# Package "BTNorm"

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## 1 chebite

#### Description

Compute all the Chebysev-Hermite polnomials up to the degree 'k' for the given array 'xv' of length 'n'.

#### Usage

```
chebite(xv, k)
```

#### Arguments

xv a numeric vector with length n

k the degree of Chebysev-Hermite polnomials

#### **Details**

Hermite polynomials are a classical orthogonal polynomial sequence that arise in probability. They are named after Charles Hermite (1864) although they were studied earlier by Laplace (1810) and Chebyshev (1859). There are two different ways of defining Hermite polynomials: "probabilists' Hermite polynomials" and "physicists' Hermite polynomials". Here we used the probabilists' definition. Regier and Hamdan (1971) used Hermite polynomials to derive first and second order moments of  $Z_1$  and  $Z_2$  with single truncation on each normal distributed variable  $Z_i$ .

#### Value

The interative formula  $H_{n+1}(x) = x * H_n(x) - n * H_{n-1}(x)$  is used. The output array has dimension  $n \times k$ .

#### Reference

1. Laplace, P.S. (1810), Mem. CL. Sci. Math. Phys. Inst. France 58:279-347

2. Regier MH, Hamdan MA (1971) Correlation in a bivariate normal distribution with truncation in both variables. Aust J Stat 13(2):77-82

#### Example

```
xv<-c(1:5)
k<-5
chebite(xv,k)
     [,1] [,2] [,3] [,4] [,5]
[1,]
             -1
                  -4
                        0
                             20
[2,]
                  -2 -12 -14
[3,]
             7
                  12
                        8
        3
                          -36
[4,]
             14
                  44
                      120
                           260
```

## 2 cutpoints

5

23

100

408 1540

#### Description

Compute the breakpoints of both non-normal and normal bivariates

## Usage

[5,]

```
cutpoints(x1, x2, m, p)
```

#### Arguments

 $\mathbf{x1}$ : numeric vector of the observations for the first variable

x2: numeric vector of the observations for the second variable

p : number of breakpoints for piece-wise linear approximation of the second variable

#### Value

A list containing the following components is returned:

- cutpoints1: a data frame of two columns including the breakpoints for  $x_1$  and  $z_1$ .
- cutpoints2: a data frame of two columns including the breakpoints for  $x_2$  and  $z_2$ .
- m: number of breakpoints for piece-wise linear approximation of the first variable
- p: number of breakpoints for piece-wise linear approximation of the second variable

#### Example

```
x1<-rgamma(100,1,1)
x2<-rgamma(100,1,2)+x1
cutpoints(x1,x2,30,30)->cut
str(cut)
List of 4
  cutpoints1:'data.frame': 24 obs. of 2 variables:
    .. xcut1: num [1:24] 0.0129 0.1455 0.2782 0.4109 0.5436 ...
    .. zcut1: num [1:24] -2.472 -1.429 -0.969 -0.626 -0.425 ...
cutpoints2:'data.frame': 26 obs. of 2 variables:
    .. xcut2: num [1:26] 0.11 0.253 0.396 0.538 0.681 ...
    .. zcut2: num [1:26] -2.472 -1.429 -1.302 -1.01 -0.786 ...
m : num 30
p : num 30
```

## $3 \quad ecdf2$

#### Description

Compute an empirical cumulative distribution function based on corrected rank-based estimate:

$$\hat{F}_x(x_i) = \frac{r_i - 0.326}{n + 0.384}$$
 where  $r_i$  is the rank

#### Usage

ecdf2(x)

#### Arguments

 $\mathbf{x}$  numeric vector of the observations for ecdf2

#### Value

The ecdf2 returns a function that calculates empirical cumulative distribution for a given numeric vector  $\mathbf{x}$  based on corrected rank-based estimate:  $\hat{F}_x(x_i) = \frac{r_i - 0.326}{n + 0.384}$  where  $r_i$  is the rank.

