

# Package ‘Copula.Markov’

July 23, 2018

**Type** Package

**Title** Copula-Based Estimation and Statistical Process Control for  
Serially Correlated Time Series

**Version** 2.1

**Date** 2018-07-23

**Author** Takeshi Emura, Weiru Chen and Ting-Hsuan Long

**Maintainer** Takeshi Emura <takeshiemura@gmail.com>

**Description** Estimation and statistical process control are performed under  
copula-based time-series models.  
Available are statistical methods in Long and Emura (2014 JCSA),  
Emura et al. (2017 Commun Stat-Simul) <DOI:10.1080/03610918.2015.1073303>,  
and Chen and Emura (2018-, submitted).

**License** GPL-2

**NeedsCompilation** no

**Repository** CRAN

**Date/Publication** 2018-07-23 07:30:21 UTC

## R topics documented:

Copula.Markov-package . . . . .	2
Clayton.Markov.DATA . . . . .	2
Clayton.Markov.DATA.binom . . . . .	3
Clayton.Markov.MLE . . . . .	5
Clayton.Markov.MLE.binom . . . . .	6
Joe.Markov.DATA . . . . .	7
Joe.Markov.MLE . . . . .	8

<b>Index</b>	<b>10</b>
--------------	-----------

Copula.Markov-package *Copula-Based Estimation and Statistical Process Control for Serially Correlated Time Series*

---

### Description

Copulas are applied to model serial dependence in time series. The Clayton and Joe copulas are available for the dependence structure. The normal and binomial distributions are available for the marginal model.

### Details

Package:	Copula.Markov
Type:	Package
Version:	2.1
Date:	2018-07-23
License:	GPL-2

### Author(s)

Takeshi Emura <takeshiemura@gmail.com>

### References

- Chen W (2018) Copula-based Markov chain model with binomial data, NCU Library
- Chen W, Emura T (2018-), A control chart using a copula-based Markov chain for attribute data, submitted for publication
- Emura T, Long TH, Sun LH (2017), R routines for performing estimation and statistical process control under copula-based time series models, *Communications in Statistics - Simulation and Computation*, 46 (4): 3067-87
- Long TH and Emura T (2014), A control chart using copula-based Markov chain models, *Journal of the Chinese Statistical Association* 52 (No.4): 466-96

---

Clayton.Markov.DATA *Generating Time Series Data Under a Copula-Based Markov Chain Model with the Clayton Copula*

---

### Description

Time-series datasets are generated under a copula-based Markov chain model with the Clayton copula.

**Usage**

```
Clayton.Markov.DATA(n, mu, sigma, alpha)
```

**Arguments**

n	sample size
mu	mean
sigma	standard deviation
alpha	association parameter

**Details**

$-1 < \alpha < 0$  for negative association;  $\alpha > 0$  for positive association

**Value**

time series data

**Author(s)**

Takeshi Emura

**References**

Emura T, Long TH, Sun LH (2017), R routines for performing estimation and statistical process control under copula-based time series models, *Communications in Statistics - Simulation and Computation*, 46 (4): 3067-87

Long TH and Emura T (2014), A control chart using copula-based Markov chain models, *Journal of the Chinese Statistical Association* 52 (No.4): 466-96

**Examples**

```
set.seed(1)
Y=Clayton.Markov.DATA(n=1000,mu=0,sigma=1,alpha=8)
Clayton.Markov.MLE(Y,plot=TRUE)
```

---

Clayton.Markov.DATA.binom

*Generating Time Series Data Under a Copula-Based Markov Chain Model with the Clayton Copula and Binomial Margin.*

---

**Description**

Time-series datasets are generated under a copula-based Markov chain model with the Clayton copula and binomial margin.

