

# Package ‘lori’

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**Type** Package

**Title** Imputation of Count Data using Side Information

**Version** 2.2.0

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**Description** Analysis, imputation, and multiple imputation of count data using covariates. LORI uses a log-linear model where main row and column effects are decomposed as regression terms on known covariates. A residual low-rank interaction term is also fitted. LORI returns estimates of covariate effects and interactions, as well as an imputed count table. The package also contains a multiple imputation procedure.

**License** GPL-3

**Encoding** UTF-8

**LazyData** true

**Depends** stats, data.table, rARPACK, svd

**Suggests** knitr, rmarkdown, testthat

**RoxygenNote** 6.1.1

**NeedsCompilation** no

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covmat	<i>covmat</i>
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### Description

**covmat**

### Usage

```
covmat(n, p, R = NULL, C = NULL, E = NULL, center = F)
```

### Arguments

n	number of rows
p	number of columns
R	nxK1 matrix of row covariates
C	nxK2 matrix of column covariates
E	(n+p)xK3 matrix of row-column covariates
center	boolean indicating whether the returned covariate matrix should be centered (for identifiability)

### Value

the joint product of R and C column-binded with E, a (np)x(K1+K2+K3) matrix in order row1col1, row2col1, ..., rowncol1, row1col2, row2col2, ..., rowncolp

### Examples

```
R <- matrix(rnorm(10), 5)
C <- matrix(rnorm(9), 3)
covs <- covmat(5,3,R,C)
```

cv.lori	<i>selection of the regularization parameters (lambda1 and lambda2) of the lori function by cross-validation</i>
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### Description

selection of the regularization parameters (lambda1 and lambda2) of the lori function by cross-validation

### Usage

```
cv.lori(Y, cov = NULL, intercept = T, reff = T, ceff = T,
rank.max = 5, N = 5, len = 20, prob = 0.2, algo = c("alt",
"mcgd"), thresh = 1e-05, maxit = 10, trace.it = F)
```

**Arguments**

Y	[matrix, data.frame] abundance table (nxp)
cov	[matrix, data.frame] design matrix (npxq)
intercept	[boolean] whether an intercept should be fitted, default value is FALSE
reff	[boolean] whether row effects should be fitted, default value is TRUE
ceff	[boolean] whether column effects should be fitted, default value is TRUE
rank.max	[integer] maximum rank of interaction matrix, default is 2
N	[integer] number of cross-validation folds
len	[integer] the size of the grid
prob	[numeric in (0,1)] the proportion of entries to remove for cross-validation
algo	type of algorithm to use, either one of "mcgd" (mixed coordinate gradient descent, adapted to large dimensions) or "alt" (alternating minimization, adapted to small dimensions)
thresh	[positive number] convergence threshold, default is 1e-5
maxit	[integer] maximum number of iterations, default is 100
trace.it	[boolean] whether information about convergence should be printed

**Value**

A list with the following elements

lambda1	regularization parameter estimated by cross-validation for nuclear norm penalty (interaction matrix)
lambda2	regularization parameter estimated by cross-validation for l1 norm penalty (main effects)
errors	a table containing the prediction errors for all pairs of parameters

**Examples**

```
X <- matrix(rnorm(20), 10)
Y <- matrix(rpois(10, 1:10), 5)
res <- cv.lori(Y, X, N=2, len=2)
```

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lori

*main function: analysis and imputation of incomplete count data tables using side information (row-column attributes).*

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**Description**

main function: analysis and imputation of incomplete count data tables using side information (row-column attributes).

## Usage

```
lori(Y, cov = NULL, lambda1 = NULL, lambda2 = NULL, intercept = T,
    reff = T, ceff = T, rank.max = 2, algo = c("alt", "mcgd"),
    thresh = 1e-05, maxit = 100, trace.it = F)
```

## Arguments

<code>Y</code>	[matrix, data.frame] count table (nxp).
<code>cov</code>	[matrix, data.frame] design matrix (np*q) in order row1xcol1,row2xcol2,...,rownxcol1,row1xcol2,row2xcol2
<code>lambda1</code>	[positive number] the regularization parameter for the interaction matrix.
<code>lambda2</code>	[positive number] the regularization parameter for the covariate effects.
<code>intercept</code>	[boolean] whether an intercept should be fitted, default value is FALSE
<code>reff</code>	[boolean] whether row effects should be fitted, default value is TRUE
<code>ceff</code>	[boolean] whether column effects should be fitted, default value is TRUE
<code>rank.max</code>	[integer] maximum rank of interaction matrix (smaller than min(n-1,p-1))
<code>algo</code>	type of algorithm to use, either one of "mcgd" (mixed coordinate gradient descent, adapted to large dimensions) or "alt" (alternating minimization, adapted to small dimensions)
<code>thresh</code>	[positive number] convergence tolerance of algorithm, by default 1e-6.
<code>maxit</code>	[integer] maximum allowed number of iterations.
<code>trace.it</code>	[boolean] whether convergence information should be printed

