# Package 'BINCOR'

October 12, 2022

Title Estimate the Correlation Between Two Irregular Time Series

Type Package

Version 0.2.0
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Imports pracma
Description Estimate the correlation between two irregular time series that are not necessarily sampled on identical time points. This program is also applicable to the situation of two evenly spaced time series that are not on the same time grid. 'BIN-COR' is based on a novel estimation approach proposed by Mudelsee (2010, 2014) to estimate the correlation between two climate time series with different timescales. The idea is that autocorrelation (AR1 process) allows to correlate values obtained on different time points. 'BINCOR' contains four functions: bin_cor() (the main function to build the binned time series), plot_ts() (to plot and compare the irregular and binned time series, cor_ts() (to estimate the correlation between the binned time series) and ccf_ts() (to estimate the cross-correlation between the binned time series).
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BINCOR-package
1

2 BINCOR-package

BINCOR-package				Es	tin	na	te	the	e (	Co	rre	ela	tic	on	В	etv	ve	en	Ti	vo	I	rre	egi	ıla	r'.	Tir	ne	S	er	ies	3			
Index																																		19
	redfitTauest .												•	•	•		•				•		•					•	•			•	•	17
	redfitMinls																																	
																																13		
																																12		
	ID32.dat																																	11
	ID31.dat																																	11
	ENSO.dat																																	10
	cor_ts																																	
	ccf_ts																																	

# **Description**

'BINCOR' estimate the correlation between two irregular time series that are not necessarily sampled on identical time points. This program is also applicable to the situation of two evenly spaced time series that are not on the same time grid. 'BINCOR' is based on a novel estimation approach proposed by Mudelsee (2010, 2014) to estimate the correlation between two climate time series with different timescales. The idea is that autocorrelation (AR1 process) allows to correlate values obtained on different time points. The outputs (plots) can be displayed in the screen or can be saved as PNG, JPG or PDF formats. The 'BINCOR' package also provides two examples with real data: instrumental (ENSO.dat and NHSST.dat data sets) and paleoclimatic (ID31.dat and ID32.dat data sets) time series to exemplify its use.

# Details

Package: BINCOR
Type: Package
Version: 0.2
Date: 2018-05-1

Date: 2018-05-18 License: GPL (>= 2)

LazyLoad: yes

BINCOR package contains four functions: the bin\_cor (the main function to build the binned time series), the plot\_ts (to plot and compare the irregular and binned time series, the cor\_ts (to estimate the correlation between the binned time series) and the ccf\_ts (to estimate the cross-correlation between the binned time series).

# Note

Dependencies: dplR and pracma.

bin\_cor 3

#### Author(s)

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# Acknowledgement:

JMPM was funded by a Basque Government post-doctoral fellowship.

#### References

Borchers, H. W. (2015). pracma: Practical Numerical Math Functions. R package version 1.8.8. URL https://CRAN.R-project.org/package=pracma

Bunn, A., Korpela, M., Biondi, F., Campelo, F., Mérian, P., Qeadan, F., Zang, C., Buras, A., Cecile, J., Mudelsee, M., Schulz, M. (2015). Den-drochronology Program Library in R. R package version 1.6.3. URL https://CRAN.R-project.org/package=dplR

Mudelsee, M. (2010). Climate Time Series Analysis: Classical Statistical and Bootstrap Methods. Springer.

Mudelsee, M. (2014). Climate Time Series Analysis: Classical Statistical and Bootstrap Methods, Second Edition. Springer.

Polanco-Martínez, J.M., Medina-Elizalde, M.A., Sánchez Goñi, M.F., M. Mudelsee. (2018). BIN-COR: an R package to estimate the correlation between two unevenly spaced time series. Ms. under review (second round).

bin\_cor

Binned correlation

# **Description**

The bin\_cor function convert an irregular time series to a binned one and its parameters are described in the following lines.

#### Usage

```
bin_cor(ts1, ts2, FLAGTAU=3, ofilename)
```

4 bin\_cor

#### **Arguments**

ts1, ts2 ts1 and ts2 are the unevenly spaced time series.

