Package ‘fGarch’

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Author Diethelm Wuertz and Yohan Chalabi with contribution from Michal
Miklovic, Chris Boudt, Pierre Chausse and others
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Maintainer Yohan Chalabi <yohan.chalabi@rmetrics.org>
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NOTE SEVERAL PARTS ARE STILL PRELIMINARY AND MAY BE CHANGED IN THE
FUTURE. THIS TYPICALLY INCLUDES FUNCTION AND ARGUMENT NAMES, AS
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# GARCH Modelling Package

**Description**

Package of econometric functions for modelling GARCH processes.

## Details

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GARCH, Generalized Autoregressive Conditional Heteroskedastic, models have become important in the analysis of time series data, particularly in financial applications when the goal is to analyze and forecast volatility.

For this purpose, the family of GARCH functions offers functions for simulating, estimating and forecasting various univariate GARCH-type time series models in the conditional variance and an ARMA specification in the conditional mean. The function `garchfit` is a numerical implementation of the maximum log-likelihood approach under different assumptions, Normal, Student-t, GED errors or their skewed versions. The parameter estimates are checked by several diagnostic analysis tools including graphical features and hypothesis tests. Functions to compute n-step ahead forecasts of both the conditional mean and variance are also available.

The number of GARCH models is immense, but the most influential models were the first. Beside the standard ARCH model introduced by Engle [1982] and the GARCH model introduced by Bollerslev [1986], the function `garchfit` also includes the more general class of asymmetric power ARCH models, named APARCH, introduced by Ding, Granger and Engle [1993]. The APARCH models include as special cases the TS-GARCH model of Taylor [1986] and Schwert [1989], the GJR-GARCH model of Glosten, Jaganathan, and Runkle [1993], the T-ARCH model of Zakoian [1993], the N-ARCH model of Higgins and Bera [1992], and the Log-ARCH model of Geweke [1986] and Pentula [1986].


**Time Series Simulation**

contains functions to simulate artificial GARCH and APARCH time series processes.

Functions:

- `garchSpec` Specifies an univariate GARCH time series model,
- `garchSim` Simulates a GARCH/APARCH process.

**Parameter Estimation**

contains functions to fit the parameters of GARCH and APARCH time series processes.

Functions:

- `garchFit` Fits the parameters of a GARCH process,
- `residuals` Extracts residuals from a fitted ‘fGARCH’ object,
- `fitted` Extracts fitted values from a fitted ‘fGARCH’ object,
- `volatility` Extracts conditional volatility from a fitted ‘fGARCH’ object,
- `coef` Extracts coefficients from a fitted ‘fGARCH’ object,
- `formula` Extracts formula expression from a fitted ‘fGARCH’ object.

**Forecasting**

contains functions to forecast mean and variance of GARCH and APARCH processes.

Functions:
predict Forecasts from an object of class 'fGARCH'.

**Standardized Distribution Functions**

contains functions to model standardized distribution functions.

Functions:

- \([dpqr]\text{norm}\) Normal distribution function,
- \([dpqr]\text{snorm}\) Skew Normal distribution function,
- \([s]\text{normFit}\) Fits parameters of skew Normal distribution,
- \([dpqr]\text{ged}\) Generalized Error distribution function,
- \([dpqr]\text{sged}\) Skew Generalized Error distribution function,
- \([s]\text{gedFit}\) Fits parameters of skew Generalized Error distribution,
- \([dpqr]\text{std}\) Standardized Student-t distribution function,
- \([dpqr]\text{sstd}\) Skew standardized Student-t distribution function,
- \([s]\text{stdFit}\) Fits parameters of skew Student-t distribution,
- \(\text{absMoments}\) Computes absolute Moments of these distribution.

**OX Interface**

NOTE: garchOxFit is no longer part of fGarch package. If you are interested to use, please contact us.

contains a Windows interface to OX.

The function garchOxFit interfaces a subset of the functionality of the G@ARCH 4.0 Package written in Ox. G@ARCH 4.0 is one of the most sophisticated packages for modeling univariate GARCH processes including GARCH, EGARCH, GJR, APARCH, IGARCH, FIGARCH, FIEGARCH, FAPARCH and HYGARCH models. Parameters can be estimated by approximate (Quasi-) maximum likelihood methods under four assumptions: normal, Student-t, GED or skewed Student-t errors.

**Author(s)**

Diethelm Wuertz and Rmetrics Core Team.

---

**absMoments**  
*Absolute Moments of GARCH Distributions*

**Description**

Computes absolute Moments of the skew Normal, skew GED, and standardized skew Student-t distributions

**Usage**

```
absMoments(n, density = c("dnorm", "dge", "dstd"), ...)
```
**Arguments**

- **density**: a character string naming the symmetric density function.
- **n**: the number of absolute Moments.
- **...**: parameters passed to the density function.

**Value**

`absMoments` returns a numeric vector of length `n` with the values of the absolute moments of the selected density function.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**References**


**Examples**

```r
## absMoments -
absMoments(4, "std", nu = 4)
```

---

**Description**

Coefficients methods for GARCH Modelling.

**Methods**

- **object = "ANY"**: Generic function.
- **object = "fGARCH"**: Extractor function for coefficients from a fitted GARCH model.
- **object = "fGARCHSPEC"**: Extractor function for coefficients from a GARCH specification structure.

**Note**

`coef` is a generic function which extracts coefficients from objects returned by modeling functions.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.
Examples

```r
## garchSpec -
# Use default parameters beside alpha:
spec = garchSpec(model = list(alpha = c(0.05, 0.05)))
spec
coeff(spec)

## garchSim -
# Simulate an univariate "timeSeries" series
x = garchSim(spec, n = 200)
x = x[,1]

## garchFit -
fit = garchFit(~ garch(1, 1), data = x)

## coef -
coeff(fit)
```

---

fGARCH-class

Class "fGARCH"

Description

The class fGARCH represents a model of an heteroskedastic time series process.

