Package 'fastmatrix'

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Type Package Title Fast Computation of some Matrices Useful in Statistics Version 0.5 Date 2023-04-17 **Author** Felipe Osorio [aut, cre] (https://orcid.org/0000-0002-4675-5201), Alonso Ogueda [aut] Maintainer Felipe Osorio <felipe.osorios@usm.cl> **Description** Small set of functions to fast computation of some matrices and operations useful in statistics and econometrics. Currently, there are functions for efficient computation of duplication, commutation and symmetrizer matrices with minimal storage requirements. Some commonly used matrix decompositions (LU and LDL), basic matrix operations (for instance, Hadamard, Kronecker products and the Sherman-Morrison formula) and iterative solvers for linear systems are also available. In addition, the package includes a number of common statistical procedures such as the sweep operator, weighted mean and covariance matrix using an online algorithm, linear regression (using Cholesky, QR, SVD, sweep operator and conjugate gradients methods), ridge regression (with optimal selection of the ridge parameter considering several procedures), functions to compute the multivariate skewness, kurtosis, Mahalanobis distance (checking the positive defineteness) and the Wilson-Hilferty transformation of chi squared variables. Furthermore, the package provides interfaces to C code callable by another C code from other R packages. **Depends** R(>= 3.5.0)License GPL-3 URL https://faosorios.github.io/fastmatrix/ **NeedsCompilation** yes LazyLoad yes Repository CRAN Date/Publication 2023-04-18 02:50:02 UTC **R** topics documented:

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Description

Multiplication of 3-dimensional arrays was first introduced by Bates and Watts (1980). More extensions and technical details can be found in Wei (1998).

Usage

```
array.mult(a, b, x)
```

Arguments

a	a numeric matrix.
b	a numeric matrix.
Χ	a three-dimensional array.

Details

Let $X = (x_{tij})$ be a 3-dimensional $n \times p \times q$ where indices t, i and j indicate face, row and column, respectively. The product Y = AXB is an $n \times r \times s$ array, with A and B are $r \times p$ and $q \times s$ matrices respectively. The elements of Y are defined as:

$$y_{tkl} = \sum_{i=1}^{p} \sum_{j=1}^{q} a_{ki} x_{tij} b_{jl}$$

Value

array.mult returns a 3-dimensional array of dimension $n \times r \times s$.

References

Bates, D.M., Watts, D.G. (1980). Relative curvature measures of nonlinearity. *Journal of the Royal Statistical Society, Series B* **42**, 1-25.

Wei, B.C. (1998). Exponential Family Nonlinear Models. Springer, New York.

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See Also

```
array, matrix, bracket.prod.
```

Examples

```
x <- array(0, dim = c(2,3,3)) # 2 x 3 x 3 array
x[,,1] <- c(1,2,2,4,3,6)
x[,,2] <- c(2,4,4,8,6,12)
x[,,3] <- c(3,6,6,12,9,18)

a <- matrix(1, nrow = 2, ncol = 3)
b <- matrix(1, nrow = 3, ncol = 2)

y <- array.mult(a, b, x) # a 2 x 2 x 2 array
y</pre>
```

asSymmetric

Force a matrix to be symmetric

Description

Force a square matrix x to be symmetric

Usage

```
asSymmetric(x, lower = TRUE)
```

Arguments

x a square matrix to be forced to be symmetric.

lower logical, should the upper (lower) triangle be replaced with the lower (upper) triangle?

Value

a square symmetric matrix.

```
a <- matrix(1:16, ncol = 4)
isSymmetric(a) # FALSE
a <- asSymmetric(a) # copy lower triangle into upper triangle</pre>
```

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bezier

Computation of Bezier curve

Description

Computes the Bezier curve based on n+1 control points using the De Casteljau's method.

Usage

```
bezier(x, y, ngrid = 200)
```

Arguments

x, y vector giving the coordinates of the control points. Missing values are deleted.

ngrid number of elements in the grid used to compute the smoother.

Details

Given p_0, p_1, \dots, p_n control points the Bezier curve is given by B(t) defined as

$$B(t) = \begin{pmatrix} x(t) \\ y(t) \end{pmatrix} = \sum_{k=0}^{n} \binom{n}{k} t^{k} (1-t)^{k} \boldsymbol{p}_{k}$$

where $t \in [0, 1]$. To evaluate the Bezier curve the De Casteljau's method is used.

Value

A list containing xgrid and ygrid elements used to plot the Bezier curve.

```
# a tiny example
x <- c(1.0, 0.25, 1.25, 2.5, 4.00, 5.0)
y <- c(0.5, 2.00, 3.75, 4.0, 3.25, 1.0)
plot(x, y, type = "o")
z <- bezier(x, y, ngrid = 50)
lines(z$xgrid, z$ygrid, lwd = 2, lty = 2, col = "red")
# other simple example
x <- c(4,6,4,5,6,7)
y <- 1:6
plot(x, y, type = "o")
z <- bezier(x, y, ngrid = 50)
lines(z$xgrid, z$ygrid, lwd = 2, lty = 2, col = "red")</pre>
```

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bracket.prod

Bracket product

Description

Bracket product of a matrix and a 3-dimensional array.

Usage

```
bracket.prod(a, x)
```

Arguments

a numeric matrix.

x a three-dimensional array.

Details

Let $X = (x_{tij})$ be a 3-dimensional $n \times p \times q$ array and A an $m \times n$ matrix, then Y = [A][X] is called the bracket product of A and X, that is an $m \times p \times q$ with elements

$$y_{tij} = \sum_{k=1}^{n} a_{tk} x_{kij}$$

Value

bracket.prod returns a 3-dimensional array of dimension $m \times p \times q$.

References

Wei, B.C. (1998). Exponential Family Nonlinear Models. Springer, New York.

See Also

```
array, matrix, array.mult.
```

```
x \leftarrow array(0, dim = c(2,3,3)) \# 2 \times 3 \times 3 array \\ x[,,1] \leftarrow c(1,2,2,4,3,6) \\ x[,,2] \leftarrow c(2,4,4,8,6,12) \\ x[,,3] \leftarrow c(3,6,6,12,9,18) \\ a \leftarrow arrix(1, nrow = 3, ncol = 2) \\ y \leftarrow bracket.prod(a, x) \# a 3 x 3 x 3 array \\ y
```

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cg

Solve linear systems using the conjugate gradients method

Description

Conjugate gradients (CG) method is an iterative algorithm for solving linear systems with positive definite coefficient matrices.

Usage

```
cg(a, b, maxiter = 200, tol = 1e-7)
```

Arguments

a	a symmetric positive definite matrix containing the coefficients of the linear system.
b	a vector of right-hand sides of the linear system.
maxiter	the maximum number of iterations. Defaults to 200
tol	tolerance level for stopping iterations.

Value

a vector with the approximate solution, the iterations performed are returned as the attribute 'iterations'.

Warning

The underlying C code does not check for symmetry nor positive definitiveness.

References

Golub, G.H., Van Loan, C.F. (1996). *Matrix Computations*, 3rd Edition. John Hopkins University Press.

Hestenes, M.R., Stiefel, E. (1952). Methods of conjugate gradients for solving linear equations. *Journal of Research of the National Bureau of Standards* **49**, 409-436.

See Also

```
jacobi, seidel, solve
```

```
a <- matrix(c(4,3,0,3,4,-1,0,-1,4), ncol = 3)
b <- c(24,30,-24)
z <- cg(a, b)
z # converged in 3 iterations</pre>
```

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cholupdate

Rank 1 update to Cholesky factorization

Description

function cholupdate, where R = chol(A) is the original Cholesky factorization of A, returns the upper triangular Cholesky factor of $A + xx^T$, with x a column vector of appropriate dimension.

Usage

```
cholupdate(r, x)
```

Arguments

- r a upper triangular matrix, the Cholesky factor of matrix a.
- x vector defining the rank one update.

References

Golub, G.H., Van Loan, C.F. (2013). *Matrix Computations*, 4th Edition. John Hopkins University Press.

See Also

chol

Examples

```
a <- matrix(c(1,1,1,1,2,3,1,3,6), ncol = 3)
r <- chol(a)
x <- c(0,0,1)
b <- a + outer(x,x)
r1 <- cholupdate(r, x)
r1
all(r1 == chol(b)) # TRUE</pre>
```

circulant

Form a symmetric circulant matrix

Description

Forms a symmetric circulant matrix using a backwards shift of its first column

Usage

```
circulant(x)
```

comm.info 9

Arguments

x the first column to form the circulant matrix.