**Usage**

```
Clayton.Markov.DATA.binom(n, size, prob, alpha)
```

**Arguments**

n	number of observations
size	number of binomial trials
prob	binomial probability; $0 < p < 1$
alpha	association parameter

**Details**

$-1 < \alpha < 0$  for negative association;  $\alpha > 0$  for positive association

**Value**

time series data

**Author(s)**

Weiru Chen, Takeshi Emura

**References**

Chen W (2018) Copula-based Markov chain model with binomial data, NCU Library

Chen W, Emura T (2018-) A control chart using a copula-based Markov chain for attribute data, submitted for publication

**Examples**

```
size=50
prob=0.5
alpha=2
set.seed(1)
Y=Clayton.Markov.DATA.binom(n=500,size,prob,alpha)
### sample mean and SD ###
mean(Y)
sd(Y)
### true mean and SD ###
size*prob
sqrt(size*prob*(1-prob))
```

---

Clayton.Markov.MLE      *Maximum Likelihood Estimation and Statistical Process Control Under the Clayton Copula*

---

### Description

The maximum likelihood estimates are produced and the Shewhart control chart is drawn with k-sigma control limits (e.g., 3-sigma). The dependence model follows the Clayton copula and the marginal (stationary) distribution follows the normal distribution.

### Usage

```
Clayton.Markov.MLE(Y, k = 3, D = 1, plot = TRUE, GOF=FALSE)
```

### Arguments

Y	vector of datasets
k	constant determining the length between LCL and UCL (k=3 corresponds to 3-sigma limit)
D	diameter for U(-D, D) used in randomized Newton-Raphson
plot	show the control chart if TRUE
GOF	show the model diagnostic plot if TRUE

### Value

estimates	estimates
out_of_control	IDs for out-of-control points
Gradient	gradients (must be zero)
Hessian	Hessian matrix
Mineigenvalue_Hessian	Minimum eigenvalue for the Hessian matrix
CM.test	Cramer-von Mises test statistics
KS.test	Kolmogorov-Smirnov test statistics

### Author(s)

Takeshi Emura

### References

Emura T, Long TH, Sun LH (2017), R routines for performing estimation and statistical process control under copula-based time series models, *Communications in Statistics - Simulation and Computation*, 46 (4): 3067-87

Long TH and Emura T (2014), A control chart using copula-based Markov chain models, *Journal of the Chinese Statistical Association* 52 (No.4): 466-96

**Examples**

```
set.seed(1)
Y=Clayton.Markov.DATA(n=1000,mu=0,sigma=1,alpha=2)
Clayton.Markov.MLE(Y,plot=TRUE)
```

---

Clayton.Markov.MLE.binom

*Maximum Likelihood Estimation and Statistical Process Control Under the Clayton Copula*

---

**Description**

The maximum likelihood estimates are produced and the Shewhart control chart is drawn with k-sigma control limits (e.g., 3-sigma). The dependence model follows the Clayton copula and the marginal (stationary) distribution follows the normal distribution.

**Usage**

```
Clayton.Markov.MLE.binom(Y, size, k = 3, plot = TRUE)
```

**Arguments**

Y	vector of observations
size	numbe of binomial trials
k	constant determining the length between LCL and UCL (k=3 corresponds to 3-sigma limit)
plot	show the control chart if TRUE

**Value**

p	estimate, SE, and 95CI
alpha	estimate, SE, and 95CI
out_of_control	IDs for out-of-control points
Gradient	gradients (must be zero)
Hessian	Hessian matrix
Mineigenvalue_Hessian	Minimum eigenvalue for the Hessian matrix

**Author(s)**

Takeshi Emura

## References

Chen W (2018) Copula-based Markov chain model with binomial data, NCU Library

Chen W, Emura T (2018-) A control chart using a copula-based Markov chain for attribute data, submitted for publication

## Examples

```
size=50
prob=0.5
alpha=2
set.seed(1)
Y=Clayton.Markov.DATA.binom(n=500,size,prob,alpha)
Clayton.Markov.MLE.binom(Y,size=size,k=3,plot=TRUE)
```

---

Joe.Markov.DATA

*Generating Time Series Data Under a Copula-Based Markov Chain Model with the Joe Copula*

---

## Description

Time-series datasets are generated under a copula-based Markov chain model with the Joe copula.