FLAGTAU defines the method used to estimate the persistence or memory of

the unevenly spaced time series. Options (by default is 3):

If 1 then est\_tau = tau\_x + tau\_y [Eq. 7.44, Mudelsee (2010, 2014)]. If 2 then est\_tau = max(tau\_x, tau\_y) [Eq. 7.45, Mudelsee (2010, 2014)]. If 3 then est\_tau = dist\_x\_y/ln(a\_x\_y\_est) [Eq. 7.48, Mudelsee (2010, 2014).]

of ilename The output filename (ASCII format) containing the binned time series.

#### **Details**

The bin\_cor function convert an irregular times series to a binned time series and depends on the R *dplR* package to carry out this task. *dplR* (*redfitTauest* function) estimate the persistence contained in the irregular climate time series by means of the method of Mudelsee (2002).

#### Value

A list of 16 elements:

Binned\_time\_series

An object containing the binned time series.

Auto.\_cor.\_coef.\_ts1

The autocorrelation for the binned time series number 1.

Persistence\_ts1

The persistence or memory for the binned time series number 1.

Auto.\_cor.\_coef.\_ts2

The autocorrelation for the binned time series number 2.

Persistence\_ts2

The persistence or memory for the binned time series number 2.

bin width The bin width.

Number\_of\_bins The number of bins.

Average spacing

The mean value of the times for the binned time series.

VAR. ts1 Variance of ts1

VAR. bin ts1 Variance of the binned ts1.

VAR. ts2 Variance for ts2.

VAR. bin ts2 Variance of the binned ts2.

VAR. ts1 - VAR bints1

Variance of ts1 minus variance of the binned ts1.

VAR. ts2 - VAR bints2

Variance of ts2 minus variance of the binned ts2.

% of VAR. lost ts1

Percentage of variance lost for ts1.

% of VAR. lost ts2

Percentage of variance lost for ts2.

bin\_cor 5

#### Note

Needs *dplR* (*redfitTauest* function) to estimate the persistence contained in the irregular time series by means of the method of Mudelsee (2002). Please, look at the code *tauest\_dplR.R* in the directory R of our BINCOR package.

# Author(s)

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#### References

Bunn, A., Korpela, M., Biondi, F., Campelo, F., Mérian, P., Qeadan, F., Zang, C., Buras, A., Cecile, J., Mudelsee, M., Schulz, M. (2015). Dendrochronology Program Library in R. R package version 1.6.3. URL https://CRAN.R-project.org/package=dplR.

Mudelsee, M. (2002). TAUEST: A computer program for estimating persistence in unevenly spaced weather/climate time series. Computers & Geosciences 28 (1), 69–72.

URL http://www.climate-risk-analysis.com/software/.

Mudelsee, M. (2010). Climate Time Series Analysis: Classical Statistical and Bootstrap Methods. Springer.

Mudelsee, M. (2014). Climate Time Series Analysis: Classical Statistical and Bootstrap Methods, Second Edition. Springer.

Polanco-Martínez, J.M., Medina-Elizalde, M.A., Sánchez Goñi, M.F., M. Mudelsee. (2018). BIN-COR: an R package to estimate the correlation between two unevenly spaced time series. Ms. under review (second round).

6 ccf\_ts

ccf\_ts Cross-correlation

# **Description**

The ccf\_ts function estimates and plots the cross-correlation between the binned time series. ccf\_ts has an option to remove the linear trend of the time series under analysis (other preprocessing methods could be used) and contains several parameters that are described in the following lines.

# Usage

```
ccf_ts(bints1, bints2, lagmax=NULL, ylima=-1, ylimb=1, rmltrd="N", RedL=T,
device="screen", Hfig, Wfig, Hpdf, Wpdf, resfig, ofilename)
```

# **Arguments**

bints1, bints2	The bints1 and bints2 are the binned time series.
lagmax	This parameter indicates the maximum lag for which the cross-correlation is calculated (its value depends on the length of the data set).
ylima, ylimb	This parameters define the extremes of the range in which the CCF will be plotted.
rmltrd	This is the option used to remove the linear trend in the time series under study (by default the linear trend is not removed, but it can be activated with the option "Y" or "y").
RedL	RedL plots a right red line to highlight the correlation coefficient at the lag-0 (the default option is TRUE).
device	The type of the output device (by default the option is "screen", and the other options are "jpg", "png" and "pdf") for the scatter plot of the binned time series.
Hfig	The height for the CCF plot in "jpg" or "png" format.
Wfig	The width for the CCF plot in "jpg" or "png" format.
Hpdf	The height for the CCF plot in "pdf" format.
Wpdf	The width for the CCF plot in "pdf" format.
resfig	<i>resfig</i> is the plot resolution in "ppi" (by default R does not record a resolution in the image file, except for BMP) for the CCF plot ("jpg" or "png" formats), an adequate value could be 150 ppi.
ofilename	The output filename (CCF plot) for the CCF estimated of the binned time series.

ccf\_ts 7

#### **Details**

The ccf\_ts estimate the cross-correlation between two binned time series by means of the R native function *ccf* (package:stats).