Value

A symmetric circulant matrix.

Examples

```
x <- c(2,3,5,7,11,13)
circulant(x)
```

comm.info

Compact information to construct the commutation matrix

Description

This function provides the minimum information required to create the commutation matrix.

The commutation matrix is a square matrix of order mn that, for an $m \times n$ matrix A, transform vec(A) to $vec(A^T)$.

Usage

```
comm.info(m = 1, n = m, condensed = TRUE)
```

Arguments

m a positive integer row dimension.n a positive integer column dimension.

condensed logical. Information should be returned in compact form?

positive integer, column dimension.

Details

This function returns a list containing two vectors that represent an element of the commutation matrix and is accessed by the indexes in vectors row and col. This information is used by function comm.prod to do some operations involving the commutation matrix without forming it. This information also can be obtained using function commutation.

Value

n

A list containing the following elements:

row	vector of indexes, each entry represents the row index of the commutation matrix.
col	vector of indexes, each entry represents the column index of the commutation matrix. Only present if condensed = FALSE.
m	positive integer, row dimension.

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References

Magnus, J.R., Neudecker, H. (1979). The commutation matrix: some properties and applications. *The Annals of Statistics* **7**, 381-394.

See Also

```
commutation, comm.prod
```

Examples

```
z \leftarrow \text{comm.info}(m = 3, n = 2, \text{condensed} = \text{FALSE})
z \neq \text{where are the ones in commutation matrix of order '3,2'?}
K32 \leftarrow \text{commutation}(m = 3, n = 2, \text{matrix} = \text{TRUE})
K32 \neq \text{only recommended if m and n are very small}
```

comm.prod

Matrix multiplication envolving the commutation matrix

Description

Given the row and column dimensions of a commutation matrix K of order mn and a conformable matrix x, performs one of the matrix-matrix operations:

```
• Y = KX, if side = "left" and transposed = FALSE, or
```

- $oldsymbol{Y} = oldsymbol{K}^T oldsymbol{X},$ if side = "left" and transposed = TRUE, or
- $oldsymbol{Y} = oldsymbol{X} oldsymbol{K}, ext{ if side = "right" and transposed = FALSE, or}$
- $Y = XK^T$, if side = "right" and transposed = TRUE.

The main aim of comm.prod is to do this matrix multiplication without forming the commutation matrix.

Usage

```
comm.prod(m = 1, n = m, x = NULL, transposed = FALSE, side = "left")
```

Arguments

```
m a positive integer row dimension.

n a positive integer column dimension.

x numeric matrix (or vector).

transposed logical. Commutation matrix should be transposed?

side a string selecting if commutation matrix is pre-multiplying x, that is side =
```

"left" or post-multiplying x, by using side = "right".

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Details

Underlying Fortran code only uses information provided by comm.info to performs the matrix multiplication. The commutation matrix is **never** created.

See Also

commutation

Examples

```
K42 <- commutation(m = 4, n = 2, matrix = TRUE) x <- matrix(1:24, ncol = 3) y <- K42 %*% x z <- comm.prod(m = 4, n = 2, x) # K42 is not stored all(z == y) # matrices y and z are equal!
```

commutation

Commutation matrix

Description

This function returns the commutation matrix of order mn which transforms, for an $m \times n$ matrix A, vec(A) to $vec(A^T)$.

Usage

```
commutation(m = 1, n = m, matrix = FALSE, condensed = FALSE)
```

Arguments

m a positive integer row dimension.n a positive integer column dimension.

matrix a logical indicating whether the commutation matrix will be returned.

condensed logical. Information should be returned in compact form?

Details

This function is a wrapper function for the function comm.info. This function provides the minimum information required to create the commutation matrix. If option matrix = FALSE the commutation matrix is stored in two vectors containing the coordinate list of indexes for rows and columns. Option condensed = TRUE only returns vector of indexes for the rows of commutation matrix.

Warning: matrix = TRUE is **not** recommended, unless the order m **and** n be small. This matrix can require a huge amount of storage.

Value

Returns an mn by mn matrix (if requested).

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References

Magnus, J.R., Neudecker, H. (1979). The commutation matrix: some properties and applications. *The Annals of Statistics* **7**, 381-394.

Magnus, J.R., Neudecker, H. (2007). *Matrix Differential Calculus with Applications in Statistics and Econometrics*, 3rd Edition. Wiley, New York.

See Also

```
comm.info
```

Examples

```
z <- commutation(m = 100, condensed = TRUE)
object.size(z) # 40.6 Kb of storage

z <- commutation(m = 100, condensed = FALSE)
object.size(z) # 80.7 Kb of storage

K100 <- commutation(m = 100, matrix = TRUE) # time: < 2 secs
object.size(K100) # 400 Mb of storage, do not request this matrix!

# a small example
K32 <- commutation(m = 3, n = 2, matrix = TRUE)
a <- matrix(1:6, ncol = 2)
v <- K32 %*% vec(a)
all(vec(t(a)) == as.vector(v)) # vectors are equal!</pre>
```

corAR1

AR(1) Correlation Structure

Description

This function is a constructor for the corAR1 correlation matrix representing an autocorrelation structure of order 1.

Usage

```
corAR1(rho, p = 2)
```

Arguments

rho the value of the lag 1 autocorrelation, which must be between -1 and 1.

p dimension of the requested correlation matrix.

Value

Returns a p by p matrix.

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Examples

```
R < - corAR1(rho = 0.8, p = 5)
```

corCS

Compound Symmetry Correlation Structure

Description

This function is a constructor for the corCS correlation matrix representing a compound symmetry structure corresponding to uniform correlation.

Usage

```
corCS(rho, p = 2)
```

Arguments

rho the value of the correlation between any two correlated observations, which must

be between -1 and 1.

p dimension of the requested correlation matrix.

Value

Returns a p by p matrix.

Examples

```
R < - corCS(rho = 0.8, p = 5)
```

cov.MSSD

Mean Square Successive Difference (MSSD) estimator of the covariance matrix

Description

Returns a list containing the mean and covariance matrix of the data.

Usage

```
cov.MSSD(x)
```

Arguments

Х

a matrix or data frame. As usual, rows are observations and columns are variables.

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Details

This procedure uses the Holmes-Mergen method using the difference between each successive pairs of observations also known as Mean Square Successive Method (MSSD) to estimate the covariance matrix.

Value

A list containing the following named components:

mean an estimate for the center (mean) of the data.

cov the estimated covariance matrix.

References

Holmes, D.S., Mergen, A.E. (1993). Improving the performance of the T^2 control chart. *Quality Engineering* 5, 619-625.

See Also

cov and var.

Examples

```
x <- cbind(1:10, c(1:3, 8:5, 8:10))

z0 <- cov(x)

z0

z1 <- cov.MSSD(x)
```

cov.weighted

Weighted covariance matrices

Description

Returns a list containing estimates of the weighted mean and covariance matrix of the data.

Usage

```
cov.weighted(x, weights = rep(1, nrow(x)))
```

Arguments

x a matrix or data frame. As usual, rows are observations and columns are vari-

ables.

weights a non-negative and non-zero vector of weights for each observation. Its length

must equal the number of rows of x.

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Details

The covariance matrix is divided by the number of observations, which arise for instance, when we use the class of elliptical contoured distributions. This differs from the behaviour of function cov.wt.

Value

A list containing the following named components:

mean an estimate for the center (mean) of the data.
cov the estimated (weighted) covariance matrix.

References

Clarke, M.R.B. (1971). Algorithm AS 41: Updating the sample mean and dispersion matrix. *Applied Statistics* **20**, 206-209.

See Also

```
cov.wt, cov and var.
```

Examples

```
x <- cbind(1:10, c(1:3, 8:5, 8:10))
z0 <- cov.weighted(x) # all weights are 1
D2 <- Mahalanobis(x, center = z0$mean, cov = z0$cov)
p <- ncol(x)
wts <- (p + 1) / (1 + D2) # nice weights!
z1 <- cov.weighted(x, weights = wts)
z1</pre>
```

dupl.cross

Matrix crossproduct envolving the duplication matrix

Description

Given the order of two duplication matrices and a conformable matrix X, this function performs the operation: $Y = D_n^T X D_k$, where D_n and D_k are duplication matrices of order n and k, respectively.