#### Reference

1. Yu GH, Huang CC(2001) A distribution free plotting position. Stoch Environ Res Risk Assess 15:462-476

#### Example

```
x<-rnorm(200)
ecdf2(x)->funx
funx(0)
[1] 0.4425999
```

# 4 flipud

## Description

The function flips the rows of a matrix in the up-down direction.

## Usage

flipud(A)

## Arguments

 ${f A}$  a matrix with number of rows and columns larger than 1

## Value

flipud(A) returns A with rows flipped in the up-down direction.

## Example

x<-matrix(c(1:9),3,3)
x

[,1] [,2] [,3]

[1,] 1 4 7

[2,] 2 5 8

[3,] 3 6 9

## flipud(x)

[,1] [,2] [,3]

[1,] 3 6 9

[2,] 2 5 8

[3,] 1 4 7

## 5 invecdf2

## Description

Compute the inverse function of empirical cumulative distribution function based on corrected rank-based estimate:  $\hat{F}_x(x_i) = \frac{r_i - 0.326}{n + 0.384}$  where  $r_i$  is the rank.

## Usage

invecdf2(prob, x)

#### Arguments

prob a numeric value of probability, should be in interval [0,1]

x numeric vector of the observations for invcdf2

#### Value

The invecdf2 returns a value of the inverse function of the empirical cumulative distribution for a given numeric vector  $\mathbf{x}$  and a probability p. The empirical cumulative distribution function is based on corrected rank-based estimate:  $\hat{F}_x(x_i) = \frac{r_i - 0.326}{n + 0.384}$  where  $r_i$  is the rank. It needs function "ecdf2".

#### Example

```
x<-rnorm(100)
invecdf2(0.5,x)
[1] 0.0468675</pre>
```

## 6 iterrhox

#### Description

This function implements the iterative process to find the correct normal correlation coefficient  $\rho_z$  given the observations of the non-normal biavariate samples.

#### Usage

```
iterrhox(x1, x2, m, p, rho0, toler)
```

#### Arguments

rho correlation coefficient for  $z_1$  and  $z_2$ . The default value is -0.5

toler given tolerance of the iteration. The default value is 0.00001

**x1** numeric vector of the observations for the first variable

**x2** numeric vector of the observations for the second variable

#### Details

The  $\psi$  function that defines  $\rho_x$  from  $\rho_z$  is implemented iteratively, starting at a given initial  $\rho_0$ . To avoid stack of the algorithm at the bounds -1 and 1, we reflect and adjust the increment at the bounds to valid correlation coefficient values.

#### Value

A list containing the following components is returned:

- hist.info: a data frame of four columns recording the iteration history.
  - iterate: iteration number
  - rhox: the correlation of x calculated by  $\rho_x = \phi(\rho_z)$  in current value of  $\rho_z$
  - dif: the difference between  $\rho_x$  and  $\rho_z$  in current iteration
  - rho: the correlation of  $\rho_z$  in current iteration
- rho: the estimated value of  $\rho_z$
- toler: given tolerance of the iteration

## Example

```
x1<-rgamma(100,1,1)
x2<-rgamma(100,x1[5],1)
iterrhox(x1,x2,20,20)->est
    str(est)
List of 3
    hist.info:'data.frame': 9 obs. of 4 variables:
        .. iterate: num [1:9] 0 1 2 3 4 5 6 7 8
.. rhox : num [1:9] 0 -0.3668 0.0579 0.1743 0.2021 ...
```

```
.. dif : num [1:9] 0 0.57671 0.15202 0.03566 0.00787 ...
```

.. rho : num [1:9] -0.5 0.0767 0.2287 0.2644 0.2723 ...

rho : num 0.274 toler : num 1e-05

# 7 linprox

## Description

Give the estimated parameters of linear piece-wise approximation.

