

# Package ‘robets’

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**Type** Package

**Title** Forecasting Time Series with Robust Exponential Smoothing

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**Description**

We provide an outlier robust alternative of the function `ets()` in the ‘forecast’ package of Hyndman and Khandakar (2008) <[DOI:10.18637/jss.v027.i03](https://doi.org/10.18637/jss.v027.i03)>. For each method of a class of exponential smoothing variants we made a robust alternative. The class includes methods with a damped trend and/or seasonal components. The robust method is developed by robustifying every aspect of the original exponential smoothing variant. We provide robust forecasting equations, robust initial values, robust smoothing parameter estimation and a robust information criterion. The method is described in more detail in Crevits and Croux (2016) <[DOI:10.13140/RG.2.2.11791.18080](https://doi.org/10.13140/RG.2.2.11791.18080)>.

**License** GPL-3

**Depends** R (>= 3.1.1)

**Imports** Rcpp (>= 0.12.2), forecast

**LinkingTo** Rcpp

**LazyData** true

**ByteCompile** true

**BugReports** <https://github.com/RubenCrevits/robets/issues>

**URL** <http://github.com/RubenCrevits/robets>

**RoxygenNote** 6.0.1

**NeedsCompilation** yes

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coef.robets	<i>Coef robets model</i>
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**Description**

Coef robets model

**Usage**

```
## S3 method for class 'robets'
coef(object, ...)
```

**Arguments**

object	An object of class robets.
...	Other undocumented arguments.

**Examples**

```
model <- robets(nottem)
coef(model)
```

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forecast.robets	<i>Forecasting using ROBETS models</i>
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**Description**

Returns forecasts and other information for univariate ROBETS models.

**Usage**

```
## S3 method for class 'robets'
forecast(object, h = ifelse(object$m > 1, 2 * object$m, 10),
  level = c(80, 95), PI = TRUE, lambda = object$lambda, ...)
```

### Arguments

object	An object of class "robets". Usually the result of a call to <a href="#">robets</a> .
h	Number of periods for forecasting
level	Confidence level for prediction intervals.
PI	If TRUE, prediction intervals are calculated.
lambda	Box-Cox transformation parameter. Ignored if NULL. Otherwise, forecasts back-transformed via an inverse Box-Cox transformation.
...	Other arguments.

### Details

The code of this function is based on the function `forecast.ets` of the package `forecast` of Hyndman and Khandakar (2008).

### Value

An object of class "forecast". The function `summary` is used to obtain and print a summary of the results, while the function `plot` produces a plot of the forecasts. The generic accessor functions `fitted.values` and `residuals` extract useful features of the value returned by `forecast.robets`. An object of class "forecast" is a list containing at least the following elements:

- `model`: A list containing information about the fitted model
- `method`: The name of the forecasting method as a character string
- `mean`: Point forecasts as a time series
- `x`: The original time series (either object itself or the time series used to create the model stored as object).
- `residuals`: Residuals from the fitted model. For models with additive errors, the residuals are  $x - \text{fitted values}$ . For models with multiplicative errors, the residuals are equal to  $x / (\text{fitted values}) - 1$ .
- `fitted`: Fitted values (one-step ahead forecasts)

### Author(s)

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### References

Crevits, R., and Croux, C (2016) "Forecasting with Robust Exponential Smoothing with Damped Trend and Seasonal Components". *Working paper*. <https://doi.org/10.13140/RG.2.2.11791.18080>

Hyndman, R. J., and Khandakar, Y (2008) "Automatic time series forecasting: The forecasting package for R". *Journal of Statistical Software* **27**(3). <https://doi.org/10.18637/jss.v027.i03>

### See Also

[robets](#)

**Examples**

```
library(forecast)
model <- robets(nottem)
plot(forecast(model))
```

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plot.robets	<i>Plot robets model</i>
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**Description**

Plot robets model

**Usage**

```
## S3 method for class 'robets'
plot(x, ...)
```

**Arguments**

x	An object of class robets.
...	Other plotting parameters.