Usage

```
dupl.cross(n = 1, k = n, x = NULL)
```

Arguments

- n order of the duplication matrix used pre-multiplying x.
- k order of the duplication matrix used post-multiplying x. By default k = n is used.
- x numeric matrix, this argument is required.

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Details

This function calls dupl.prod to performs the matrix multiplications required but without forming any duplication matrices.

See Also

```
dupl.prod
```

Examples

```
D2 <- duplication(n = 2, matrix = TRUE)
D3 <- duplication(n = 3, matrix = TRUE)
x <- matrix(1, nrow = 9, ncol = 4)
y <- t(D3) %*% x %*% D2

z <- dupl.cross(n = 3, k = 2, x) # D2 and D3 are not stored
all(z == y) # matrices y and z are equal!

x <- matrix(1, nrow = 9, ncol = 9)
z <- dupl.cross(n = 3, x = x) # same matrix is used to pre- and post-multiplying x
z # print result</pre>
```

dupl.info

Compact information to construct the duplication matrix

Description

This function provides the minimum information required to create the duplication matrix.

Usage

```
dupl.info(n = 1, condensed = TRUE)
```

Arguments

n order of the duplication matrix.

condensed logical. Information should be returned in compact form?

Details

This function returns a list containing two vectors that represent an element of the duplication matrix and is accessed by the indexes in vectors row and col. This information is used by function dupl.prod to do some operations involving the duplication matrix without forming it. This information also can be obtained using function duplication

dupl.prod 17

Value

A list containing the following elements:

row vector of indexes, each entry represents the row index of the duplication matrix.

Only present if condensed = FALSE.

col vector of indexes, each entry represents the column index of the duplication

matrix.

order of the duplication matrix.

See Also

```
duplication, dupl.prod
```

Examples

```
z <- dupl.info(n = 3, condensed = FALSE)
z # where are the ones in duplication of order 3?

D3 <- duplication(n = 3, matrix = TRUE)
D3 # only recommended if n is very small</pre>
```

dupl.prod

Matrix multiplication envolving the duplication matrix

Description

Given the order of a duplication and a conformable matrix X, performs one of the matrix-matrix operations:

```
ullet Y=DX, if side = "left" and transposed = FALSE, or
```

- $oldsymbol{Y} = oldsymbol{D}^T oldsymbol{X}, ext{ if side = "left" and transposed = TRUE, or}$
- ullet $oldsymbol{Y}=oldsymbol{X}oldsymbol{D},$ if side = "right" and transposed = FALSE, or
- $oldsymbol{Y} = oldsymbol{X} oldsymbol{D}^T,$ if side = "right" and transposed = TRUE,

where D is the duplication matrix of order n. The main aim of dupl.prod is to do this matrix multiplication without forming the duplication matrix.

Usage

```
dupl.prod(n = 1, x, transposed = FALSE, side = "left")
```

Arguments

n order of the duplication matrix.

x numeric matrix (or vector).

transposed logical. Duplication matrix should be transposed?

side a string selecting if duplication matrix is pre-multiplying x, that is side = "left"

or post-multiplying x, by using side = "right".

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Details

Underlying C code only uses information provided by dupl.info to performs the matrix multiplication. The duplication matrix is **never** created.

See Also

```
duplication
```

Examples

```
D4 <- duplication(n = 4, matrix = TRUE)
x <- matrix(1, nrow = 16, ncol = 2)
y <- crossprod(D4, x)

z <- dupl.prod(n = 4, x, transposed = TRUE) # D4 is not stored
all(z == y) # matrices y and z are equal!</pre>
```

duplication

Duplication matrix

Description

This function returns the duplication matrix of order n which transforms, for a symmetric matrix A, vech(A) into vec(A).

Usage

```
duplication(n = 1, matrix = FALSE, condensed = FALSE)
```

Arguments

n order of the duplication matrix.

matrix a logical indicating whether the duplication matrix will be returned.

condensed logical. Information should be returned in compact form?.

Details

This function is a wrapper function for the function dupl.info. This function provides the minimum information required to create the duplication matrix. If option matrix = FALSE the duplication matrix is stored in two vectors containing the coordinate list of indexes for rows and columns. Option condensed = TRUE only returns vector of indexes for the columns of duplication matrix.

Warning: matrix = TRUE is **not** recommended, unless the order n be small. This matrix can require a huge amount of storage.

Value

Returns an n^2 by n(n+1)/2 matrix (if requested).

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References

Magnus, J.R., Neudecker, H. (1980). The elimination matrix, some lemmas and applications. *SIAM Journal on Algebraic Discrete Methods* **1**, 422-449.

Magnus, J.R., Neudecker, H. (2007). *Matrix Differential Calculus with Applications in Statistics and Econometrics*, 3rd Edition. Wiley, New York.

See Also

```
dupl.info
```

Examples

equilibrate

Equilibration of a rectangular or symmetric matrix

Description

Equilibrate a rectangular or symmetric matrix using 2-norm.

Usage

```
equilibrate(x, scale = TRUE)
```

Arguments

```
x a numeric matrix.
scale a logical value, x must be scaled to norm unity?
```

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Value

For scale = TRUE, the equilibrated matrix. The scalings and an approximation of the condition number, are returned as attributes "scales" and "condition". If x is a rectangular matrix, only the columns are equilibrated.

Examples

frank

Frank matrix

Description

This function returns the Frank matrix of order n.

Usage

```
frank(n = 1)
```

Arguments

n

order of the Frank matrix.

Details

A Frank matrix of order n is a square matrix $\mathbf{F}_n = (f_{ij})$ defined as

$$f_{ij} = \begin{cases} n - j + 1, & i \le j, \\ n - j, & i = j + 1, \\ 0, & i \ge j + 2 \end{cases}$$

Value

Returns an n by n matrix.

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References

Frank, W.L. (1958). Computing eigenvalues of complex matrices by determinant evaluation and by methods of Danilewski and Wielandt. *Journal of the Society for Industrial and Applied Mathematics* **6**, 378-392.

Examples

```
F5 \leftarrow frank(n = 5)
det(F5) # equals 1
```

geomean

Geometric mean

Description

It calculates the geometric mean using a Fused-Multiply-and-Add (FMA) compensated scheme for accurate computation of floating-point product.

Usage

geomean(x)

Arguments

Χ

a numeric vector containing the sample observations.

Details

If x contains any non-positive values, geomean returns NA and a warning message is displayed.

The geometric mean is a measure of central tendency, which is defined as

$$G = \sqrt[n]{x_1 x_2 \dots x_n} = \left(\prod_{i=1}^n x_i\right)^{1/n}.$$

This procedure calculates the product required in the geometric mean safely using a compensated scheme as proposed by Graillat (2009).

Value

The geometric mean of the sample, a non-negative number.

References

Graillat, S. (2009). Accurate floating-point product and exponentiation. *IEEE Transactions on Computers* **58**, 994-1000.

Oguita, T., Rump, S.M., Oishi, S. (2005). Accurate sum and dot product. *SIAM Journal on Scientific Computing* **26**, 1955-1988.

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See Also

```
mean, median.
```

Examples

```
set.seed(149)
x <- rlnorm(1000)
mean(x) # 1.68169
median(x) # 0.99663
geomean(x) # 1.01688</pre>
```

hadamard

Hadamard product of two matrices

Description

This function returns the Hadamard or element-wise product of two matrices x and y, that have the same dimensions.

Usage

```
hadamard(x, y = x)
```

Arguments

```
x a numeric matrix or vector.
y a numeric matrix or vector.
```

Value

A matrix with the same dimension of x (and y) which corresponds to the element-by-element product of the two matrices.

References

Styan, G.P.H. (1973). Hadamard products and multivariate statistical analysis, *Linear Algebra and Its Applications* **6**, 217-240.

```
x <- matrix(rep(1:10, times = 5), ncol = 5)
y <- matrix(rep(1:5, each = 10), ncol = 5)
z <- hadamard(x, y)
z</pre>
```

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harris.test	Test for variance homogeneity of correlated variables

Description

Performs large-sample methods for testing equality of $p \ge 2$ correlated variables.

Usage

```
harris.test(x, test = "Wald")
```

Arguments

X	a matrix or data frame. As usual, rows are observations and columns are variables.
test	test statistic to be used. One of "Wald" (default), "log", "robust" or "log-robust".