#### Value

Output: an object of the form *ccf* containing the correlation coefficients for the defined number of lags (lagmax) and the statistical significance.

# Author(s)

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```

#### References

Polanco-Martínez, J.M., Medina-Elizalde, M.A., Sánchez Goñi, M.F., M. Mudelsee. (2018). BIN-COR: an R package to estimate the correlation between two unevenly spaced time series. Ms. under review (second round).

```
#:: Figure 5 (Polanco-Martínez et al. (2018). (mimeo)).
library("BINCOR")
library("pracma")
#:: Loading the time series under analysis: example 2 (pollen ACER)
data(MD04_2845_siteID31)
data(MD95_2039_siteID32)
# Computing the binned time series though our bin_cor function
bincor.tmp <- bin_cor(ID31.dat, ID32.dat, FLAGTAU=3, "salida_ACER_ABRUPT.tmp")</pre>
binnedts <- bincor.tmp$Binned_time_series</pre>
# To avoid NA's values
bin_ts1
    <- na.omit(bincor.tmp$Binned_time_series[,1:2])</pre>
    <- na.omit(bincor.tmp$Binned_time_series[,c(1,3)])</pre>
bin_ts2
# Testing our ccf_ts function
```

8 cor\_ts

```
# Screen
ccf_ts(bin_ts1, bin_ts2, RedL=TRUE, rmltrd="y")
# PDF format
ccf_ts(bin_ts1, bin_ts2, RedL=TRUE, rmltrd="y", device="pdf", Hpdf=6,
Wpdf=9, resfig=300, ofilename="ccf_ID31_ID32_res")
# JPG format
ccf_ts(bin_ts1, bin_ts2, RedL=TRUE, rmltrd="y", device="jpg",
Hfig=900, Wfig=1200, resfig=150, ofilename="ccf_ID31_ID32_res")
```

cor\_ts

Bi-variate correlation

# **Description**

The cor\_ts function estimates the correlation between the binned time series. cor\_ts estimates three types of correlation coefficients: Pearson's correlation, Spearman's and Kendall's rank correlations by means of the R native function cor.test (package:stats). The cor\_ts function has an option to remove the linear trend of the time series under analysis (other pre-processing methods could be used) and its parameters are described in the following lines.

# Usage

```
cor_ts(bints1, bints2, varnamets1="NULL", varnamets2="NULL", KoCM, rmltrd="N",
   device="screen", Hfig, Wfig, Hpdf, Wpdf, resfig, ofilename)
```

# **Arguments**

bints1, bints2 The bints1 and bints2 are the binned time series.

varnamets1, varnamets2

varnamets[1][2] are the names of the variables under study.

KoCM KoCM indicates the correlation estimator: pearson for Pearson (the option by

default), spearman for Spearman and kendall for Kendall.

rmltrd This is the option used to remove the linear trend in the time series under study

(by default the linear trend is not removed, but it can be activated with the option

"Y" or "y").

device The type of the output device (by default the option is "screen", and the other

options are "jpg", "png" and "pdf") for the scatter plot for the binned time series.

Hfig The height for the scatter plot in "jpg" or "png" format.

Wfig The width for the scatter plot in "jpg" or "png" format.

Hpdf The height for the scatter plot in "pdf" format.

Wpdf The width for the scatter plot in "pdf" format.

resfig resfig is the resolution in "ppi" (by default R does not record a resolution in

the image file, except for BMP) for the scatter plot ("jpg" or "png" formats), an

adequate value could be 150 ppi.

of ilename The output filename for the scatter plot of the binned time series.

cor\_ts 9

#### **Details**

The cor\_ts estimate the correlation between two binned time series by means of the R native function *cor.test* (package:stats).