#### Usage

```
linprox(x1, x2, m, p, rho)
```

#### Arguments

```
x1 numeric vector of the observations for the first variable
```

**x2** numeric vector of the observations for the second variable

```
m number of breakpoints for x_1
```

p number of breakpoints for  $x_2$ 

rho correlation coefficient of two normal variables  $\mathbb{Z}_1$  and  $\mathbb{Z}_2$ 

## Value

A list containing the following components is returned:

- c0: parameter vectors of constant term of the linear interpolation at the breakpoints for transforming  $x_1$  to  $z_1$
- c1: parameter vectors of slope term of the linear interpolation at the breakpoints for transforming  $x_1$  to  $z_1$

- d0: parameter vectors of constant term of the linear interpolation at the breakpoints for transforming  $x_2$  to  $z_2$
- d1: parameter vectors of slope term of the linear interpolation at the breakpoints for transforming  $x_1$  to  $z_1$

#### Example

```
linprox(rnorm(100),rnorm(100),20,20,0.5)->res
str(res)
List of 4
  c0: num [1:19] -0.706 0.341 1.181 -0.259 -0.332 ...
  c1: num [1:19] 0.643 1.135 1.57 0.766 0.717 ...
  d0: num [1:19] -0.525 0.639 -0.855 0.368 -0.336 ...
  d1: num [1:19] 0.715 1.262 0.489 1.345 0.78 ...
```

## 8 mu

## Description

Calculate first moment of univariate truncated standard normal.

#### Usage

mu(a1, a2)

## Arguments

al left point of the truncated interval

a2 right point of the truncated interval

#### Value

It will report a number.

## 9 mu2

## Description

Calculate second moment of univariate truncated standard normal.

#### Usage

mu2(a1, a2)

## Arguments

al left point of the truncated interval

a2 right point of the truncated interval

#### Value

It will report a number.

## 10 mu12

## Description

Calculate first order joint moment of  $X_1$  and  $X_2$ 

#### Usage

```
mu12(rho, zcut1, zcut2, c0, c1, d0, d1)
```

#### Arguments

- ${f c0}$  : parameter vectors of constant term of the linear interpolation at the breakpoints for transforming  $x_1$  to  $z_1$
- c1 : parameter vectors of slope term of the linear interpolation at the breakpoints for transforming  $x_1$  to  $z_1$

 ${f d0}$  : parameter vectors of constant term of the linear interpolation at the breakpoints for transforming  $x_2$  to  $z_2$ 

 ${f d1}$  : parameter vectors of slope term of the linear interpolation at the breakpoints for transforming  $x_1$  to  $z_1$ 

 $\mathbf{zcut1}$ : a vector of breakpoints for  $z_1$ 

 $\mathbf{zcut2}$ : a vector of breakpoints for  $z_2$ 

rho : correlation coefficient of two normal variables  $\mathbb{Z}_1$  and  $\mathbb{Z}_2$ 

#### Value

It will report a number.

## Example

```
# need functions "linprox" and "cutpoints"
x1<-rgamma(100,1,1)
x2<-rgamma(100,1,2)+x1
cutpoints(x1,x2,30,30)->cut
cut$cutpoints1$zcut1->zcut1
cut$cutpoints2$zcut2->zcut2
rho<-0.5
linprox(x1,x2,30,30,rho)->res
res$c0->c0
res$c1->c1
res$d0->d0
res$d1->d1
mu12(rho,zcut1,zcut2,c0,c1,d0,d1)
[1] 1.428648
```

# 11 pbnorm

## Description

The function computes the double truncated standard normal joint probability for binormal  $(z_1, z_2)$  on a region  $D = (a_1, a_2) \times (b_1, b_2)$ 

#### Usage

```
pbnorm(a1, a2, b1, b2, rho)
```

### Arguments

```
al left point of the truncated interval for z_1
```

a2 right point of the truncated interval for  $z_1$ 

b<br/>1 left point of the truncated interval for  $z_2\,$ 

b2 right point of the truncated interval for  $z_2$ 

rho correlation coefficient for  $z_1$  and  $z_2$ 

#### Value

It will report a numeric value.

# 12 pbnormab

## Description

The function computes the double truncated standard normal joint probability for binormal  $(z_1, z_2)$  on a region  $D = (a, \infty) \times (b, \infty)$ .