Value

A list of class 'harris.test' with the following elements:

statistic	value of the statistic, i.e. the value of either Wald test, using the log-transformation, or distribution-robust versions of the test (robust and log-robust).
parameter	the degrees of freedom for the test statistic, which is chi-square distributed.
p.value	the p-value for the test.
estimate	the estimated covariance matrix.
method	a character string indicating what type of test was performed.

References

Harris, P. (1985). Testing the variance homogeneity of correlated variables. *Biometrika* **72**, 103-107.

```
x <- iris[,1:4]
z <- harris.test(x, test = "robust")
z</pre>
```

24 helmert

helmert

Helmert matrix

Description

This function returns the Helmert matrix of order n.

Usage

```
helmert(n = 1)
```

Arguments

n

order of the Helmert matrix.

Details

A Helmert matrix of order n is a square matrix defined as

$$\boldsymbol{H}_{n} = \begin{bmatrix} 1/\sqrt{n} & 1/\sqrt{n} & 1/\sqrt{n} & \dots & 1/\sqrt{n} \\ 1/\sqrt{2} & -1/\sqrt{2} & 0 & \dots & 0 \\ 1/\sqrt{6} & 1/\sqrt{6} & -2/\sqrt{6} & \dots & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots \\ \frac{1}{\sqrt{n(n-1)}} & \frac{1}{\sqrt{n(n-1)}} & \frac{1}{\sqrt{n(n-1)}} & \dots & -\frac{(n-1)}{\sqrt{n(n-1)}} \end{bmatrix}.$$

Helmert matrix is orthogonal and is frequently used in the analysis of variance (ANOVA).

Value

Returns an n by n matrix.

References

Lancaster, H.O. (1965). The Helmert matrices. *The American Mathematical Monthly* **72**, 4-12. Gentle, J.E. (2007). *Matrix Algebra: Theory, Computations, and Applications in Statistics*. Springer, New York.

```
n <- 1000
set.seed(149)
x <- rnorm(n)

H <- helmert(n)
object.size(H) # 7.63 Mb of storage
K <- H[2:n,]
z <- c(K %*% x)
sum(z^2) # 933.1736</pre>
```

is.lower.tri 25

```
# same that
(n - 1) * var(x)
```

is.lower.tri

Check if a matrix is lower or upper triangular

Description

Returns TRUE if the given matrix is lower or upper triangular matrix.

Usage

```
is.lower.tri(x, diag = FALSE)
is.upper.tri(x, diag = FALSE)
```

Arguments

x a matrix of other R object with length(dim(x)) = 2. diag logical. Should the diagonal be included?

Value

Check if a matrix is lower or upper triangular. You can also include diagonal to the check.

See Also

```
lower.tri,upper.tri
```

```
x <- matrix(rnorm(10 * 3), ncol = 3)
R <- chol(crossprod(x))
is.lower.tri(R)
is.upper.tri(R)</pre>
```

26 jacobi

jacobi

Solve linear systems using the Jacobi method

Description

Jacobi method is an iterative algorithm for solving a system of linear equations.

Usage

```
jacobi(a, b, start, maxiter = 200, tol = 1e-7)
```

Arguments

a a square numeric matrix containing the coefficients of the linear system.

b a vector of right-hand sides of the linear system.

start a vector for initial starting point.

maxiter the maximum number of iterations. Defaults to 200

tol tolerance level for stopping iterations.

Details

Let D, L, and U denote the diagonal, lower triangular and upper triangular parts of a matrix A. Jacobi's method solve the equation Ax = b, iteratively by rewriting Dx + (L + U)x = b. Assuming that D is nonsingular leads to the iteration formula

$$x^{(k+1)} = -D^{-1}(L+U)x^{(k)} + D^{-1}b$$

Value

a vector with the approximate solution, the iterations performed are returned as the attribute 'iterations'.

References

Golub, G.H., Van Loan, C.F. (1996). *Matrix Computations*, 3rd Edition. John Hopkins University Press.

See Also

seidel

```
a <- matrix(c(5,-3,2,-2,9,-1,3,1,-7), ncol = 3)
b <- c(-1,2,3)
start <- c(1,1,1)
z <- jacobi(a, b, start)
z # converged in 15 iterations</pre>
```

JarqueBera.test 27

JarqueBera.test	Jarque-Bera test for univariate normality	

Description

Performs an omnibus test for univariate normality.

Usage

```
JarqueBera.test(x, test = "DH")
```

Arguments

x a numeric vector containing the sample observations.

test test statistic to be used. One of "DH" (Doornik-Hansen, the default), "JB"

(Jarque-Bera), "ALM" (Adjusted Lagrange multiplier).

Value

A list of class 'JarqueBera.test' with the following elements:

statistic value of the statistic, i.e. the value of either Doornik-Hansen, Jarque-Bera, or

Adjusted Lagrange multiplier test.

parameter the degrees of freedom for the test statistic, which is chi-square distributed.

p. value the p-value for the test.

skewness the estimated skewness coefficient. kurtosis the estimated kurtosis coefficient.

method a character string indicating what type of test was performed.

References

Doornik, J.A., Hansen, H. (2008). An omnibus test for univariate and multivariate normality. *Oxford Bulletin of Economics and Statistics* **70**, 927-939.

Jarque, C.M., Bera, A.K. (1980). Efficient tests for normality, homoscedasticity and serial independence of regression residuals. *Economics Letters* **6**, 255-259.

Urzua, C.M. (1996). On the correct use of omnibus tests for normality. *Economics Letters* 53, 247-251.

```
set.seed(149)
x <- rnorm(100)
z <- JarqueBera.test(x, test = "DH")
z
set.seed(173)</pre>
```

28 kronecker.prod

```
x <- runif(100)
z <- JarqueBera.test(x, test = "DH")
z</pre>
```

kronecker.prod

Kronecker product on matrices

Description

Computes the kronecker product of two matrices, x and y.

Usage

```
kronecker.prod(x, y = x)
```

Arguments

x a numeric matrix or vector.

y a numeric matrix or vector.

Details

Let X be an $m \times n$ and Y a $p \times q$ matrix. The $mp \times nq$ matrix defined by

$$\left[\begin{array}{ccc} x_{11}Y & \dots & x_{1n}Y \\ \vdots & & \vdots \\ x_{m1}Y & \dots & x_{mn}Y \end{array}\right],$$

is called the $Kronecker\ product$ of X and Y.

Value

An array with dimensions dim(x) * dim(y).

References

Magnus, J.R., Neudecker, H. (2007). *Matrix Differential Calculus with Applications in Statistics and Econometrics*, 3rd Edition. Wiley, New York.

See Also

kronecker function from base package is based on outer. Our C version is slightly faster.

krylov 29

Examples

```
# block diagonal matrix:
a <- diag(1:3)
b <- matrix(1:4, ncol = 2)
kronecker.prod(a, b)

# examples with vectors
ones <- rep(1, 4)
y <- 1:3
kronecker.prod(ones, y) # 12-dimensional vector
kronecker.prod(ones, t(y)) # 3 x 3 matrix</pre>
```

krylov

Computes a Krylov matrix

Description

Given A an n by n real matrix and an n-vector b, this function constructs the Krylov matrix K, where

$$\boldsymbol{K} = [\boldsymbol{b}, \boldsymbol{A}\boldsymbol{b}, \dots, \boldsymbol{A}^{m-1}\boldsymbol{b}].$$

Usage

```
krylov(a, b, m = ncol(a))
```

Arguments

a a numeric square matrix of order n by n for which the Krylov matrix is to be computed.

b a numeric vector of length n.

m length of the Krylov sequence.

Value

Returns an n by m matrix.

```
a <- matrix(c(1, 3, 2, -5, 1, 7, 1, 5, -4), ncol = 3, byrow = TRUE)
b <- c(1, 1, 1)
k <- krylov(a, b, m = 4)
k
```

30 kurtosis

kurtosis

Mardia's multivariate skewness and kurtosis coefficients

Description

Functions to compute measures of multivariate skewness (b_{1p}) and kurtosis (b_{2p}) proposed by Mardia (1970).

$$b_{1p} = \frac{1}{n^2} \sum_{i=1}^n \sum_{j=1}^n ((\boldsymbol{x}_i - \overline{\boldsymbol{x}})^T \boldsymbol{S}^{-1} (\boldsymbol{x}_j - \overline{\boldsymbol{x}}))^3,$$

and

$$b_{2p} = \frac{1}{n} \sum_{i=1}^{n} ((\boldsymbol{x}_i - \overline{\boldsymbol{x}})^T \boldsymbol{S}^{-1} (\boldsymbol{x}_j - \overline{\boldsymbol{x}}))^2.$$

Usage

kurtosis(x)

skewness(x)

Arguments

Х

matrix of data with, say, p columns.

