# Package 'npcopTest' 

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Type Package
Title Non Parametric Test for Detecting Changes in the Copula
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Description A non parametric test for change points detection in the dependence between the components of multivariate data, with or without (multiple) changes in the marginal distribu-
tions. The full details, justification and examples are pub-
lished in Rohmer (2016) [doi:10.1016/j.spl.2016.06.026](doi:10.1016/j.spl.2016.06.026).
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CopTestdm $\quad$| Test for break detection in copula with change-point known in the |
| :--- |
| marginal cumulative distributions |

## Description

Give the p-value of the test based on the sequential empirical copula process when a break occurs in the marginal cumulative distributions at time m known.

## Usage

CopTestdm (X, b=1, M=1000)

## Arguments

$\mathrm{X} \quad \mathrm{a}$ (non-empty) numeric matrix of $d$-dimensional data values, greater than 2. Each row of the matrix contains one mutlivariate data.
M a strictly positive integer (default $M=1000$ ) specifying the number of bootstrap repetitions. A sequence of i.i.d. normal multipliers is generated. For no independent or normal multipliers, you also can specify the matrix of multipliers as $M$. The specified matrix is required to have an identical number of rows than $X$.
b
a single value or a vector of real values on ( 0,1$]$ indicating the location(s) of the potential break time(s) in marginal cumulative distribution functions. You can specify $b=1$ (default) for any break time. In this case, the test corresponds to the test described in the third reference using the hat version of bootstrap replications.

## Details

Note that the e.c.d.f.s $F_{k: l, j}$ appearing in the construction of pseudo-values (as defined in the section 2 of the first reference) evaluated from the sub-samble $X_{k j}, \ldots, X_{l j}$ are multiplied by $\frac{l-k+1}{l-k+2}$. Discussions about this subject can be found in the third reference. For serially dependent data, you need to specify dependent multipliers, see the second and third reference for details.

## Value

A list with class htest containing the following components:
$m \quad$ the value of the potential break times in marginal cumulative distribution functions.
data.name a character string giving the name of the data.
method a character string indicating what type of change-point test was performed.
$p$.value the estimated $p$-value for the test.
statistic the value of the statistic $S_{n m}$.

## Author(s)

Rohmer Tom

## References

Tom Rohmer, Some results on change-point detection in cross-sectional dependence of multivariate data with changes in marginal distributions, Statistics \& Probability Letters, Volume 119, December 2016, Pages 45-54, ISSN 0167-7152
A. Bucher and I. Kojadinovic (2016), A dependent multiplier bootstrap for the sequential empirical copula process under strong mixing, Bernoulli 22:2, pages 927-968
A. Bucher, I. Kojadinovic, T. Rohmer and J. Segers (2014), Detecting changes in cross-sectional dependence in multivariate time series, Journal of Multivariate Analysis 132, pages 111-128

## Examples

```
#Example 1: under the nulle hypothesis
#of an abrupt change in the m.c.d.f. at time m=50 and no change in the copula
n=100
m=50
sigma = matrix(c(1,0.4,0.4,1),2,2)
mean1 = rep (0,2)
mean2 = rep(4,2)
X=matrix(rep(0,n*2),n,2)
for(j in 1:n) X[j,]=t(chol(sigma))%*%rnorm(2)
X[1:m,] = X[1:m,]+mean1
X[(m+1):n,] = X[(m+1):n,]+mean2
CopTestdm(X,b=0.5)
```

