold) #278
sum(Results_LAVAKnock$Qvalue<=0.1) #278
```

```
print(paste0(length(Results_LAVAKnock$window_sign), detected windows under M=5 knockoffs))
#278 detected windows under M=5 knockoffs
```

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LAVAKnock_bivariate	<i>Conduct window-level LAVA-Knock bivariate local genetic correlation analysis.</i>
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## Description

This function conducts the window-level bivariate local genetic correlation test on one window.

## Usage

```
LAVAKnock_bivariate(
  Zscore_pheno1_window = Zscore_pheno1_window,
  Zscore_pheno2_window = Zscore_pheno2_window,
  G_window = G_window,
  chr = chr,
  window_start,
  window_end,
  n = 20000,
  prune.thresh = 99
)
```

## Arguments

Zscore_pheno1_window	The original and M=5 knockoffs Z-scores of a window under phenotype 1, which is a $p \times 6$ matrix for $p$ variants.
Zscore_pheno2_window	The original and M=5 knockoffs Z-scores of a window under phenotype 2, which is a $p \times 6$ matrix for $p$ variants.
G_window	The genotype matrix for a window, which is a $n \times p$ matrix.
chr	chromosome.
window_start	window start.
window_end	window end.
n	sample size.
prune.thresh	Pruning threshold of singular value decomposition. The recommended level is to explain 99 percent of total variance.

## Value

rg.original	local genetic correlation estimate of original Z-score.
pval.original	bivariate p-value of local genetic correlation test for original Z-score.
rg.knockoff	local genetic correlation estimate of knockoff Z-score.
pval.knockoff	bivariate p-value of local genetic correlation test for knockoff Z-score.

## Examples

```
data("LAVAKnock_bivariate.example")
window=LAVAKnock_bivariate.example$window
G_window=LAVAKnock_bivariate.example$G_window
Zscore_pheno1_window=LAVAKnock_bivariate.example$Zscore_pheno1_window
Zscore_pheno2_window=LAVAKnock_bivariate.example$Zscore_pheno2_window
chr=window$chr
window_start=window$start
window_end=window$end
Results_LAVAKnock_bivariate_window=LAVAKnock_bivariate(Zscore_pheno1_window=Zscore_pheno1_window,
Zscore_pheno2_window=Zscore_pheno2_window,
G_window=G_window,chr=chr,window_start,window_end,n=20000,prune.thresh=99)
Results_LAVAKnock_bivariate_window
```

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LAVAKnock\_univariate    *Conduct loci-level univariate heritability test.*

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## Description

This function conducts the loci-level univariate heritability test on one locus.

## Usage

```
LAVAKnock_univariate(
  Zscore = Zscore_0,
  G_locus = G_locus,
  chr,
  locus_start,
  locus_end,
  n = 20000,
  prune.thresh = 99
)
```

## Arguments

Zscore	The original Z-score of a locus, which is a $p \times 2$ matrix for $p$ variants and 2 phenotypes.
G_locus	The genotype matrix or the reference genotype for a locus, which is a $n \times p$ matrix.
chr	chromosome.
locus_start	locus start.
locus_end	locus end.
n	sample size.
prune.thresh	Pruning threshold of singular value decomposition. The recommended level is to explain 99 percent of total variance.

**Value**

h2\_phe1.orginal  
                    heritability estimate of phenotype 1.  
h2\_phe2.orginal  
                    heritability estimate of phenotype 2.  
p\_uni\_phe1.orginal  
                    p-value of univariate heritability test of phenotype 1.  
p\_uni\_phe2.orginal  
                    p-value of univariate heritability test of phenotype 2.

**Examples**

```
data("LAVAKnock_univariate.example")
Zscore_0=LAVAKnock_univariate.example$Zscore_0
G_locus=LAVAKnock_univariate.example$G_locus
locus=LAVAKnock_univariate.example$locus
chr=locus$chr
locus_start=locus$start
locus_end=locus$stop
Results_univariate_locus=LAVAKnock_univariate(Zscore=Zscore_0,
G_locus=G_locus,chr,locus_start,locus_end,n=20000,prune.thresh=99)
Results_univariate_locus
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