

Package ‘itsmr’

October 13, 2022

Type Package

Title Time Series Analysis Using the Innovations Algorithm

Version 1.10

Date 2022-07-27

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Description

Provides functions for modeling and forecasting time series data. Forecasting is based on the innovations algorithm. A description of the innovations algorithm can be found in the textbook “Introduction to Time Series and Forecasting” by Peter J. Brockwell and Richard A. Davis. <<https://link.springer.com/book/10.1007/b97391>>.

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LazyLoad yes

NeedsCompilation no

URL <https://georgeweigt.github.io/itsmr-refman.pdf>

Repository CRAN

Date/Publication 2022-08-06 06:10:02 UTC

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itsmr-package	<i>Time Series Analysis Using the Innovations Algorithm</i>
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Description

Provides functions for modeling and forecasting time series data. Forecasting is based on the innovations algorithm. A description of the innovations algorithm can be found in the textbook *Introduction to Time Series and Forecasting* by Peter J. Brockwell and Richard A. Davis.

Details

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Author(s)

George Weigt
Maintainer: George Weigt <g808391@icloud.com>

References

Brockwell, Peter J., and Richard A. Davis. *Introduction to Time Series and Forecasting*. 2nd ed. Springer, 2002.

Examples

```
plotc(wine)

## Define a suitable data model
M = c("log", "season", 12, "trend", 1)

## Obtain residuals and check for stationarity
e = Resid(wine, M)
test(e)

## Define a suitable ARMA model
a = arma(e, p=1, q=1)

## Obtain residuals and check for white noise
ee = Resid(wine, M, a)
test(ee)

## Forecast future values
forecast(wine, M, a)
```

aacvf

Autocovariance of ARMA model

Description

Autocovariance of ARMA model

Usage

```
aacvf(a, h)
```

Arguments

a	ARMA model
h	Maximum lag

Details

The ARMA model is a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Value

Returns a vector of length $h+1$ to accommodate lag 0 at index 1.

See Also

[arma](#)

Examples

```
a = arma(Sunspots,2,0)
aacvf(a,40)
```

acvf	<i>Autocovariance of data</i>
------	-------------------------------

Description

Autocovariance of data

Usage

```
acvf(x, h = 40)
```

Arguments

x	Time series data
h	Maximum lag

Value

Returns a vector of length $h+1$ to accommodate lag 0 at index 1.

See Also

[plota](#)

Examples

```
acvf(Sunspots)
```

airpass	<i>Number of international airline passengers, 1949 to 1960</i>
---------	---

Description

Number of international airline passengers, 1949 to 1960

Examples

```
plotc(airpass)
```

ar.inf	<i>Compute AR infinity coefficients</i>
--------	---

Description

Compute AR infinity coefficients

Usage

```
ar.inf(a, n = 50)
```

Arguments

a	ARMA model
n	Order

Details

The ARMA model is a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Value

Returns a vector of length n+1 to accomodate coefficient 0 at index 1.

See Also

[ma.inf](#)

Examples

```
a = yw(Sunspots,2)
ar.inf(a)
```

arar

Forecast using ARAR algorithm

Description

Forecast using ARAR algorithm

Usage

```
arar(y, h = 10, opt = 2)
```

Arguments

y	Time series data
h	Steps ahead
opt	Display option (0 silent, 1 tabulate, 2 plot and tabulate)

Value

Returns the following list invisibly.

pred	Predicted values
se	Standard errors
l	Lower bounds (95% confidence interval)
u	Upper bounds

See Also

[forecast](#)

Examples

```
arar(airpass)
```

`arma`*Estimate ARMA model coefficients using maximum likelihood*

Description

Estimate ARMA model coefficients using maximum likelihood

Usage

```
arma(x, p = 0, q = 0)
```

Arguments

<code>x</code>	Time series data
<code>p</code>	AR order
<code>q</code>	MA order

Details

Calls the standard R function `arima` to estimate AR and MA coefficients. The innovations algorithm is used to estimate white noise variance.