#### Value

Output: an object of the form *cor.test* containing the correlation coefficient and the statistical significance.

Output plot: screen or 'ofilename + .png, .jpg or .pdf'.

#### Author(s)

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Web2: http://www.researchgate.net/profile/Josue_Polanco-Martinez.
Email: josue.m.polanco@gmail.com
```

#### References

Mudelsee, M. (2010). Climate Time Series Analysis: Classical Statistical and Bootstrap Methods. Springer.

Mudelsee, M. (2014). Climate Time Series Analysis: Classical Statistical and Bootstrap Methods, Second Edition. Springer.

Polanco-Martínez, J.M., Medina-Elizalde, M.A., Sánchez Goñi, M.F., M. Mudelsee. (2018). BIN-COR: an R package to estimate the correlation between two unevenly spaced time series. Ms. under review (second round).

10 ENSO.dat

```
<- bin_cor(ENSO.dat, NHSST.dat, FLAGTAU=3, "output_ENSO_NHSST.tmp")</pre>
bincor.tmp
            <- bincor.tmp$Binned_time_series</pre>
binnedts
# Testing our cor_ts function: cor_ts.R
# screen (scatterplot) and Pearson
cor_ts(binnedts[,1:2], binnedts[,c(1,3)], "ENSO-Nino3", "SST NH Mean",
KoCM="pearson", rmltrd="y")
# PDF format (scatterplot) and Kendall
cor_ts(binnedts[,1:2], binnedts[,c(1,3)], "ENSO-Nino3", "SST NH Mean",
KoCM="kendall", rmltrd="y", device="pdf", Hpdf=6, Wpdf=9, resfig=300,
ofilename="scatterplot_ENSO_SST")
# JPG format (scatterplot) and Spearman
cor_ts( binnedts[,1:2], binnedts[,c(1,3)], "ENSO-Nino3", "SST NH Mean",
KoCM="spearman", rmltrd="y", device="jpg", Hfig=900, Wfig=1200,
resfig=150, ofilename="scatterplot_ENSO_SST")
```

ENSO.dat

Equatorial Pacific SST anomalies from El Niño 3 region.

# **Description**

The data set ENSO. dat contains an irregular time series (ENSO) with 125 data points and an average temporal spacing of 1.24 years covering the time interval 1850-2006. The ENSO data set come from Mann et al. (2009). The data sets can be obtained from the following URL http://www.meteo.psu.edu/holocene/public\_html/supplements/MultiproxySpatial09/results/ (NINO3 full).

# Usage

data(ENSO)

# **Format**

One file in ASCII format containing 125 elements and two variables (time and ENSO)

#### Source

http://www.meteo.psu.edu/holocene/public\_html/supplements/MultiproxySpatial09/results/

Mann, M. E., Zhang, Z., Rutherford, S., Bradley, R. S., Hughes, M. K., Shindell, D., Ammann, C., Faluvegi, G., Ni, F. (2009). Global signatures and dynamical origins of the Little Ice Age and Medieval Climate Anomaly. Science 326 (5957), 1256–1260.

ID31.dat 11

ID31.dat	Unevenly-spaced pollen record from the marine sediments core (MD04-2845) collected on the southwestern European margin.
	,

# **Description**

The data set ID31.dat contains one paleoclimate (pollen percentages) time series spanning a time interval between 73,000 and 15,000 years before present (BP), thus covering the last glacial period (LGP). This data set come from a global pollen and charcoal database (Sánchez Goñi et al., 2017) developed in the framework of the INQUA International Focus Group ACER (Abrupt Climate Changes and Environmental Responses). The paleoclimate time series come from the site MD04-2845 and contains 77 elements (Sánchez Goñi et al., 2008, 2017).

# Usage

```
data(MD04_2845_siteID31)
```

#### **Format**

One file in ASCII format containing 77 elements and two variables (time and pollen percentages).

#### Source