References

Mardia, K.V. (1970). Measures of multivariate skewness and kurtosis with applications. *Biometrika* **57**, 519-530.

Mardia, K.V., Zemroch, P.J. (1975). Algorithm AS 84: Measures of multivariate skewness and kurtosis. *Applied Statistics* **24**, 262-265.

```
setosa <- iris[1:50,1:4]
kurtosis(setosa)
skewness(setosa)</pre>
```

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ldl

The LDL decomposition

Description

Compute the LDL decomposition of a real symmetric matrix.

Usage

ldl(x)

Arguments

Х

a symmetric numeric matrix whose LDL decomposition is to be computed.

Value

The factorization has the form $X = LDL^T$, where D is a diagonal matrix and L is unitary lower triangular.

The LDL decomposition of x is returned as a list with components:

lower the unitary lower triangular factor L.

d a vector containing the diagonal elements of D.

References

Golub, G.H., Van Loan, C.F. (1996). *Matrix Computations*, 3rd Edition. John Hopkins University Press.

See Also

chol

```
a <- matrix(c(2,-1,0,-1,2,-1,0,-1,1), ncol = 3)
z <- ldl(a)
z # information of LDL factorization

# computing det(a)
prod(z$d) # product of diagonal elements of D

# a non-positive-definite matrix
m <- matrix(c(5,-5,-5,3), ncol = 2)
try(chol(m)) # fails
ldl(m)</pre>
```

32 lu

lu

The LU factorization of a square matrix

Description

lu computes the LU factorization of a matrix.

Usage

```
lu(x)
## Default S3 method:
lu(x)
## S3 method for class 'lu'
solve(a, b, ...)
is.lu(x)
```

Arguments

x a square numeric matrix whose LU factorization is to be computed.

a an LU factorization of a square matrix.

b a vector or matrix of right-hand sides of equations.

... further arguments passed to or from other methods

Details

The LU factorization plays an important role in many numerical procedures. In particular it is the basic method to solve the equation Ax = b for given matrix A, and vector b.

```
solve.lu is the method for solve for lu objects.
```

```
is.lu returns TRUE if x is a list and inherits from "lu".
```

Unsuccessful results from the underlying LAPACK code will result in an error giving a positive error code: these can only be interpreted by detailed study of the Fortran code.

Value

The LU factorization of the matrix as computed by LAPACK. The components in the returned value correspond directly to the values returned by DGETRF.

1u a matrix with the same dimensions as x. The upper triangle contains the U of

the decomposition and the strict lower triangle contains information on the $m{L}$ of

the factorization.

pivot information on the pivoting strategy used during the factorization.

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Note

To compute the determinant of a matrix (do you *really* need it?), the LU factorization is much more efficient than using eigenvalues (eigen). See det.

LAPACK uses column pivoting and does not attempt to detect rank-deficient matrices.

References

Anderson. E., Bai, Z., Bischof, C., Blackford, S., Demmel, J., Dongarra, J., Du Croz, J., Greenbaum, A., Hammarling, S., McKenney, A. Sorensen, D. (1999). *LAPACK Users' Guide*, 3rd Edition. SIAM.

Golub, G.H., Van Loan, C.F. (1996). *Matrix Computations*, 3rd Edition. John Hopkins University Press.

See Also

extractL, extractU, constructX for reconstruction of the matrices, lu2inv

Examples

```
a <- matrix(c(3,2,6,17,4,18,10,-2,-12), ncol = 3)
z <- lu(a)
z # information of LU factorization

# computing det(a)
prod(diag(z$lu)) # product of diagonal elements of U

# solve linear equations
b <- matrix(1:6, ncol = 2)
solve(z, b)</pre>
```

lu-methods

Reconstruct the L, U, or X Matrices from an LU object

Description

Returns the original matrix from which the object was constructed or the components of the factorization.

Usage

```
constructX(x)
extractL(x)
extractU(x)
```

Arguments

x object representing an LU factorization. This will typically have come from a previous call to lu.

34 lu2inv

Value

construct X returns X, the original matrix from which the lu object was constructed (because of the pivoting the X matrix is not exactly the product between L and U).

```
extractL returns oldsymbol{L}. This may be pivoted.
```

extractU returns $oldsymbol{U}$.

See Also

lu.

Examples

```
a <- matrix(c(10,-3,5,-7,2,-1,0,6,5), ncol = 3)
z <- lu(a)
L <- extractL(z)
L
U <- extractU(z)
U
X <- constructX(z)
all(a == X)</pre>
```

lu2inv

Inverse from LU factorization

Description

Invert a square matrix from its LU factorization.

Usage

```
lu2inv(x)
```

Arguments

Χ

object representing an LU factorization. This will typically have come from a previous call to lu.

Value

The inverse of the matrix whose LU factorization was given.

Unsuccessful results from the underlying LAPACK code will result in an error giving a positive error code: these can only be interpreted by detailed study of the Fortran code.

Source

This is an interface to the LAPACK routine DGETRI. LAPACK is from https://netlib.org/lapack/ and its guide is listed in the references.

Mahalanobis 35

References

Anderson. E., Bai, Z., Bischof, C., Blackford, S., Demmel, J., Dongarra, J., Du Croz, J., Greenbaum, A., Hammarling, S., McKenney, A. Sorensen, D. (1999). *LAPACK Users' Guide*, 3rd Edition. SIAM.

Golub, G.H., Van Loan, C.F. (1996). *Matrix Computations*, 3rd Edition. John Hopkins University Press.

See Also

lu, solve.

Examples

```
a <- matrix(c(3,2,6,17,4,18,10,-2,-12), ncol = 3)
z <- lu(a)
a %*% lu2inv(z)</pre>
```

Mahalanobis

Mahalanobis distance

Description

Returns the squared Mahalanobis distance of all rows in x and the vector μ = center with respect to Σ = cov. This is (for vector x) defined as

$$D^2 = (\boldsymbol{x} - \boldsymbol{\mu})^T \boldsymbol{\Sigma}^{-1} (\boldsymbol{x} - \boldsymbol{\mu})$$

Usage

Mahalanobis(x, center, cov, inverted = FALSE)

Arguments

x vector or matrix of data. As usual, rows are observations and columns are variables.

center mean vector of the distribution.

cov covariance matrix $(p \times p)$ of the distribution, must be positive definite.

inverted logical. If TRUE, cov is supposed to contain the *inverse* of the covariance matrix.

Details

Unlike function mahalanobis, the covariance matrix is factorized using the Cholesky decomposition, which allows to assess if cov is positive definite. Unsuccessful results from the underlying LAPACK code will result in an error message.

See Also

cov, mahalanobis

36 matrix.inner

Examples

```
x <- cbind(1:6, 1:3)
xbar <- colMeans(x)
S <- matrix(c(1,4,4,1), ncol = 2) # is negative definite
D2 <- mahalanobis(x, center = xbar, S)
all(D2 >= 0) # several distances are negative
## next command produces the following error:
## Covariance matrix is possibly not positive-definite
## Not run: D2 <- Mahalanobis(x, center = xbar, S)</pre>
```

matrix.inner

Compute the inner product between two rectangular matrices

Description

Computes the inner product between two rectangular matrices calling BLAS.

Usage

```
matrix.inner(x, y = x)
```

Arguments

```
x a numeric matrix.
y a numeric matrix.
```

Value

a real value, indicating the inner product between two matrices.

matrix.norm 37

matrix.norm

Compute the norm of a rectangular matrix

Description

Computes a matrix norm of x using LAPACK. The norm can be the one ("1") norm, the infinity ("inf") norm, the Frobenius norm, the maximum modulus ("maximum") among elements of a matrix, as determined by the value of type.

Usage

```
matrix.norm(x, type = "Frobenius")
```

Arguments

x a numeric matrix.

type character string, specifying the *type* of matrix norm to be computed. A character

indicating the type of norm desired.