Value

Returns an ARMA model consisting of a list with the following components.

<code>phi</code>	Vector of AR coefficients (index number equals coefficient subscript)
<code>theta</code>	Vector of MA coefficients (index number equals coefficient subscript)
<code>sigma2</code>	White noise variance
<code>aicc</code>	Akaike information criterion corrected
<code>se.phi</code>	Standard errors for the AR coefficients
<code>se.theta</code>	Standard errors for the MA coefficients

See Also

[autofit](#) [burg](#) [hannan](#) [ia](#) [yw](#)

Examples

```
M = c("diff",1)
e = Resid(dowj,M)
a = arma(e,1,0)
print(a)
```

`autofit`*Find the best model from a range of possible ARMA models*

Description

Find the best model from a range of possible ARMA models

Usage

```
autofit(x, p = 0:5, q = 0:5)
```

Arguments

<code>x</code>	Time series data (typically residuals from <code>Resid</code>)
<code>p</code>	Range of AR orders
<code>q</code>	Range of MA orders

Details

Tries all combinations of `p` and `q` and returns the model with the lowest AICC. The arguments `p` and `q` should be small ranges as this function can be slow otherwise. The innovations algorithm is used to estimate white noise variance.

Value

Returns an ARMA model consisting of a list with the following components.

<code>phi</code>	Vector of AR coefficients (index number equals coefficient subscript)
<code>theta</code>	Vector of MA coefficients (index number equals coefficient subscript)
<code>sigma2</code>	White noise variance
<code>aicc</code>	Akaike information criterion corrected
<code>se.phi</code>	Standard errors for the AR coefficients
<code>se.theta</code>	Standard errors for the MA coefficients

See Also

[arma](#)

Examples

```
M = c("diff",1)
e = Resid(dowj,M)
a = autofit(e)
print(a)
```

burg	<i>Estimate AR coefficients using the Burg method</i>
------	---

Description

Estimate AR coefficients using the Burg method

Usage

```
burg(x, p)
```

Arguments

x	Time series data (typically residuals from Resid)
p	AR order

Details

The innovations algorithm is used to estimate white noise variance.

Value

Returns an ARMA model consisting of a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	0
sigma2	White noise variance
aicc	Akaike information criterion corrected
se.phi	Standard errors for the AR coefficients
se.theta	0

See Also

[arma hannan ia yw](#)

Examples

```
M = c("diff",1)
e = Resid(dowj,M)
a = burg(e,1)
print(a)
```

check	<i>Check for causality and invertibility</i>
-------	--

Description

Check for causality and invertibility

Usage

```
check(a)
```

Arguments

a	ARMA model
---	------------

Details

The ARMA model is a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Value

None

Examples

```
a = specify(ar=c(0,0,.99))
check(a)
```

deaths	<i>USA accidental deaths, 1973 to 1978</i>
--------	--

Description

USA accidental deaths, 1973 to 1978

Examples

```
plotc(deaths)
```

dowj	<i>Dow Jones utilities index, August 28 to December 18, 1972</i>
------	--

Description

Dow Jones utilities index, August 28 to December 18, 1972

Examples

```
plotc(dowj)
```

forecast	<i>Forecast future values</i>
----------	-------------------------------

Description

Forecast future values

Usage

```
forecast(x, M, a, h = 10, opt = 2, alpha = 0.05)
```

Arguments

x	Time series data
M	Data model
a	ARMA model
h	Steps ahead
opt	Display option (0 silent, 1 tabulate, 2 plot and tabulate)
alpha	Level of significance

Details

The data model can be NULL for none. Otherwise M is a vector of function names and arguments.

Example:

```
M = c("log", "season", 12, "trend", 1)
```

The above model takes the log of the data, then subtracts a seasonal component of period 12, then subtracts a linear trend component.