```
https://doi.pangaea.de/10.1594/PANGAEA.870867
```

Sánchez Goñi, M. F., Landais, A., Fletcher, W. J., Naughton, F., Desprat, S., Duprat, J. (2008). Contrasting impacts of Dansgaard-Oeschger events over a western European latitudinal transect modulated by orbital parameters. Quaternary Science Reviews 27 (11), 1136–1151.

Sánchez Goñi, M. F., Desprat, S., Daniau, A.L., Bassinot, F. C., Polanco Martínez, J. M., Harrison, S. P., Allen, J. R., Anderson, R. S., Behling, H., Bonnefille, R., et al. (2017). The ACER pollen and charcoal database: a global resource to document vegetation and fire response to abrupt climate changes during the last glacial period. Earth System Science Data 9 (2), 679.

URL https://www.earth-syst-sci-data.net/9/679/2017/.

ID32.dat Unevenly-spaced pollen record from the marine sediments core (MD95-2039) collected on the southwestern European margin.

# Description

The data set ID32.dat contains a paleoclimate (pollen percentages) time series spanning a time interval between 73,000 and 15,000 years before present (BP), thus covering the last glacial period (LGP). This data set come from a global pollen and charcoal database (Sánchez Goñi et al., 2017) developed in the framework of the INQUA International Focus Group ACER (Abrupt Climate Changes and Environmental Responses). The time series come from the site MD95-2039 and contains 141 elements (Roucoux et al., 2005; Sánchez Goñi et al., 2017).

12 NHSST.dat

# Usage

```
data(MD95_2039_siteID32)
```

#### **Format**

One file in ASCII format containing and 141 elements and two variables (time and pollen percentages).

# Source

https://doi.pangaea.de/10.1594/PANGAEA.870867

Roucoux, K., De Abreu, L., Shackleton, N., Tzedakis, P. (2005). The response of NW Iberian vegetation to North Atlantic climate oscillations during the last 65 kyr. Quaternary Science Reviews 24 (14), 1637–1653.

Sánchez Goñi, M. F., Desprat, S., Daniau, A.L., Bassinot, F. C., Polanco Martínez, J. M., Harrison, S. P., Allen, J. R., Anderson, R. S., Behling, H., Bonnefille, R., et al. (2017). The ACER pollen and charcoal database: a global resource to document vegetation and fire response to abrupt climate changes during the last glacial period. Earth System Science Data 9 (2), 679. URL https://www.earth-syst-sci-data.net/9/679/2017/.

NHSST.dat

Northern Hemisphere (NH) sea surface temperature (SST) anomalies.

# **Description**

The data set NHSST.dat contains an irregular time series (NH-SST) with 125 data points and an average temporal spacing of 1.24 years covering the time interval 1850-2006. The NH-SST data set come from HadCRUT3 (Brohan et al., 2006). The data sets can be obtained from the following URL <a href="http://www.meteo.psu.edu/holocene/public\_html/supplements/MultiproxySpatial09/results/">http://www.meteo.psu.edu/holocene/public\_html/supplements/MultiproxySpatial09/results/</a> (Northern Hemisphere full).

#### Usage

data(NHSST)

### Format

One file in ASCII format containing 125 elements and two variables (time and NHSST)

#### **Source**

http://www.meteo.psu.edu/holocene/public\_html/supplements/MultiproxySpatial09/results/

Brohan, P., Kennedy, J. J., Harris, I., Tett, S. F., Jones, P. D. (2006). Uncertainty estimates in regional and global observed temperature changes: A new data set from 1850. Journal of Geophysical Research: Atmospheres 111 (D12).

plot\_ts 13

|--|

# **Description**

The plot\_ts function plot and compare the irregular and the binned time series. plot\_ts has several parameters that are described in the following lines.

# Usage