"1" specifies the **one** norm, (maximum absolute column sum);

"Inf" specifies the **inf**inity norm (maximum absolute row sum);

"Frobenius" specifies the **Frobenius** norm (the Euclidean norm of x treated as if it were a vector);

"maximum" specifies the **maximum** modulus of all the elements in x.

Details

 $As \ function \ norm \ in \ package \ \textbf{base}, \ method \ of \ matrix. \ norm \ calls \ the \ LAPACK \ function \ DLANGE.$

Note that the 1-, Inf- and maximum norm is faster to calculate than the Frobenius one.

Value

The matrix norm, a non-negative number.

Examples

38 mediancenter

```
n <- 1000
x <- .5 * diag(n) + 0.5 * matrix(1, nrow = n, ncol = n)
matrix.norm(x, type = "Frobenius")
matrix.norm(x, type = "1")
matrix.norm(x, type = "Inf")
matrix.norm(x, type = "maximum") # equal to 1</pre>
```

mediancenter

Mediancenter

Description

It calculates the mediancenter (or geometric median) of multivariate data.

Usage

```
mediancenter(x)
```

Arguments

Х

a matrix or data frame. As usual, rows are observations and columns are variables.

Details

The mediancenter for a sample of multivariate observations is computed using a steepest descend method combined with bisection. The mediancenter invariant to rotations of axes and is useful as a multivariate generalization of the median of univariate sample.

Value

A list containing the following named components:

median an estimate for the mediancenter of the data.

iter the number of iterations performed, it is negative if a degenerate solution is

found.

References

Gower, J.C. (1974). Algorithm AS 78: The mediancentre. Applied Statistics 23, 466-470.

See Also

```
cov.wt, median.
```

minkowski 39

Examples

```
x <- cbind(1:10, c(1:3, 8:5, 8:10))
z <- mediancenter(x)$median # degenerate solution
xbar <- colMeans(x)
plot(x, xlab = "", ylab = "")
points(x = xbar[1], y = xbar[2], pch = 16, col = "red")
points(x = z[1], y = z[2], pch = 3, col = "blue", lwd = 2)</pre>
```

minkowski

Computes the p-norm of a vector

Description

Computes a p-norm of vector x. The norm can be the one (p=1) norm, Euclidean (p=2) norm, the infinity $(p=\inf)$ norm. The underlying C or Fortran code is inspired on ideas of BLAS Level 1

Usage

```
minkowski(x, p = 2)
```

Arguments

x a numeric vector.

p a number, specifying the *type* of norm desired. Possible values include real number greater or equal to 1, or Inf, Default value is p=2.

Details

Method of minkowski for p = Inf calls idamax BLAS function. For other values, C or Fortran subroutines using unrolled cycles are called.

Value

The vector p-norm, a non-negative number.

Examples

```
# a tiny example
x <- rnorm(1000)
minkowski(x, p = 1)
minkowski(x, p = 1.5)
minkowski(x, p = 2)
minkowski(x, p = Inf)

x <- x / minkowski(x)
minkowski(x, p = 2) # equal to 1</pre>
```

40 moments

moments

Central moments

Description

It calculates up to fourth central moments (or moments about the mean), and the skewness and kurtosis coefficients using an online algorithm.

Usage

moments(x)

Arguments

Χ

a numeric vector containing the sample observations.

Details

The k-th central moment is defined as

$$m_k = \frac{1}{n} \sum_{i=1}^n (x_i - \overline{x})^k.$$

In particular, the second central moment is the variance of the sample. The sample skewness and kurtosis are defined, respectively, as

$$b_1 = \frac{m_3}{m_2^{3/2}}, \qquad b_2 = \frac{m_4}{m_2^2}.$$

Value

A list containing second, third and fourth central moments, and skewness and kurtosis coefficients.

References

Spicer, C.C. (1972). Algorithm AS 52: Calculation of power sums of deviations about the mean. *Applied Statistics* **21**, 226-227.

See Also

var.

Examples

```
set.seed(149)
x <- rnorm(1000)
z <- moments(x)
z</pre>
```

ols 41

	ols	Fit linear regression model	
--	-----	-----------------------------	--

Description

Returns an object of class "ols" that represents a linear model fit.

Usage

```
ols(formula, data, subset, na.action, method = "qr", tol = 1e-7, maxiter = 100,
  model = FALSE, x = FALSE, y = FALSE, contrasts = NULL, ...)
```

Arguments

an optional data frame, list or environment (or object coercible by as.data.frame to a data frame) containing the variables in the model. If not found in data, the variables are taken from environment(formula), typically the environment from which ols is called. subset an optional vector specifying a subset of observations to be used in the fitting
subset an optional vector specifying a subset of observations to be used in the fitting
process.
na.action a function which indicates what should happen when the data contain NAs. The default is set by the na.action setting of options, and is na.fail if that is unset.
method the least squares fitting method to be used; the options are "cg" (conjugate gradients), "chol", "qr" (the default), "svd" and "sweep".
tol tolerance for the conjugate gradients (gc) method. Default is tol = 1e-7.
The maximum number of iterations for the conjugate gradients (gc) method. Defaults to 100.
model, x, y logicals. If TRUE the corresponding components of the fit (the model frame, the model matrix, the response) are returned.
contrasts an optional list. See the contrasts.arg of model.matrix.default.
additional arguments (currently disregarded).

Value

ols returns an object of class "ols".

The function summary is used to obtain and print a summary of the results. The generic accessor functions coefficients, fitted.values and residuals extract various useful features of the value returned by ols.

An object of class "ols" is a list containing at least the following components:

```
coefficients a named vector of coefficients
```

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```
residuals
                    the residuals, that is response minus fitted values.
fitted.values
                   the fitted mean values.
RSS
                   the residual sum of squares.
                   a p \times p matrix of (unscaled) covariances of the \hat{\beta}_j, j = 1, \dots, p.
cov.unscaled
call
                   the matched call.
                    the terms object used.
terms
                    (only where relevant) the contrasts used.
contrasts
                   if requested, the response used.
                   if requested, the model matrix used.
Χ
mode1
                   if requested (the default), the model frame used.
```

See Also

```
ols.fit, lm, lsfit
```

Examples

ols.fit

Fitter Functions for Linear Models

Description

This function is a *switcher* among various numerical fitting functions (ols.fit.cg, ols.fit.chol, ols.fit.qr, ols.fit.svd and ols.fit.sweep). The argument method does the switching: "qr" for ols.fit.qr, etc. This should usually *not* be used directly unless by experienced users.

```
ols.fit(x, y, method = "qr", tol = 1e-7, maxiter = 100)
```

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Arguments

X	design matrix of dimension $n \times q$.
у	vector of observations of length n .
method	currently, methods "cg", "chol", "qr" (default), "svd" and "sweep" are supported.
tol	tolerance for the conjugate gradients (gc) method. Default is tol = 1e-7.
maxiter	The maximum number of iterations for the conjugate gradients (gc) method.

Defaults to 100.

Value

```
a list with components:
```

See Also

```
ols.fit.cg, ols.fit.chol, ols.fit.qr, ols.fit.svd, ols.fit.sweep.
```

Examples

```
set.seed(151)
n <- 100
p <- 2
x <- matrix(rnorm(n * p), n, p) # no intercept!
y <- rnorm(n)
fm <- ols.fit(x = x, y = y, method = "chol")
fm</pre>
```

ols.fit-methods

Fit a Linear Model

Description

Fits a linear model, returning the bare minimum computations.