## Usage

```
Joe.Markov.DATA(n, mu, sigma, alpha)
```

## Arguments

n	sample size
mu	mean
sigma	standard deviation
alpha	association parameter

## Details

alpha $\geq$ 1 for positive association

## Value

Time series data

## Author(s)

Takeshi Emura

## References

Emura T, Long TH, Sun LH (2017), R routines for performing estimation and statistical process control under copula-based time series models, *Communications in Statistics - Simulation and Computation*, 46 (4): 3067-87

Long TS and Emura T (2014), A control chart using copula-based Markov chain models, *Journal of the Chinese Statistical Association* 52 (No.4): 466-96

## Examples

```
n=1000
alpha=2.856 ### Kendall's tau =0.5 ###
mu=2
sigma=1
Y=Joe.Markov.DATA(n,mu,sigma,alpha)
mean(Y)
sd(Y)
cor(Y[-1],Y[-n],method="kendall")

Joe.Markov.MLE(Y,k=2)
```

---

Joe.Markov.MLE	<i>Maximum Likelihood Estimation and Statistical Process Control Under the Joe Copula</i>
----------------	---

---

## Description

The maximum likelihood estimates are produced and the Shewhart control chart is drawn with k-sigma control limits (e.g., 3-sigma). The dependence model follows the Joe copula and the marginal (stationary) distribution follows the normal distribution.

## Usage

```
Joe.Markov.MLE(Y, k = 3, D = 1, plot = TRUE, GOF=FALSE)
```

## Arguments

Y	vector of datasets
k	constant determining the length between LCL and UCL (k=3 corresponds to 3-sigma limit)
D	diameter for U(-D, D) used in randomized Newton-Raphson
plot	show the control chart if TRUE
GOF	show the model diagnostic plot if TRUE



**Value**

estimates	estimates
out_of_control	IDs for out-of-control points
Gradient	gradients (must be zero)
Hessian	Hessian matrix
Mineigenvalue_Hessian	Minimum eigenvalue for the Hessian matrix
CM.test	Cramer-von Mises test statistics
KS.test	Kolmogorov-Smirnov test statistics

**Author(s)**

Takeshi Emura

**References**

Emura T, Long TH, Sun LH (2017), R routines for performing estimation and statistical process control under copula-based time series models, *Communications in Statistics - Simulation and Computation*, 46 (4): 3067-87

Long TH and Emura T (2014), A control chart using copula-based Markov chain models, *Journal of the Chinese Statistical Association* 52 (No.4): 466-96

**Examples**

```
n=1000
alpha=2.856 ### Kendall's tau =0.5 ###
mu=2
sigma=1
Y=Joe.Markov.DATA(n,mu,sigma,alpha)
mean(Y)
sd(Y)
cor(Y[-1],Y[-n],method="kendall")

Joe.Markov.MLE(Y,k=2)
```

# Index

## \*Topic **\textasciitildekwd1**

Clayton.Markov.DATA, [2](#)  
Clayton.Markov.DATA.binom, [3](#)  
Clayton.Markov.MLE, [5](#)  
Clayton.Markov.MLE.binom, [6](#)  
Joe.Markov.DATA, [7](#)  
Joe.Markov.MLE, [8](#)

## \*Topic **\textasciitildekwd2**

Clayton.Markov.DATA, [2](#)  
Clayton.Markov.DATA.binom, [3](#)  
Clayton.Markov.MLE, [5](#)  
Clayton.Markov.MLE.binom, [6](#)  
Joe.Markov.DATA, [7](#)  
Joe.Markov.MLE, [8](#)

## \*Topic **package**

Copula.Markov-package, [2](#)

Clayton.Markov.DATA, [2](#)  
Clayton.Markov.DATA.binom, [3](#)  
Clayton.Markov.MLE, [5](#)  
Clayton.Markov.MLE.binom, [6](#)  
Copula.Markov (Copula.Markov-package), [2](#)  
Copula.Markov-package, [2](#)

Joe.Markov.DATA, [7](#)  
Joe.Markov.MLE, [8](#)