These are the available functions:

diff	Difference the data. Has a single argument, the lag.
hr	Subtract harmonic components. Has one or more arguments, each specifying the number of observations per harmonic.
log	Take the log of the data, has no arguments.
season	Subtract a seasonal component. Has a single argument, the number of observations per season.
trend	Subtract a trend component. Has a single argument, the order of the trend (1 linear, 2 quadratic, etc.)

At the end of the model there is an implicit subtraction of the mean operation. Hence the resulting time series always has zero mean.

All of the functions are inverted before the forecast results are displayed.

Value

Returns the following list invisibly.

pred	Predicted values
se	Standard errors (not returned for data models with log)
l	Lower bounds (95% confidence interval)
u	Upper bounds

See Also

[arma Resid test](#)

Examples

```
M = c("log", "season", 12, "trend", 1)
e = Resid(wine, M)
a = arma(e, 1, 1)
forecast(wine, M, a)
```

hannan

Estimate ARMA coefficients using the Hannan-Rissanen algorithm

Description

Estimate ARMA coefficients using the Hannan-Rissanen algorithm

Usage

```
hannan(x, p, q)
```

Arguments

x	Time series data (typically residuals from Resid)
p	AR order
q	MA order ($q > 0$)

Details

The innovations algorithm is used to estimate white noise variance.

Value

Returns an ARMA model consisting of a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance
aicc	Akaike information criterion corrected
se.phi	Standard errors for the AR coefficients
se.theta	Standard errors for the MA coefficients

See Also

[arma burg ia yw](#)

Examples

```
M = c("diff",12)
e = Resid(deaths,M)
a = hannan(e,1,1)
print(a)
```

hr *Estimate harmonic components*

Description

Estimate harmonic components

Usage

```
hr(x, d)
```

Arguments

x	Time series data
d	Vector of harmonic periods

Value

Returns a vector the same length as x. Subtract from x to obtain residuals.

Examples

```
y = hr(deaths,c(12,6))
plotc(deaths,y)
```

*ia**Estimate MA coefficients using the innovations algorithm*

Description

Estimate MA coefficients using the innovations algorithm

Usage

```
ia(x, q, m = 17)
```

Arguments

x	Time series data (typically residuals from Resid)
q	MA order
m	Recursion level

Details

Normally *m* should be set to the default value. The innovations algorithm is used to estimate white noise variance.

Value

Returns an ARMA model consisting of a list with the following components.

phi	0
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance
aicc	Akaike information criterion corrected
se.phi	0
se.theta	Standard errors for the MA coefficients

See Also

[arma burg hannan yw](#)

Examples

```
M = c("diff",1)
e = Resid(dowj,M)
a = ia(e,1)
print(a)
```

lake	<i>Level of Lake Huron, 1875 to 1972</i>
------	--

Description

Level of Lake Huron, 1875 to 1972

Examples

```
plotc(lake)
```

ma.inf	<i>Compute MA infinity coefficients</i>
--------	---

Description

Compute MA infinity coefficients

Usage

```
ma.inf(a, n = 50)
```

Arguments

a	ARMA model
n	Order

Details

The ARMA model is a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Value

Returns a vector of length n+1 to accomodate coefficient 0 at index 1.

See Also

[ar.inf](#)

Examples

```
M = c("diff", 12)
e = Resid(deaths, M)
a = arma(e, 1, 1)
ma.inf(a, 10)
```

periodogram

Plot a periodogram

Description

Plot a periodogram

Usage

```
periodogram(x, q = 0, opt = 2)
```

Arguments

x	Time series data
q	MA filter order
opt	Plot option (0 silent, 1 periodogram only, 2 periodogram and filter)

Details

The filter q can be a vector in which case the overall filter is the composition of MA filters of the designated orders.

Value

The periodogram vector divided by 2π is returned invisibly.

