## Package 'RolWinWavCor'

January 20, 2025

Type Package

Title Estimate Rolling Window Wavelet Correlation Between Two Time Series

Version 0.4.0

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Depends R (>= 3.6.0), waveslim

**Description** Estimates and plots as a heat map the rolling window wavelet correlation (RWWC) coefficients statistically significant (within the 95% CI) between two regular (evenly spaced) time series. 'RolWinWavCor' also plots at the same graphic the time series under study. The 'RolWinWavCor' was designed for financial time series, but this software can be used with other kinds of data (e.g., climatic, ecological, geological, etc). The functions contained in 'RolWinWavCor' are highly flexible since these contains some parameters to personalize the time series under analysis and the heat maps of the rolling window wavelet correlation coefficients. Moreover, we have also in-

cluded a data set (named EU\_stock\_markets) that contains nine European stock market indices to exemplify the use of the functions contained in 'RolWinWavCor'. Methods derived from Polanco-Martínez et al (2018) <doi:10.1016/j.physa.2017.08.065>).

License GPL (>= 2)

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RolWinWavCor-package Estimate rolling window wavelet correlation between two time series

#### Description

'RolWinWavCor' estimates and plots as a heat map rolling window wavelet correlation (RWWC) coefficients statistically significant (within the 95% CI) between two regular (evenly spaced) time series. 'RolWinWavCor' is based on the method proposed by Polanco-Martínez et al. (2018), Physica A 490, 1211-1227 (<doi:10.1016/j.physa.2017.08.065>). The RWWC was designed for financial time series analysis, but other types of data (e.g., climatic, ecological, geological, etc.) can be analysed. 'RolWinWavCor' contains two functions: (1) estim\_RWWC that is used to estimate the rolling window wavelet correlation coefficients and their statistical significance, and (2) plot\_estim\_RWWC that plots the time series under analysis and a heat map of the rolling window correlation coefficients that are statistically significant. The functions included in 'RolWinWavCor' are highly flexible since these contains some parameters to personalize the time series under study and the heat maps of the rolling window wavelet correlations. Moreover, we have also included a data set named EU\_stock\_markets that contain nine EU stock market indices (closing prices) to exemplify the use of the functions contained in 'RolWinWavCor'.

#### Details

Package:	RolWinWavCor
Type:	Package
Version:	0.4
Date:	2023-03-09
License:	GPL (>= 2)
LazyLoad:	yes

RolWinWavCor package contains two functions: (1) estim\_RWWC that estimates the rolling window wavelet correlation (WLMC) coefficients and their 95% confidence intervals (95% CI); (2) plot\_estim\_RWWC that plots the time series under analysis and the rolling window correlation coefficients that are statistical significant (within the 95% CI) as a heat map, which are obtained via the function estim\_RWWC.

#### Note

Dependencies: waveslim

#### Author(s)

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Email: <josue.m.polanco@gmail.com> Acknowledgement:

We acknowledge to the Excellence Unit GECOS (grant reference number CLU-2019-03), Universidad de Salamanca for its funding support.

#### References

Polanco-Martínez, J. M., Fernández-Macho, J., Neumann, M. B., & Faria, S. H. (2018). A pre-crisis vs. crisis analysis of peripheral EU stock markets by means of wavelet transform and a nonlinear causality test. Physica A: Statistical Mechanics and its Applications, 490, 1211-1227. <URL: doi: 10.1016/j.physa.2017.08.065>.

estim\_RWWC

Estimate rolling window wavelet correlation coefficients

#### Description

The estim\_RWWC function estimates the rolling window wavelet correlation (RWWC) coefficients between two regular or evenly spaced time series. This function is based on the work of Polanco-Martínez et al. (2018). However, we use the functions modwt and wave.correlation from the R package 'waveslim' (Whitcher et al. 2000, Whitcher 2022) to decompose via MODWT the two time series under study and to estimate the wavelet correlation between these two time series.