**See Also**

[plotOutliers](#), [plot.ets](#)

**Examples**

```
model <- robets(nottem)
plot(model)
```

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plotOutliers	<i>Plot outliers detected by robets model</i>
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**Description**

Plot outliers detected by robets model

**Usage**

```
plotOutliers(object, xlab = "", ylab = "", type = "l", ...)
```

### Arguments

object	An object of class robets.
xlab	Label of the x-axis.
ylab	Label of the y-axis.
type	Character indicating the type of plot, just as in plot.
...	Other plotting parameters.

### See Also

[plot.robets](#)

### Examples

```
model <- robets(nottem)
plotOutliers(model)
```

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<code>print.robets</code>	<i>Print robets model</i>
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---

### Description

Print robets model

### Usage

```
## S3 method for class 'robets'
print(x, ...)
```

### Arguments

x	An object of class robets.
...	Other undocumented arguments.

### Examples

```
model <- robets(nottem)
print(model)
```

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robets	<i>Robust exponential smoothing model</i>
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### Description

Returns robets model applied to  $y$ .

### Usage

```
robets(y, model = "ZZZ", damped = NULL, alpha = NULL, beta = NULL,
       gamma = NULL, phi = NULL, additive.only = FALSE, lambda = NULL,
       lower = c(rep(1e-04, 3), 0.8), upper = c(rep(0.9999, 3), 0.98),
       opt.crit = c("roblik", "tau2", "lik", "mse", "amse", "sigma", "mae"),
       bounds = c("both", "usual", "admissible"), ic = c("robaicc", "robaic",
       "robbic", "aicc", "bic", "aic"), use.initial.values = TRUE,
       opt.initial.values = FALSE, rob.start.initial.values = TRUE,
       opt.sigma0 = FALSE, k = 3, nmse = 1, ...)
```

### Arguments

<code>y</code>	a numeric vector or time series
<code>model</code>	A three-letter string indicating the method using the framework terminology of Hyndman et al. (2008). The first letter denotes the error type ("A", "M" or "Z"); the second letter denotes the trend type ("N", "A" or "Z"); and the third letter denotes the season type ("N", "A", "M" or "Z"). In all cases, "N"=none, "A"=additive, "M"=multiplicative and "Z"=automatically selected. So, for example, "ANN" is simple exponential smoothing with additive errors, "MAM" is multiplicative Holt-Winters' method with multiplicative errors, and so on. It is also possible for the model to be of class "robets", and equal to the output from a previous call to robets. In this case, the same model is fitted to $y$ without re-estimating any smoothing parameters. See also the <code>use.initial.values</code> argument.
<code>damped</code>	If TRUE, use a damped trend. If NULL, both damped and non-damped trends will be tried and the best model (according to the information criterion <code>ic</code> ) will be returned.
<code>alpha</code>	Value of alpha. If NULL, it is estimated.
<code>beta</code>	Value of beta. If NULL, it is estimated.
<code>gamma</code>	Value of gamma. If NULL, it is estimated.
<code>phi</code>	Value of phi. If NULL, it is estimated.
<code>additive.only</code>	If TRUE, will only consider additive models. Default is FALSE.
<code>lambda</code>	Box-Cox transformation parameter. Ignored if NULL. Otherwise, data transformed before model is estimated. When <code>lambda=TRUE</code> , <code>additive.only</code> is set to FALSE.
<code>lower</code>	Lower bounds for the parameters (alpha, beta, gamma, phi)