## Value

A list with the following elements

<code>X</code>	nxp matrix of log of expected counts
<code>alpha</code>	row effects
<code>beta</code>	column effects
<code>epsilon</code>	covariate effects
<code>theta</code>	nxp matrix of row-column interactions
<code>imputed</code>	nxp matrix of imputed counts
<code>means</code>	nxp matrix of expected counts ( $\exp(X)$ )
<code>cov</code>	npxK matrix of covariates

## Examples

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`mi.lori`*multiple imputation of count data using the lori model*

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**Description**

multiple imputation of count data using the lori model

**Usage**

```
mi.lori(Y, cov = NULL, lambda1 = NULL, lambda2 = NULL, M = 25,  
intercept = T, reff = T, ceff = T, rank.max = 5,  
algo = c("alt", "mcgd"), thresh = 1e-05, maxit = 1000,  
trace.it = F)
```

**Arguments**

Y	[matrix, data.frame] count table (nxp).
cov	[matrix, data.frame] design matrix (np*q) in order row1xcol1, row2xcol2, ..., rownxcol1, row1xcol2, row2xcol2
lambda1	[positive number] the regularization parameter for the interaction matrix.
lambda2	[positive number] the regularization parameter for the covariate effects.
M	[integer] the number of multiple imputations to perform
intercept	[boolean] whether an intercept should be fitted, default value is FALSE
reff	[boolean] whether row effects should be fitted, default value is TRUE
ceff	[boolean] whether column effects should be fitted, default value is TRUE
rank.max	[integer] maximum rank of interaction matrix (smaller than min(n-1,p-1))
algo	type of algorithm to use, either one of "mcgd" (mixed coordinate gradient descent, adapted to large dimensions) or "alt" (alternating minimization, adapted to small dimensions)
thresh	[positive number] convergence tolerance of algorithm, by default 1e-6.
maxit	[integer] maximum allowed number of iterations.
trace.it	[boolean] whether convergence information should be printed

**Value**

mi.imputed	a list of length M containing the imputed count tables
mi.alpha	a (Mxn) matrix containing in rows the estimated row effects (one row corresponds to one single imputation)
mi.beta	a (Mxp) matrix containing in rows the estimated column effects (one row corresponds to one single imputation)
mi.epsilon	a (Mxq) matrix containing in rows the estimated effects of covariates (one row corresponds to one single imputation)
mi.theta	a list of length M containing the estimated interaction matrices
mi.mu	a list of length M containing the estimated Poisson means
mi.y	list of bootstrapped count tables used for multiple imputation
Y	original incomplete count table

**Examples**

```
X <- matrix(rnorm(50), 25)
Y <- matrix(rpois(25, 1:25), 5)
res <- mi.lori(Y, X, 10, 10, 2)
```

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**pool.lori***aggregate lori multiple imputation results*

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**Description**

aggregate lori multiple imputation results

**Usage**

```
pool.lori(res.mi)
```

**Arguments**

**res.mi** a multiple imputation result from the function `mi.lori`

**Value**

<code>pool.impute</code>	a list containing the pooled means (mean) and variance (var) of the imputed values
<code>pool.alpha</code>	a list containing the pooled means (mean) and variance (var) of the row effects
<code>pool.beta</code>	a list containing the pooled means (mean) and variance (var) of the column effects
<code>pool.epsilon</code>	a list containing the pooled means (mean) and variance (var) of the covariate effects
<code>pool.theta</code>	a list containing the pooled means (mean) and variance (var) of the interactions

**Examples**

```
X <- matrix(rnorm(50), 25)
Y <- matrix(rpois(25, 1:25), 5)
res <- mi.lori(Y, X, 10, 10, 2)
poolres <- pool.lori(res)
```

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qut	automatic selection of nuclear norm regularization parameter
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## Description

automatic selection of nuclear norm regularization parameter

## Usage

```
qut(Y, cov, lambda2 = 0, q = 0.95, N = 100, reff = T, ceff = T)
```

## Arguments

Y	A matrix of counts (contingency table).
cov	A (np)xK matrix of K covariates about rows and columns
lambda2	A positive number, the regularization parameter for covariates main effects
q	A number between 0 and 1. The quantile of the distribution of \$lambda_QUT\$ to take.
N	An integer. The number of parametric bootstrap samples to draw.
reff	[boolean] whether row effects should be fitted, default value is TRUE
ceff	[boolean] whether column effects should be fitted, default value is TRUE

## Value

the value of \$lambda\_QUT\$ to use in LoRI.

## Examples

```
X = matrix(rnorm(30), 15)
Y = matrix(rpois(15, 1:15), 5)
lambda = qut(Y,X, 10, N=10)
```

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