```
plot_ts(ts1, ts2, bints1, bints2, varnamets1="", varnamets2="", colts1=1, colts2=1,
  colbints1=2, colbints2=2, ltyts1=1, ltyts2=1, ltybints1=2, ltybints2=2,
  device="screen", Hfig, Wfig, Hpdf, Wpdf, resfig, ofilename)
```

#### **Arguments**

ts1, ts2 ts1 and ts2 are the unevenly spaced time series. bints1, bints2 The bints1 and bints2 are the binned time series. varnamets1, varnamets2 varnamets[1][2] are the names of the variables under study. colts1, colts2 colts[1][2] are the colours for the time series (irregular) under study (by default both curves are in black). colbints1, colbints2 colbints[1][2] are the colours of the binned time series (by default both curves are in red). ltyts1, ltyts2 ltyts[1][2] are the type of lines to be plotted for the irregular time series (by default is 1, i.e., solid). 1 = solid, 2 = dashed, 3 = dotted, 4 = dot-dashed, 5 = long-dashed, 6 = double-dashed. ltybints1, ltybints2 ltybints[1][2] are the type of lines to be plotted for the binned time series (by default is 2, i.e., dashed). 1 = solid, 2 = dashed, 3 = dotted, 4 = dot-dashed, 5 = long-dashed, 6 = double-dashed. device The type of the output device (by default the option is "screen", and the other options are "jpg", "png" and "pdf"). Hfig The height for the plot in "jpg" or "png" format. The width for the plot in "jpg" or "png" format. Wfig Hpdf The height for the plot in "pdf" format. Wpdf The width for the plot in "pdf" format. resfig resfig is the plot resolution in 'ppi' (by default R does not record a resolution in the image file, except for BMP), an adequate value could be 150 ppi. ofilename The output filename for the plot.

plot\_ts

### **Details**

The plot\_ts function is used to plot the irregular vs. the binned time series and this function uses the native R function "plot" (package:graphics).

#### Value

```
Output:
```

```
Output plot: screen or 'ofilename + .png, .jpg or .pdf'.
```

#### Author(s)

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Web1: https://scholar.google.es/citations?user=8djLIhcAAAAJ&hl=en.
Web2: http://www.researchgate.net/profile/Josue_Polanco-Martinez.
Email: josue.m.polanco@gmail.com
```

#### References

Polanco-Martínez, J.M., Medina-Elizalde, M.A., Sánchez Goñi, M.F., M. Mudelsee. (2018). BIN-COR: an R package to estimate the correlation between two unevenly spaced series. Ms. under review (second round).

```
#:: Figure 1 (Polanco-Martínez et al. (2018), (mimeo)).
library("BINCOR")
#:: Loading the time series under analysis: example 1 (ENSO vs. NHSST)
data(ENSO)
data(NHSST)
# Computing the binned time series though our bin_cor_function.R
<- bin_cor(ENSO.dat, NHSST.dat, FLAGTAU=3, "output_ENSO_NHSST.tmp")</pre>
bincor.tmp
binnedts
       <- bincor.tmp$Binned_time_series</pre>
# Testing our plot_ts function
# "Screen"
plot_ts(ENSO.dat, NHSST.dat, binnedts[,1:2], binnedts[,c(1,3)], "ENSO-Nino3",
"SST NH Mean", colts1=1, colts2=2, colbints1=3, colbints2=4, device="screen")
```

redfitMinls 15

```
# PDF format
plot_ts(ENSO.dat, NHSST.dat, binnedts[,1:2], binnedts[,c(1,3)], "ENSO-Nino3",
"SST NH Mean", colts1=1, colts2=2, colbints1=3, colbints2=4, device="pdf",
Hpdf=6, Wpdf=9, resfig=300, ofilename="plot_ts_RAW_BIN_enso_sst")
# PNG format
plot_ts(ENSO.dat, NHSST.dat, binnedts[,1:2], binnedts[,c(1,3)], "ENSO-Nino3",
"SST NH Mean", colts1=1, colts2=2, colbints1=3, colbints2=4, device="png",
Hfig=900, Wfig=1200, resfig=150, ofilename="plot_ts_RAW_BIN_enso_sst")
#:: Figure 4 (Polanco-Martínez et al. (2017), (mimeo)).
#:: Loading the time series under analysis: example 2 (pollen ACER)
data(MD04_2845_siteID31)
data(MD95_2039_siteID32)
# Computing the binned time series though our bin_cor function
bincor.tmp <- bin_cor(ID31.dat, ID32.dat, FLAGTAU=3, "salida_ACER_ABRUPT.tmp")</pre>
binnedts <- bincor.tmp$Binned_time_series</pre>
# To avoid NA's values
bin_ts1
       <- na.omit(bincor.tmp$Binned_time_series[,1:2])</pre>
bin ts2
       <- na.omit(bincor.tmp$Binned_time_series[,c(1,3)])</pre>
# Testing our plot_ts function: plot_ts.R
plot_ts(ID31.dat, ID32.dat, bin_ts1, bin_ts2, "MD04-2845 (Temp. forest)",
"MD95-2039 (Temp. forest )", colts1=1, colts2=2, colbints1=3, colbints2=4,
device="screen")
# PDF format
plot_ts(ID31.dat, ID32.dat, bin_ts1, bin_ts2, "MD04-2845 (Temp. forest)",
"MD95-2039 \ (Temp.\ forest\ )",\ colts1=1,\ colts2=2,\ colbints1=3,\ colbints2=4,
device="pdf", Hpdf=6, Wpdf=9, resfig=300, ofilename="ts_ACER_ABRUPT")
# PNG format
plot_ts(ID31.dat, ID32.dat, bin_ts1, bin_ts2, "MD04-2845 (Temp. forest)",
"MD95-2039 (Temp. forest )", colts1=1, colts2=2, colbints1=3, colbints2=4,
device="png", Hfig=900, Wfig=1200, resfig=150, ofilename="ts_ACER_ABRUPT")
```