See Also

[plots](#)

Examples

```
periodogram(Sunspots, c(1, 1, 1, 1))
```

plota	<i>Plot data and/or model ACF and PACF</i>
-------	--

Description

Plot data and/or model ACF and PACF

Usage

```
plota(u, v = NULL, h = 40)
```

Arguments

u, v	Data and/or ARMA model in either order
h	Maximum lag

Value

None

Examples

```
plota(Sunspots)
a = yw(Sunspots, 2)
plota(Sunspots, a)
```

plotc	<i>Plot one or two time series</i>
-------	------------------------------------

Description

Plot one or two time series

Usage

```
plotc(y1, y2 = NULL)
```

Arguments

y1	Data vector (plotted in blue with knots)
y2	Data vector (plotted in red, no knots)

Value

None

Examples

```
plotc(uspop)
y = trend(uspop,2)
plotc(uspop,y)
```

plots	<i>Plot spectrum of data or ARMA model</i>
-------	--

Description

Plot spectrum of data or ARMA model

Usage

```
plots(u)
```

Arguments

u Data vector or an ARMA model

Value

None

See Also

[periodogram](#)

Examples

```
a = specify(ar=c(0,0,.99))
plots(a)
```

Resid	<i>Compute residuals</i>
-------	--------------------------

Description

Compute residuals

Usage

```
Resid(x, M = NULL, a = NULL)
```

Arguments

x	Time series data
M	Data model
a	ARMA model

Details

The data model can be NULL for none. Otherwise M is a vector of function names and arguments.

Example:

```
M = c("log", "season", 12, "trend", 1)
```

The above model takes the log of the data, then subtracts a seasonal component of period 12, then subtracts a linear trend component.

These are the available functions:

diff	Difference the data. Has a single argument, the lag.
hr	Subtract harmonic components. Has one or more arguments, each specifying the number of observations per harmonic.
log	Take the log of the data, has no arguments.
season	Subtract a seasonal component. Has a single argument, the number of observations per season.
trend	Subtract a trend component. Has a single argument, the order of the trend (1 linear, 2 quadratic, etc.)

At the end of the model there is an implicit subtraction of the mean operation. Hence the resulting time series always has zero mean.

Value

Returns a vector of residuals the same length as x.

See Also

[test](#)

Examples

```
M = c("log", "season", 12, "trend", 1)
e = Resid(wine, M)
```

```
a = arma(e, 1, 1)
ee = Resid(wine, M, a)
```

season

Estimate seasonal component

Description

Estimate seasonal component

Usage

```
season(x, d)
```

Arguments

x	Time series data
d	Number of observations per season

Value

Returns a vector the same length as x. Subtract from x to obtain residuals.

See Also

[trend](#)

Examples

```
y = season(deaths,12)
plotc(deaths,y)
```

selftest

Run a self test

Description

Run a self test

Usage

```
selftest()
```

Details

This function is a useful check if the code is modified.

Value

None

Examples

```
selftest()
```

sim	<i>Generate synthetic observations</i>
-----	--

Description

Generate synthetic observations

Usage

```
sim(a, n = 100)
```

Arguments

a	ARMA model
n	Number of synthetic observations required

Details

The ARMA model is a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Value

Returns a vector of n synthetic observations.

Examples

```
a = specify(ar=c(0,0,.99))
x = sim(a,60)
plotc(x)
```

smooth.exp	<i>Apply an exponential filter</i>
------------	------------------------------------

Description

Apply an exponential filter

Usage

```
smooth.exp(x, alpha)
```

Arguments

x	Time series data
alpha	Smoothness setting, 0-1

Details

Zero is maximum smoothness.

Value

Returns a vector of smoothed data the same length as x.

Examples

```
y = smooth.exp(strikes,.4)
plotc(strikes,y)
```

smooth.fft	<i>Apply a low pass filter</i>
------------	--------------------------------

Description

Apply a low pass filter

Usage

```
smooth.fft(x, f)
```

Arguments

x	Time series data
f	Cut-off frequency, 0-1

Details

The cut-off frequency is specified as a fraction. For example, $c=.25$ passes the lowest 25% of the spectrum.