#### Usage

pbnormab(a, b, rho)

#### **Arguments**

```
a left point of the truncated interval for z_1 b left point of the truncated interval for z_2 rho correlation coefficient for z_1 and z_2
```

#### Value

It will report a numeric value. Note that it is based on the function "pbnorm"

## 13 Ptrnormal

#### Description

Ptrnormal computes the double truncated standard normal joint distribution of two variables  $z_1 \& z_2$  at a truncation points given by the vectors  $\mathbf{av}$  for  $z_1$  and  $\mathbf{bv}$  for  $z_2$ .

#### Usage

Ptrnormal(rho, av, bv)

#### Arguments

```
rho correlation coefficient for z_1 and z_2 \mathbf{av} \ \text{vector of truncation points for} \ z_1: -\infty < av[1] < \ldots < av[n] < \infty \mathbf{bv} \ \text{vector of truncation points for} \ z_2: -\infty < bv[1] < \ldots < bv[n] < \infty
```

#### Value

 $(n+1)\times(m+1)$  matrix of joint pdf. The components of the matrix are ordered as follows:

$$(bv[0],bv[1]) \quad (bv[1],bv[2]) \quad ..... \quad (bv[m],bv[m+1]) \\ (av[0],av[1]) \quad p_{11} \quad p_{12} \quad ..... \quad p_{1,m+1} \\ (av[1],av[2]) \quad p_{21} \quad p_{22} \quad ..... \quad p_{2,m+1} \\ \\ .... \quad .... \quad ..... \quad ..... \\ (av[n],av[n+1]) \quad p_{n+1,1} \quad p_{n+1,2} \quad ..... \quad p_{n+1,m+1}$$

where  $av[0] = bv[0] = -\infty$  and  $av[n+1] = bv[m+1] = \infty$ 

#### Example

av<-seq(1:5)

bv < -seq(1:5)

rho<-0.5

Ptrnormal(rho,av,bv)

[1,] 9.626532e-09 6.142814e-08 1.238405e-07 7.652139e-08 1.441027e-08 8.247084e-10

[2,] 3.191339e-06 1.095124e-05 1.243541e-05 4.334775e-06 4.574095e-07 1.441027e-08

[3,] 3.101182e-04 5.653872e-04 3.657300e-04 7.258001e-05 4.334775e-06 7.652139e-08

[4,] 9.170596e-03 8.636871e-03 3.214478e-03 3.657300e-04 1.243541e-05 1.238405e-07

[5,] 8.665724e-02 4.003461e-02 8.636871e-03 5.653872e-04 1.095124e-05 6.142814e-08

[6,] 7.452036e-01 8.665724e-02 9.170596e-03 3.101182e-04 3.191339e-06 9.626532e-09

## 14 PEz1tronormal

#### Description

It computes the mean with respect to  $z_1$  of the truncated standard normal joint distribution of two variables  $z_1 \& z_2$  at the truncation points.

#### Usage

#### PEz1tronormal(rho, av, bv)

#### Arguments

```
rho correlation coefficient for z_1 and z_2 
av vector of truncation points for z_1:-\infty < av[1] < ... < av[n] < \infty
bv vector of truncation points for z_2:-\infty < bv[1] < ... < bv[n] < \infty
```

#### Value

 $(n+1)\times(m+1)$  matrix of marginal first moment of  $z_1$  according to the case of joint truncation.