16 redfitMinls

# **Description**

The redfitMinls function is used by the redfitTauest function to calculate the persistence for unevenly spaced climate time series under study. redfitTauest is included in the *redfit* function of the R *dplR* package (Bunn et al. 2015).

#### Usage

```
redfitMinls(t, x)
```

#### **Arguments**

t, x t and x are the times and the variables for an unevenly spaced time series.

#### **Details**

The redfitMinls function minimize (optimize) by least squares to obtain some parameters of the AR1 model used to estimate the persistence through the method of Mudelsee (2002). More information about redfitMinls function can be found in Bunn et al. (2015) and Mudelsee (2002).

#### Note

Needs *dplR* to estimate the persistence contained in the irregular time series by means of the method of Mudelsee (2002). Please, for more details look at the code *tauest\_dplR.R* in the directory R of our BINCOR package.

### Author(s)

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#### References

Bunn, A., Korpela, M., Biondi, F., Campelo, F., Mérian, P., Qeadan, F., Zang, C., Buras, A., Cecile, J., Mudelsee, M., Schulz, M. (2015). Dendrochronology Program Library in R. R package version 1.6.3. URL https://CRAN.R-project.org/package=dplR.

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redfitTauest 17

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redfitTauest

Tauest

# **Description**

The redfitTauest function is used by bin\_cor function to calculate the persistence for irregular climate time series under study. redfitTauest is included in the *redfit* function that come from the R *dplR* package (Bunn et al. 2015).

# Usage

```
redfitTauest(t, x)
```

# Arguments

t, x

t and x are the times and the variables for an unevenly spaced time series.

#### **Details**

The redfitTauest function estimate the persistence of an irregular times series through the method of Mudelsee (2002). redfitTauest function is used by the *dplR* package to estimate the persistence contained in irregular climate time series. More information about redfitTauest function can be found in Bunn et al. (2015) and Mudelsee (2002).

# Note

Needs *dplR* to estimate the persistence contained in the irregular time series by means of the method of Mudelsee (2002). Please, look at the code *tauest\_dplR.R* in the directory R of our BINCOR package.

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18 redfitTauest

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# **Index**

* Bi-variate correlation	ccf_ts, 2, 6, 6, 7
ccf_ts, 6	cor_ts, 2, 8, 8, 9
cor_ts, 8 * Binned correlation	ENSO. dat, 2, 10, 10
	21130.446, 2, 10, 10
bin_cor, 3 * Correlation	ID31.dat, 2, 11, 11
ccf_ts, 6	ID32.dat, 2, 11, 11
cor_ts, 8	
* Memory	NHSST.dat, 2, 12, 12
redfitMinls, 15	
redfitTauest, 17	plot_ts, 2, 13, 13, 14
* Persistence	modfitMimlo 15 16
redfitMinls, 15	redfitMinls, 15, 16
redfitTauest, 17	redfitTauest, <i>16</i> , <i>17</i> , 17
* Tauest	
redfitMinls, 15	
redfitTauest, 17	
* bin cor	
bin_cor, 3	
* bincor	
bin_cor, 3	
* cor ts	
ccf_ts, 6	
cor_ts, 8	
* dataset1	
NHSST.dat, 12	
* dataset2	
ENSO.dat, 10	
ID31.dat, 11	
ID32.dat, 11	
* plot time series	
plot_ts, 13	
* plot_ts	
plot_ts, 13	
* plot	
plot_ts, 13	
bin_cor, 2, 3, 3, 4, 17 BINCOR (BINCOR-package), 2 BINCOR-package, 2	