Value

Returns a vector the same length as x.

Examples

```
y = smooth.fft(deaths,.1)
plotc(deaths,y)
```

smooth.ma	<i>Apply a moving average filter</i>
-----------	--------------------------------------

Description

Apply a moving average filter

Usage

```
smooth.ma(x, q)
```

Arguments

x	Time series data
q	Filter order

Details

The averaging function uses $2q+1$ values.

Value

Returns a vector the same length as x.

Examples

```
y = smooth.ma(strikes,2)
plotc(strikes,y)
```

smooth.rank	<i>Apply a spectral filter</i>
-------------	--------------------------------

Description

Apply a spectral filter

Usage

```
smooth.rank(x, k)
```

Arguments

x	Time series data
k	Number of frequencies

Details

Passes the mean and the k frequencies with the highest amplitude. The remainder of the spectrum is filtered out.

Value

Returns a vector the same length as x .

Examples

```
y = smooth.rank(deaths,2)
plotc(deaths,y)
```

specify

Specify an ARMA model

Description

Specify an ARMA model

Usage

```
specify(ar = 0, ma = 0, sigma2 = 1)
```

Arguments

ar	Vector of AR coefficients (index number equals coefficient subscript)
ma	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Value

Returns an ARMA model consisting of a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	Vector of MA coefficients (index number equals coefficient subscript)
sigma2	White noise variance

Examples

```
specify(ar=c(0,0,.99))
```

strikes	<i>USA union strikes, 1951-1980</i>
---------	-------------------------------------

Description

USA union strikes, 1951-1980

Examples

```
plotc(strikes)
```

Sunspots	<i>Number of sunspots, 1770 to 1869</i>
----------	---

Description

Number of sunspots, 1770 to 1869

Examples

```
plotc(Sunspots)
```

test	<i>Test residuals for stationarity and randomness</i>
------	---

Description

Test residuals for stationarity and randomness

Usage

```
test(e)
```

Arguments

e Time series data (typically residuals from Resid)

Details

Plots ACF, PACF, residuals, and QQ. Displays results for Ljung-Box, McLeod-Li, turning point, difference-sign, and rank tests. The plots can be used to check for stationarity and the other tests check for white noise.

Value

None

See Also

[Resid](#)

Examples

```
M = c("log", "season", 12, "trend", 1)
e = Resid(wine, M)
test(e) ## Is e stationary?
a = arma(e, 1, 1)
ee = Resid(wine, M, a)
test(ee) ## Is ee white noise?
```

trend	<i>Estimate trend component</i>
-------	---------------------------------

Description

Estimate trend component

Usage

```
trend(x, p)
```

Arguments

x	Time series data
p	Polynomial order (1 linear, 2 quadratic, etc.)

Value

Returns a vector the same length as x. Subtract from x to obtain residuals. The returned vector is the least squares fit of a polynomial to the data.

See Also

[season](#)

Examples

```
y = trend(uspop, 2)
plotc(uspop, y)
```

wine	<i>Australian red wine sales, January 1980 to October 1991</i>
------	--

Description

Australian red wine sales, January 1980 to October 1991

Examples

```
plotc(wine)
```

yw	<i>Estimate AR coefficients using the Yule-Walker method</i>
----	--

Description

Estimate AR coefficients using the Yule-Walker method

Usage

```
yw(x, p)
```

Arguments

x	Time series data (typically residuals from Resid)
p	AR order

Details

The innovations algorithm is used to estimate white noise variance.

Value

Returns an ARMA model consisting of a list with the following components.

phi	Vector of AR coefficients (index number equals coefficient subscript)
theta	0
sigma2	White noise variance
aicc	Akaike information criterion corrected
se.phi	Standard errors for the AR coefficients
se.theta	0

See Also

[arma](#) [burg](#) [hannan](#) [ia](#)

Examples

```
M = c("diff",1)
e = Resid(dowj,M)
a = yw(e,1)
```

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