## Example

```
av<-seq(1:5)
bv<-seq(1:5)
rho<-0.5
PEz1tronormal(rho,av,bv)</pre>
```

```
[,1] [,2] [,3] [,4] [,5] [,6]
```

```
[1,] 6.332613e-09 9.899219e-08 3.108052e-07 2.606828e-07 6.220675e-08 4.340199e-09
```

```
[2,] 1.871373e-06 1.711911e-05 3.057859e-05 1.456929e-05 1.958028e-06 7.535490e-08
```

[3,] 1.517582e-04 8.557272e-04 8.816918e-04 2.410100e-04 1.842373e-05 3.981953e-07

[4,] 3.270318e-03 1.264764e-02 7.606853e-03 1.201578e-03 5.253224e-05 6.418912e-07

[5,] 1.526172e-02 5.674673e-02 2.009475e-02 1.840336e-03 4.602113e-05 3.173500e-07

[6,] -2.606564e-01 1.177124e-01 2.094493e-02 1.000264e-03 1.334617e-05 4.958792e-08

## 15 PEz2tronormal

## Description

It computes the mean with respect to  $z_2$  of the truncated standard normal joint distribution of two variables  $z_1 \& z_2$  at the truncation points.

#### Usage

```
PEz2tronormal(rho, av, bv)
```

#### Arguments

```
rho correlation coefficient for z_1 and z_2 \mathbf{av} \ \text{vector of truncation points for} \ z_1: -\infty < av[1] < \ldots < av[n] < \infty \mathbf{bv} \ \text{vector of truncation points for} \ z_2: -\infty < bv[1] < \ldots < bv[n] < \infty
```

#### Value

 $(n+1)\times(m+1)$  matrix of marginal first moment of  $z_2$  according to the case of joint truncation.

#### Example

```
av < -seq(1:5)
bv < -seq(1:5)
rho<-0.5
PEz2tronormal(rho,av,bv)
[,1]
              [,2]
                           [,3]
                                         [,4]
                                                       [,5]
                                                                    [,6]
     4.958792e-08 1.027897e-06 4.122738e-07 1.029523e-07 1.924634e-08 4.340199e-09
[2,] 1.334617e-05 4.602113e-05 5.253224e-05 1.842373e-05 1.958028e-06 6.220675e-08
[3,] 1.000264e-03 1.840336e-03 1.201578e-03 2.410100e-04 1.456929e-05 2.606828e-07
[4,] 2.094493e-02 2.009475e-02 7.606853e-03 8.816918e-04 3.057859e-05 3.108052e-07
     1.177124e-01 5.674673e-02 1.264764e-02 8.557272e-04 1.711911e-05 9.899219e-08
[6,] -2.606564e-01 -1.257231e-01 -3.389902e-02 -3.071755e-03 -9.738626e-05 6.332613e-09
```

## 16 PEz1z2trnormal

#### Description

Compute the joint first moment of the truncated standard normal joint distribution of two variables  $z_1 \& z_2$  at the truncation points.

#### Usage

PEz1z2trnormal(rho, av, bv)

#### Arguments

rho correlation coefficient for  $z_1$  and  $z_2$ 

av vector of truncation points for  $z_1 : -\infty < av[1] < ... < av[n] < \infty$ 

**bv** vector of truncation points for  $z_2 : -\infty < bv[1] < ... < bv[n] < \infty$ 

#### Value

 $(n+1) \times (m+1)$  matrix of the joint first moment of the truncated standard normal joint distribution of two variables  $z_1 \& z_2$  at the truncation points.

#### Example

```
av<-seq(1:5)
```

bv < -seq(1:5)

rho<-0.5

PEz1z2trnomoral(rho,av,bv)

- [1,] 1.105341e-07 5.873451e-07 1.644040e-06 1.232241e-06 2.582269e-07 2.266325e-08
- [2,] 9.439130e-06 6.967445e-05 1.268401e-04 6.120275e-05 8.300211e-06 3.221917e-07
- [3,] 5.680910e-04 2.733875e-03 2.868134e-03 7.926274e-04 6.120275e-05 1.337612e-06
- [4,] 7.764350e-03 2.949761e-02 1.798312e-02 2.868134e-03 1.268401e-04 1.571663e-06
- [5,] 7.778121e-03 8.250861e-02 2.949761e-02 2.733875e-03 6.967445e-05 4.954605e-07
- [6,] 2.713888e-01 8.358639e-03 6.115831e-03 5.398263e-04 1.298974e-05 1.105341e-07