```
ols.fit.cg(x, y, tol = 1e-7, maxiter = 100)
ols.fit.chol(x, y)
ols.fit.qr(x, y)
ols.fit.svd(x, y)
ols.fit.sweep(x, y)
```

power.method

Arguments

х, у	numeric vectors or matrices for the predictors and the response in a linear model. Typically, but not necessarily, x will be constructed by one of the fitting functions.
tol	tolerance for the conjugate gradients (gc) method. Default is tol = 1e-7.
maxiter	The maximum number of iterations for the conjugate gradients (gc) method. Defaults to 100.

Value

The bare bones of an ols object: the coefficients, residuals, fitted values, and some information used by summary.ols.

See Also

```
ols, ols.fit, lm
```

Examples

```
set.seed(151)
n <- 100
p <- 2
x <- matrix(rnorm(n * p), n, p) # no intercept!
y <- rnorm(n)
z <- ols.fit.chol(x, y)
z</pre>
```

power.method

Power method to approximate dominant eigenvalue and eigenvector

Description

The power method seeks to determine the eigenvalue of maximum modulus, and a corresponding eigenvector.

Usage

```
power.method(x, only.value = FALSE, maxiter = 100, tol = 1e-8)
```

Arguments

x a symmetric matrix.

only.value if TRUE, only the dominant eigenvalue is returned, otherwise both dominant

eigenvalue and eigenvector are returned.

maxiter the maximum number of iterations. Defaults to 100

tol a numeric tolerance.

ridge 45

Value

When only value is not true, as by default, the result is a list with components "value" and "vector". Otherwise only the dominan eigenvalue is returned. The performed number of iterations to reach convergence is returned as attribute "iterations".

See Also

eigen for eigenvalues and eigenvectors computation.

Examples

```
n <- 1000

x <- .5 * diag(n) + 0.5 * matrix(1, nrow = n, ncol = n)

# dominant eigenvalue must be (n + 1) / 2

z <- power.method(x, only.value = TRUE)
```

ridge

Ridge regression

Description

Fit a linear model by ridge regression, returning an object of class "ridge".

Usage

```
ridge(formula, data, subset, lambda = 1.0, method = "GCV", ngrid = 200, tol = 1e-07, maxiter = 50, na.action, model = FALSE, x = FALSE, y = FALSE, contrasts = NULL, ...)
```

Arguments

formula	an object of class "formula" (or one that can be coerced to that class): a symbolic description of the model to be fitted.
data	an optional data frame, list or environment (or object coercible by as.data.frame to a data frame) containing the variables in the model. If not found in data, the variables are taken from environment(formula), typically the environment from which ridge is called.
subset	an optional vector specifying a subset of observations to be used in the fitting process.
na.action	a function which indicates what should happen when the data contain NAs. The default is set by the na.action setting of options, and is na.fail if that is unset.
lambda	a scalar or vector of ridge constants. A value of 0 corresponds to ordinary least squares.

46 ridge

method the method for choosing the ridge parameter lambda. If method = "none", then

lambda is 'fixed'. If method = "GCV" (the default) then the ridge parameter is chosen automatically using the generalized cross validation (GCV) criterion. For method = "grid", optimal value of lambda is selected computing the GCV criterion over a grid. If method = "MSE" the optimal ridge parameter is selected minimizing the mean squared estimation error criterion, this is the ORPS1 sub-

routine by Lee (1987).

ngrid number of elements in the grid used to compute the GCV criterion. Only re-

quired if method = "grid" and lambda is a scalar.

tol tolerance for the optimization of the GCV criterion. Default is 1e-7.

maxiter maximum number of iterations. The default is 50.

model, x, y logicals. If TRUE the corresponding components of the fit (the model frame, the

model matrix, the response) are returned.

contrasts an optional list. See the contrasts.arg of model.matrix.default.

.. additional arguments to be passed to the low level regression fitting functions

(not implemented).

Details

ridge function fits in linear ridge regression **without** scaling or centering the regressors and the response. In addition, If an intercept is present in the model, its coefficient is penalized.)

Value

A list with the following components:

dims dimensions of model matrix.
coefficients a named vector of coefficients.
scale a named vector of coefficients.

fitted.values the fitted mean values.

residuals the residuals, that is response minus fitted values.

RSS the residual sum of squares.

edf the effective number of parameters.

GCV vector (if method = "grid") of GCV values.

HKB HKB estimate of the ridge constant.

LW LW estimate of the ridge constant.

lambda vector (if method = "grid") of lambda values; otherwise, for methods method

= "none", "GCV" or "MSE", the value of ridge parameter used by the algorithm.

optimal value of lambda with the minimum GCV (only relevant if method = "grid").

iterations number of iterations performed by the algorithm (only relevant if method =

"MSE").

call the matched call.
terms the terms object used.

rmnorm 47

contrasts (only where relevant) the contrasts used.	ontrasts ((only where releva	nt) the contrasts used.
---	------------	--------------------	-------------------------

y if requested, the response used.

x if requested, the model matrix used.

model if requested, the model frame used.

References

Golub, G.H., Heath, M., Wahba, G. (1979). Generalized cross-validation as a method for choosing a good ridge parameter. *Technometrics* **21**, 215-223.

Hoerl, A.E., Kennard, R.W., Baldwin, K.F. (1975). Ridge regression: Some simulations. *Communication in Statistics* **4**, 105-123.

Hoerl, A.E., Kennard, R.W. (1970). Ridge regression: Biased estimation of nonorthogonal problems. *Technometrics* **12**, 55-67.

Lawless, J.F., Wang, P. (1976). A simulation study of ridge and other regression estimators. *Communications in Statistics* **5**, 307-323.

Lee, T.S (1987). Algorithm AS 223: Optimum ridge parameter selection. *Applied Statistics* **36**, 112-118.

See Also

1m, ols

Examples

```
z <- ridge(GNP.deflator ~ ., data = longley, lambda = 4, method = "grid")
z # ridge regression on a grid over seq(0, 4, length = 200)
z <- ridge(GNP.deflator ~ ., data = longley)
z # ridge parameter selected using GCV (default)</pre>
```

rmnorm

Multivariate Normal Random Deviates

Description

Random number generation from the multivariate normal (Gaussian) distribution.

Usage

```
rmnorm(n = 1, mean = rep(0, nrow(Sigma)), Sigma = diag(length(mean)))
```

Arguments

n the number of samples requested

mean a vector giving the means of each variable
Sigma a positive-definite covariance matrix

48 seidel

Details

The function rmnorm is an interface to C routines, which make calls to subroutines from LAPACK. The matrix decomposition is internally done using the Cholesky decomposition. If Sigma is not non-negative definite then there will be a warning message.

Value

If n=1 a vector of the same length as mean, otherwise a matrix of n rows of random vectors.

References

Devroye, L. (1986). Non-Uniform Random Variate Generation. Springer-Verlag, New York.

See Also

rnorm

Examples

```
# covariance parameters
Sigma <- matrix(c(10,3,3,2), ncol = 2)
Sigma

# generate the sample
y <- rmnorm(n = 1000, Sigma = Sigma)
var(y)

# scatterplot of a random bivariate normal sample with mean
# vector zero and covariance matrix 'Sigma'
par(pty = "s")
plot(y, xlab = "", ylab = "")
title("bivariate normal sample", font.main = 1)

# QQ-plot of transformed distances
z <- wilson.hilferty(y)
par(pty = "s")
qqnorm(z, main = "Transformed distances Q-Q plot")
abline(c(0,1), col = "red", lwd = 2, lty = 2)</pre>
```

seidel

Solve linear systems using the Gauss-Seidel method

Description

Gauss-Seidel method is an iterative algorithm for solving a system of linear equations.

```
seidel(a, b, start, maxiter = 200, tol = 1e-7)
```

sherman.morrison 49

Arguments

a a square numeric matrix containing the coefficients of the linear system.

b a vector of right-hand sides of the linear system.

start a vector for initial starting point.

maxiter the maximum number of iterations. Defaults to 200

tol tolerance level for stopping iterations.

Details

Let D, L, and U denote the diagonal, lower triangular and upper triangular parts of a matrix A. Gauss-Seidel method solve the equation Ax = b, iteratively by rewriting (L + D)x + Ux = b. Assuming that L + D is nonsingular leads to the iteration formula

$$x^{(k+1)} = -(L+D)^{-1}Ux^{(k)} + (L+D)^{-1}b$$

Value

a vector with the approximate solution, the iterations performed are returned as the attribute 'iterations'.

References

Golub, G.H., Van Loan, C.F. (1996). *Matrix Computations*, 3rd Edition. John Hopkins University Press.

See Also

jacobi

Examples

```
a <- matrix(c(5,-3,2,-2,9,-1,3,1,-7), ncol = 3)
b <- c(-1,2,3)
start <- c(1,1,1)
z <- seidel(a, b, start)
z # converged in 10 iterations
```

sherman.morrison

Sherman-Morrison formula

Description

The Sherman-Morrison formula gives a convenient expression for the inverse of the rank 1 update $(A + bd^T)$ where A is a $n \times n$ matrix and b, d are n-dimensional vectors. Thus

$$(A + bd^{T})^{-1} = A^{-1} - \frac{A^{-1}bd^{T}A^{-1}}{1 + d^{T}A^{-1}b}.$$

50 sweep.operator

Usage