#### Usage

estim\_RWWC(inputdata, Wname="la8", J, W, Align="center", Scale=TRUE)

#### Arguments

inputdata	A matrix of three columns: the first one is the time (regular or evenly spaced) and the other two columns are the variables under study.
Wname	Name of the wavelet filter used in the wavelet transform (MODWT) decompo- sition. There are several wavelet filters to be used, but we use by default the Daubechies orthonormal compactly supported wavelet of length L=8, that is, "1a8". A relatively long wavelet filter (e.g. LA(4) or LA(8)) is adequate to analyse non-stationary time series but also correlation structures that are not sta- tionary, as was pointed out by Fernández-Macho (2018) and Polanco-Martínez et al. (2020).
J	The maximum level of the MODWT decomposition. It is recommended to use $log_2(N) - 3$ , where N is the number of rows or elements of inputdata (Fernández-Macho 2018, Polanco-Martínez et al. 2020).
W	The window-length or size of the window used when the rolling window wavelet correlation coefficients are estimated. The optimal window-length is a key ques- tion when the RWWC is estimated and the answer is closely related with the time-scales of the phenomenon under study. It is advisable to use one window- length around the target time-scale, not too short and not too long, and always

	test several window-lengths to analyse its sensibility (Polanco-Martínez et al. (2018)).
Align	This is used to align the rolling object. There are three options: left, center and right, but the center option is used by default to ensure that variations in the correlations are aligned with the variations in the relationships of the vari- ables under study, rather than being shifted to the left or right (Polanco-Martínez 2019, Polanco-Martínez 2020). However, this implies that the window-length must be an odd number.
Scale	Scale (by default is "TRUE"; "FALSE" otherwise) is used to "normalize" or "standardize" the variables under analysis. It is advisable to "normalize/standardize" the time series under study to have them in the same scales.

#### Details

The estim\_RWWC function estimates the rolling window wavelet correlation coefficients and their statistical significance between two time series sampled on identical time points for a given window-length. The estim\_RWWC function is based on the work of Polanco-Martínez et al. (2018), but this function uses the functions modwt and wave.correlation from the R package 'waveslim' package (Whitcher et al. 2000, Whitcher et al. 2022) to decompose via MODWT the two time series under analysis and to compute the wavelet correlation coefficients between these two series.

#### Value

Outputs: A multidimensional matrix containing three columns: the rolling window wavelet correlation coefficients and their respective 95% confidence interval in the second (lower bound) and third (upper bound) columns.

#### Author(s)

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#### References

Polanco-Martínez, J. M., Fernández-Macho, J., Neumann, M. B., & Faria, S. H. (2018). A pre-crisis vs. crisis analysis of peripheral EU stock markets by means of wavelet transform and a nonlinear causality test. Physica A: Statistical Mechanics and its Applications, 490, 1211-1227. <URL: doi: 10.1016/j.physa.2017.08.065>.

Fernández-Macho, J. (2018). Time-localized wavelet multiple regression and correlation. Physica A: Statistical Mechanics and its Applications, 492, 1226-1238. <URL: doi: 10.1016/j.physa.2017.11.050>.

Whitcher, B., Guttorp, P., & Percival, D. B. (2000). Wavelet analysis of covariance with application to atmospheric time series. Journal of Geophysical Research: Atmospheres, 105(D11), 14941-14962. <URL: doi: 10.1029/2000JD900110>.

Gencay, R., F. Selcuk and B. Whitcher (2001) An Introduction to Wavelets and Other Filtering Methods in Finance and Economics, Academic Press.

Whitcher, B. (2022). waveslim: Basic Wavelet Routines for One-, Two-, and Three-Dimensional Signal Processing. <URL: https://cran.r-project.org/package=waveslim>, R package version 1.8.4.

#### Examples

```
# We reproduce Figure 2 presented in Polanco-Martínez et al. (2018).
datPIGS
            <- EU_stock_markets
sindatePIGS <- datPIGS[-1] # To remove dates</pre>
sindatePIGS <- sindatePIGS[c(1:5, 8)]</pre>
lrdatPIGS <- apply(log(sindatePIGS), 2, diff)</pre>
            <- as.Date(datPIGS[,1][-1])
1rDATES
tsdatPIGS <- ts(lrdatPIGS, start=1, freq=1)</pre>
            <- dim(tsdatPIGS)[2]
Nnam
lrdatPIGS <- lrdatPIGS[,1:Nnam]</pre>
inputdata <- tsdatPIGS[,c(2,5)]</pre>
Wname <- "la8"
J
      <- 4
W
      <- 241
Align <- "center"
rwwc <- estim_RWWC(inputdata, Wname, J, W, Align=Align)</pre>
```

EU\_stock\_markets Financial data set to exemplify the use of the functions contained in 'RolWinWavCor'

#### Description

The data set EU\_stock\_markets contains nine European stock market indices (closing prices): PSI20 (Portugal), MIB30 (Italy), ISEQ (Ireland), ASE20 (Greece), IBEX35 (Spain), DAX30 (Germany), CAC40 (France) and SPEurope350 (Eurozone). The first column are the dates and these have the format YYYY-MM-DD. All data sets come from Yahoo Finance (except for the PSI20 and SPEurope350 stock market indices, which were taken from BolsaPT and OnVista Group) and encompass the interval from January 2, 2004 to December 31, 2011 (2086 elements or data points). This data set was used in Polanco-Martínez et al. (2018) and this work should be consulted for more information about this financial data set.