upper	Upper bounds for the parameters (alpha, beta, gamma, phi)
opt.crit	Optimization criterion. One of "roblik" (Robust Log-likelihood, default), "tau2" (Tau squared error of the residuals), "mse" (Mean Square Error), "amse" (Average MSE over first nmse forecast horizons), "sigma" (Standard deviation of residuals), "mae" (Mean of absolute residuals), or "lik" (Log-likelihood).
bounds	Type of parameter space to impose: "usual" indicates all parameters must lie between specified lower and upper bounds; "admissible" indicates parameters must lie in the admissible space; "both" (default) takes the intersection of these regions.
ic	Information criterion to be used in model selection.
use.initial.values	If TRUE (default) and model is of class "robets", then the initial values in the model are also not re-estimated.
opt.initial.values	If FALSE (default) a robust heuristic is used for choosing the initial values. If TRUE the initial values are part of the problem to optimize opt.crit. Neglected if use.initial.values is TRUE and model is of class "robets".
rob.start.initial.values	If TRUE (default) the initial values are computed via the robust heuristic described in Crevits and Croux (2016). If FALSE the initial values are computed via the same heuristic as in Hyndman et al. (2008). The initial values computed with these methods are further optimized if opt.initial.values is TRUE.
opt.sigma0	If FALSE (default) sigma0 is equal to the value computed together with the other initial values via a heuristic. If TRUE sigma0 is included as a variable in the optimization problem. It is not recommended to set opt.sigma0 = TRUE.
k	Value of k in forecasting equations. k=3 is default. If NULL, k is included as a variable in the optimization problem. It is not recommended to set k = NULL.
nmse	Number of steps for AMSE ( $1 \leq \text{nmse} \leq 30$ ), nmse=1 is default.
...	Other undocumented arguments.

### Details

The code is an extended version of the code of the function ets of the package forecast of Hyndman and Khandakar (2008). The methodology is an extended version of Gelper et al. (2008). In Crevits and Croux (2016) the methodology of robets is described in full.

### Value

An object of class "robets".

### Author(s)

Ruben Crevits, <ruben.crevits@kuleuven.be>, <https://rcrevits.wordpress.com/research>

## References

Crevits, R., and Croux, C (2016) "Forecasting with Robust Exponential Smoothing with Damped Trend and Seasonal Components". *Working paper*. <https://doi.org/10.13140/RG.2.2.11791.18080>

Gelper S., Fried R. and Croux C. (2010) "Robust Forecasting with Exponential and Holt-Winters Smoothing". *Journal of Forecasting*, **29**, 285-300. <https://doi.org/10.1002/for.1125>

Hyndman, R. J., and Khandakar, Y (2008) "Automatic time series forecasting: The forecasting package for R". *Journal of Statistical Software* **27**(3). <https://doi.org/10.18637/jss.v027.i03>

## See Also

[forecast.robets](#), [plot.robets](#), [plotOutliers](#), [tau2](#), [ets](#)

## Examples

```
library(forecast)
model <- robets(nottem)
plot(forecast(model))
```

---

summary.robets

*Summary robets model*

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## Description

Summary robets model

## Usage

```
## S3 method for class 'robets'
summary(object, ...)
```

## Arguments

object            An object of class robets.  
...                Other undocumented arguments.

## Value

A number of training set error measures: ME (mean error), RMSE (root mean squared error), MAE (mean absolute error), MPE (mean percentage error), MAPE (mean absolute percentage error), MedianE (median error), RTSE (root tau squared error), RTSPE (root tau squared percentage error).

## Examples

```
model <- robets(nottem)
summary(model)
```



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`tau2`*Compute the tau2 estimator of scale*

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**Description**

The tau2-estimator is a robust measure of the scale. The exact formula of the estimator is in Crevits and Croux (2016), equation 3.10.

**Usage**`tau2(x)`**Arguments**

`x` A vector of residuals.

**Value**

The tau2 estimate of scale.

**References**

Crevits, R., and Croux, C (2016) "Forecasting with Robust Exponential Smoothing with Damped Trend and Seasonal Components". *Working paper*. <https://doi.org/10.13140/RG.2.2.11791.18080>

**Examples**

```
set.seed(100)
e <- 10*rnorm(100)
mse <- mean(e^2)
tse <- tau2(e)
```

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