```
sherman.morrison(a, b, d = b, inverted = FALSE)
```

Arguments

a a numeric matrix.
b a numeric vector.
d a numeric vector.
inverted logical. If TRUE, a is supposed to contain its *inverse*.

Details

Value

a square matrix of the same order as a.

Examples

```
n <- 10
ones <- rep(1, n)
a <- 0.5 * diag(n)
z <- sherman.morrison(a, ones, 0.5 * ones)
7</pre>
```

sweep.operator

Gauss-Jordan sweep operator for symmetric matrices

Description

Perform the sweep operation (or reverse sweep) on the diagonal elements of a symmetric matrix.

Usage

```
sweep.operator(x, k = 1, reverse = FALSE)
```

Arguments

x a symmetric matrix.

k elements (if k is vector) of the diagonal which will be sweeped.

reverse logical. If reverse = TRUE the reverse sweep is performed.

symm.info 51

Details

The symmetric sweep operator is a powerful tool in computational statistics with uses in stepwise regression, conditional multivariate normal distributions, MANOVA, and more.

Value

a square matrix of the same order as x.

References

Goodnight, J.H. (1979). A tutorial on the SWEEP operator. The American Statistician 33, 149-158.

Examples

symm.info

Compact information to construct the symmetrizer matrix

Description

This function provides the information required to create the symmetrizer matrix.

Usage

```
symm.info(n = 1)
```

Arguments

n order of the symmetrizer matrix.

52 symm.prod

Details

This function returns a list containing vectors that represent an element of the symmetrizer matrix and is accessed by the indexes in vectors row, col and values contained in val. This information is used by function symm.prod to do some operations involving the symmetrizer matrix without forming it. This information also can be obtained using function symmetrizer.

Value

A list containing the following elements:

row	vector of indexes, each entry represents the row index of the symmetrizer matrix.
col	vector of indexes, each entry represents the column index of the symmetrizer matrix.
val	vector of values, each entry represents the value of the symmetrizer matrix at element given by row and col indexes.
order	order of the symmetrizer matrix.

See Also

```
symmetrizer, symm.prod
```

Examples

```
z <- symm.info(n = 3)
z # elements in symmetrizer matrix of order 3
N3 <- symmetrizer(n = 3, matrix = TRUE)
N3 # only recommended if n is very small</pre>
```

symm.prod

Matrix multiplication envolving the symmetrizer matrix

Description

Given the order of a symmetrizer matrix N of order n and a conformable matrix X, performs one of the matrix-matrix operations:

```
• oldsymbol{Y} = oldsymbol{N} oldsymbol{X}, 	ext{ if side = "left", or}
• oldsymbol{Y} = oldsymbol{X} oldsymbol{N}, 	ext{ if side = "right",}
```

The main aim of symm.prod is to do this matrix multiplication **without forming** the symmetrizer matrix.

```
symm.prod(n = 1, x = NULL, side = "left")
```

symmetrizer 53

Arguments

n	order of the symmetrizer matrix.
X	numeric matrix (or vector).
side	a string selecting if symmetrizer matrix is pre-multiplying $m{X}$, that is side =
	"left" or post-multiplying X , by using side = "right".

Details

Underlying C code only uses information provided by symm. info to performs the matrix multiplication. The symmetrizer matrix is **never** created.

See Also

```
symmetrizer
```

Examples

```
N4 <- symmetrizer(n = 4, matrix = TRUE)
x <- matrix(1:32, ncol = 2)
y <- N4 %*% x

z <- symm.prod(n = 4, x) # N4 is not stored
all(z == y) # matrices y and z are equal!
```

symmetrizer

Symmetrizer matrix

Description

This function returns the symmetrizer matrix of order n which transforms, for every $n \times n$ matrix A, vec(A) into $vec((A + A^T)/2)$.

Usage

```
symmetrizer(n = 1, matrix = FALSE)
```

Arguments

n order of the symmetrizer matrix.

matrix a logical indicating whether the symmetrizer matrix will be returned.

Details

This function is a wrapper function for the function symm.info. This function provides the information required to create the symmetrizer matrix. If option matrix = FALSE the symmetrizer matrix is stored in three vectors containing the coordinate list of indexes for rows, columns and the values.

Warning: matrix = TRUE is **not** recommended, unless the order n be small. This matrix can require a huge amount of storage.

54 vec

Value

Returns an n^2 by n^2 matrix (if requested).

References

Abadir, K.M., Magnus, J.R. (2005). Matrix Algebra. Cambridge University Press.

Magnus, J.R., Neudecker, H. (2007). *Matrix Differential Calculus with Applications in Statistics and Econometrics*, 3rd Edition. Wiley, New York.

See Also

```
symm.info
```

Examples

```
z <- symmetrizer(n = 100)
object.size(z) # 319 Kb of storage

N100 <- symmetrizer(n = 100, matrix = TRUE) # time: < 2 secs
object.size(N100) # 800 Mb of storage, do not request this matrix!

# a small example
N3 <- symmetrizer(n = 3, matrix = TRUE)
a <- matrix(rep(c(2,4,6), each = 3), ncol = 3)
a
b <- 0.5 * (a + t(a))
b
v <- N3 %*% vec(a)
all(vec(b) == as.vector(v)) # vectors are equal!</pre>
```

vec

Vectorization of a matrix

Description

This function returns a vector obtained by stacking the columns of X.

Usage

```
vec(x)
```

Arguments

Х

a numeric matrix.

Value

Let X be a n by m matrix, then vec(X) is a nm-dimensional vector.

vech 55

Examples

```
x <- matrix(rep(1:10, each = 10), ncol = 10)
x
y <- vec(x)
y</pre>
```

vech

Vectorization the lower triangular part of a square matrix

Description

This function returns a vector obtained by stacking the lower triangular part of a square matrix.

Usage

```
vech(x)
```

Arguments

Х

a square matrix.

Value

Let X be a n by n matrix, then $\operatorname{vech}(X)$ is a n(n+1)/2-dimensional vector.

Examples

```
x <- matrix(rep(1:10, each = 10), ncol = 10)
x
y <- vech(x)
y</pre>
```

whitening

Whitening transformation

Description

Applies the whitening transformation to a data matrix based on the Cholesky decomposition of the empirical covariance matrix.

```
whitening(x, Scatter = NULL)
```

56 wilson.hilferty

Arguments

x vector or matrix of data with, say, p columns.

Scatter covariance (or scatter) matrix $(p \times p)$ of the distribution, must be positive definite.

If NULL, the covariance matrix is estimated from the data.

Value

Returns the whitened data matrix $Z = XW^T$, where

$$\boldsymbol{W}^T \boldsymbol{W} = \boldsymbol{S}^{-1},$$

with S the empirical covariance matrix.

References

Kessy, A., Lewin, A., Strimmer, K. (2018). Optimal whitening and decorrelation. *The American Statistician* **72**, 309-314.

Examples

```
x <- iris[,1:4]
species <- iris[,5]
pairs(x, col = species) # plot of Iris
# whitened data
z <- whitening(x)
pairs(z, col = species) # plot of</pre>
```

wilson.hilferty

Wilson-Hilferty transformation

Description

Returns the Wilson-Hilferty transformation of random variables with chi-squared distribution.

Usage

```
wilson.hilferty(x)
```

Arguments

x vector or matrix of data with, say, p columns.

wilson.hilferty 57

Details

Let $F=D^2/p$ be a random variable, where D^2 denotes the squared Mahalanobis distance defined as

$$D^2 = (\boldsymbol{x} - \boldsymbol{\mu})^T \boldsymbol{\Sigma}^{-1} (\boldsymbol{x} - \boldsymbol{\mu})$$

Thus the Wilson-Hilferty transformation is given by

$$z = \frac{F^{1/3} - \left(1 - \frac{2}{9p}\right)}{\left(\frac{2}{9p}\right)^{1/2}}$$

and z is approximately distributed as a standard normal distribution. This is useful, for instance, in the construction of QQ-plots.

References

Wilson, E.B., and Hilferty, M.M. (1931). The distribution of chi-square. *Proceedings of the National Academy of Sciences of the United States of America* **17**, 684-688.

See Also

Mahalanobis

Examples

```
x <- iris[,1:4]
z <- wilson.hilferty(x)
par(pty = "s")
qqnorm(z, main = "Transformed distances Q-Q plot")
abline(c(0,1), col = "red", lwd = 2, lty = 2)</pre>
```

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