#### Usage

data(EU\_stock\_markets)

#### Format

Data set is in ASCII format containing 10 columns and 2086 rows (elements or data points), columns are separated by spaces.

#### Source

Polanco-Martínez, J. M., Fernández-Macho, J., Neumann, M. B., & Faria, S. H. (2018). A pre-crisis vs. crisis analysis of peripheral EU stock markets by means of wavelet transform and a nonlinear causality test. Physica A: Statistical Mechanics and its Applications, 490, 1211-1227. <URL: doi: 10.1016/j.physa.2017.08.065>.

plot\_estim\_RWWC Plot the rolling window wavelet correlation coefficients

#### Description

The plot\_estim\_RWWC function plots the rolling window wavelet correlation (RWWC) coefficients that are statistically significant between two regular time series as a heat map and also plots the time series under study. The function is based on the work of Polanco-Martínez et al. (2018). plot\_estim\_RWWC is fed by the function estim\_RWWC that is contained in our R package 'RolWin-WavCor'.

#### Usage

```
plot_estim_RWWC(inputdata, DATES="null", wavcorinput, Wname, J, W,
Align="center", vartsX="X", vartsY="Y", coltsX="black",
coltsY="blue", CEXAXIS=1, CEXLAB=1)
```

#### Arguments

inputdata	A matrix of three columns: the first one is the time (regular or evenly spaced) and the other two columns are the variables under study. This data set is the same used in the function estim_RWWC.
DATES	This optional parameter contains the times of the time series under study. If this parameter is not provided it is computed using the inputdata.
wavcorinput	This parameter contains the output of the function <code>estim_RWWC</code> and consists of a multidimensional matrix with three columns: the first one contains the correlation coefficients and the second and third columns are the left and right bound of the 95% confidence interval.
Wname	Name of the wavelet filter used in the wavelet transform (MODWT) decompo- sition and must be the same that was used with the function estim_RWWC.
J	The maximum level of the MODWT decomposition and must be the same used with the function estim_RWWC.
W	The window-length or size of the window used when the rolling window wavelet correlation coefficients are estimated and this must have the same value that was used in estim_RWWC.

Align	This is used to align the rolling object and must be the same as used in the function estim_RWWC.
vartsX, vartsY	Names of the first (e.g. "X") and the second (e.g. "Y") variable under study.
coltsX, coltsY	The colors used to plot the first and second variable. By default the colors are black and blue for the first and second variable, respectively.
CEXAXIS	This parameter is used to plot the size of the X and Y axes. Its default value is 1.
CEXLAB	This parameter is used to plot the size of the X-axis and Y-axis labels. Its default value is 1.

#### Details

The plot\_estim\_RWWC function plots the time series under analysis and the rolling window wavelet correlation coefficients that are statistically significant (within the 95% CI) as a heat map. This function is also based on the work of Polanco-Martínez et al. (2018).

#### Value

Output: a multi-plot displayed via screen containing the time series under scrutiny and a heat map of the rolling window wavelet correlation coefficients that are statistically significant.

#### Author(s)

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#### References

Polanco-Martínez, J. M., Fernández-Macho, J., Neumann, M. B., & Faria, S. H. (2018). A pre-crisis vs. crisis analysis of peripheral EU stock markets by means of wavelet transform and a nonlinear causality test. Physica A: Statistical Mechanics and its Applications, 490, 1211-1227. <URL: doi: 10.1016/j.physa.2017.08.065>.

#### Examples

```
# We reproduce Figure 2 presented in Polanco-Martínez et al. (2018).
datPIGS <- EU_stock_markets
sindatePIGS <- datPIGS[-1]
sindatePIGS <- sindatePIGS[c(1:5, 8)]
lrdatPIGS <- apply(log(sindatePIGS), 2, diff)
lrDATES <- as.Date(datPIGS[,1][-1])
tsdatPIGS <- ts(lrdatPIGS, start=1, freq=1)</pre>
```

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