\#Example 2: under the alternative hypothesis
\#of an abrupt change in the m.c.d.f at and in the copula time $k=m=50$
$n=100$
$\mathrm{m}=50$
mean1 $=\operatorname{rep}(0,2)$
mean2 $=\operatorname{rep}(4,2)$
sigma1 $=\operatorname{matrix}(c(1,0.2,0.2,1), 2,2)$
sigma2 $=\operatorname{matrix}(c(1,0.6,0.6,1), 2,2)$
$\mathrm{X}=$ matrix $(\operatorname{rep}(0, \mathrm{n} * 2), \mathrm{n}, 2)$
for (j in 1:m) X[j,]=t(chol(sigma1))\%*\%rnorm(2) + mean1
for $(j$ in $(m+1): n) X[j]=,t(\operatorname{chol}($ sigma2 $)) \% * \% r n o r m(2)+m e a n 2$
CopTestdm( $\mathrm{X}, \mathrm{b}=0.5$ )
\#Example 3: under the alternative hypothesis
\#of abrupt changes in the m.c.d.f at times $m=100$ and 150 and in the copula at time $k=50$
$n=200$
$\mathrm{m} 1=100$
$\mathrm{m} 2=150$
$k=50$

```
sigma1 = matrix(c(1,0.2,0.2,1),2,2)
sigma2 = matrix(c(1,0.6,0.6,1),2,2)
mean1 = rep(0,2)
mean2 = rep(2,2)
mean3 = rep(4,2)
X=matrix(rep(0,n*2),n,2)
for(j in 1:k) X[j,]=t(chol(sigma1))%*%rnorm(2)
for(j in (k+1):n) X[j,]=t(chol(sigma2))%*%rnorm(2)
X[1:m1,]=X[1:m1,]+mean1
X[(m1+1):m2,]=X[(m1+1):m2,]+mean2
X[(m2+1):n,]=X[(m2+1):n,]+mean3
CopTestdm(X,b=c(0.5,0.75))
```

kn
Estimation of the location of the change point in the copula

## Description

Give an estimation of the abrupt change point in the copula when changes known occurs in the m.c.d.f.

## Usage

$k n(X, b)$

## Arguments

$\mathrm{X} \quad \mathrm{a}$ (non-empty) numeric matrix of $d$-dimensional data values, $d \geq 2$. Each row of the matrix contains one mutlivariate data.
b a single value or a vector of real values on ( 0,1 ] indicating the location(s) of the potential break time(s) in marginal cumulative distribution functions. You can specify $b=1$ (default) for any break time.

## Details

Estimation of the location of the abrupt change point in copula

## Value

estimation of the location of the change point in the copula

## Author(s)

Rohmer Tom

## References

Tom Rohmer, Some results on change-point detection in cross-sectional dependence of multivariate data with changes in marginal distributions, Statistics \& Probability Letters, Volume 119, December 2016, Pages 45-54, ISSN 0167-7152

## Examples

```
#Example 1: Abrupt change in the m.c.d.f at time (known) m=50
# and in the copula at time k=50 (to be estimated)
n=100
m=50
mean1 = rep(0,2)
mean2 = rep(4,2)
sigma1 = matrix(c(1,0.2,0.2,1),2,2)
sigma2 = matrix(c(1,0.6,0.6,1),2,2)
X=matrix(rep(0,n*2),n,2)
for(j in 1:m) X[j,]=t(chol(sigma1))%*%rnorm(2) + mean1
for(j in (m+1):n) X[j,]=t(chol(sigma2))%*%rnorm(2) + mean2
kn(X,b=0.5)
#Example 2: Abrupt changes in the m.c.d.f at times (known) m=100 and 150
# and in the copula at time k=50 (to be estimated)
n=200
m1 = 100
m2 = 150
k = 50
sigma1 = matrix(c(1,0.2,0.2,1),2,2)
sigma2 = matrix(c(1,0.6,0.6,1),2,2)
mean1 = rep(0,2)
mean2 = rep(2,2)
mean3 = rep(4,2)
X=matrix(rep(0,n*2),n,2)
for(j in 1:k) X[j,]=t(chol(sigma1))%*%rnorm(2)
for(j in (k+1):n) X[j,]=t(chol(sigma2))%*%rnorm(2)
X[1:m1,]=X[1:m1,]+mean1
X[(m1+1):m2,]=X[(m1+1):m2,]+mean2
X[(m2+1):n,]=X[(m2+1):n,]+mean3
kn(X,b=c(0.5,0.75))
```


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