Objects from the Class

Objects can be created by calls of the function garchFit. This object is a parameter estimate of an empirical GARCH process.

Slots

call: Object of class "call": the call of the garch function.
formula: Object of class "formula": a formula object specifying mean and variance equation.
method: Object of class "character": a string denoting the optimization method, by default the returneds string is "Max Log-Likelihood Estimation".
data: Object of class "list": a list with one entry named x, containing the data of the time series to be estimated, the same as given by the input argument series.
fit: Object of class "list": a list with the results from the parameter estimation. The entries of the list depend on the selected algorithm, see below.
residuals: Object of class "numeric": a numeric vector with the residual values.
fitted: Object of class "numeric": a numeric vector with the fitted values.
h.t: Object of class "numeric": a numeric vector with the conditional variances.
sigma.t: Object of class "numeric": a numeric vector with the conditional standard deviations.
title: Object of class "character": a title string.
description: Object of class "character": a string with a brief description.
Methods

plot signature(x = "fGARCH", y = "missing"): plots an object of class 'fGARCH'.
show signature(object = "fGARCH"): prints an object of class 'fGARCH'.
summary signature(object = "fGARCH"): summarizes an object of class 'fGARCH'.
predict signature(object = "fGARCH"): forecasts mean and volatility from an object of class 'fGARCH'.
fitted signature(object = "fGARCH"): extracts fitted values from an object of class 'fGARCH'.
residuals signature(object = "fGARCH"): extracts residuals from an object of class 'fGARCH'.
volatility signature(object = "fGARCH"): extracts conditional volatility from an object of class 'fGARCH'.
coef signature(object = "fGARCH"): extracts fitted coefficients from an object of class 'fGARCH'.
formula signature(x = "fGARCH"): extracts formula expression from an object of class 'fGARCH'.

Author(s)

Diethelm Wuertz and Rmetrics Core Team.

fGARCHSPEC-class

Class "fGARCHSPEC"

Description

Specification Structure for an univariate GARCH time series model.

Objects from the Class

Objects can be created by calls of the function garchSpec. This object is specifies the parameters of an empirical GARCH process.

Slots

call: Object of class "call": the call of the garch function.
formula: Object of class "formula": a list with two formula entries for the mean and variance equation.
model: Object of class "list": a list with the model parameters.
presample: Object of class "matrix": a numeric matrix with presample values.
distribution: Object of class "character": a character string with the name of the conditional distribution.
rseed: Object of class "numeric": an integer with the random number generator seed.

Methods

show signature(object = "fGARCHSPEC"): prints an object of class 'fGARCHSPEC'.

fgarchspec-class

Class "fgarchspec"
Note

With Rmetrics Version 2.6.1 the class has been renamed from "garchSpec" to "fGARCHSPEC".

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

---

fitted-methods  
Extract GARCH Model Fitted Values

Description

Extracts fitted values from a fitted GARCH object.

Details

The function extracts the @fitted value slot from an object of class "fGARCH" as returned by the function garchFit.

The class of the returned value depends on the input to the function garchFit who created the object. The returned value is always of the same class as the input object to the argument data in the function garchFit, i.e. if you fit a "timeSeries" object, you will get back from the function fitted also a "timeSeries" object, if you fit an object of class "zoo", you will get back again a "zoo" object. The same holds for a "numeric" vector, for a "data.frame", and for objects of class "ts", "mts".

In contrast, the slot itself returns independent of the class of the data input always a numeric vector, i.e. the function call rslot(object, "fitted") will return a numeric vector.

Methods

object = "ANY"  Generic function.
object = "fGARCH"  Extractor function for fitted values.

Note

fitted is a generic function which extracts fitted values from objects returned by modeling functions.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.
Examples

```r
## Swiss Pension fund Index -
  x = as.timeSeries(data(LPP2005REC))

## garchFit -
# Fit LPP40 Bechmark:
  fit = garchFit(LPP40 - garch(1, 1), data = 100*x, trace = FALSE)
  fit

## fitted -
# Fitted values are now a "timeSeries" object:
  fitted = fitted(fit)
  head(fitted)
  class(fitted)

## slot -
# The slot contains a numeric Vector:
  fitted = slot(fit, "fitted")
  head(fitted)
  class(fitted)
```

Description

Extracts formula from a formula GARCH object.

Details

The function extracts the @formula expression slot from an object of class “fgARCH” as returned by the function garchFit.

Note, the returned formula has always a left hand side. If the argument data was an univariate time series and no name was specified to the series, then the left hand side has assigned the name of the data.set. In the multivariate case the rectangular data object must always have column names, otherwise the fitting will be stopped and you get the error message.

The class of the returned value depends on the input to the function garchFit who created the object. The returned value is always of the same class as the input object to the argument data in the function garchFit, i.e. if you fit a "timeSeries" object, you will get back from the function fitted also a "timeSeries" object, if you fit an object of class "zoo", you will get back again a "zoo" object. The same holds for a "numeric" vector, for a "data.frame", and for objects of class "ts", "mts".

In contrast, the slot itself returns independent of the class of the data input always a numeric vector, i.e. the function call `slot(object, "fitted")` will return a numeric vector.
Methods

object = "ANY"  Generic function.
object = "fGARCH"  Extractor function for formula expression.

Note

formula is a generic function which extracts the formula expression from objects returned by modeling functions.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

Examples

```r
## garchFit -
fit = garchFit(~garch(1, 1), data = garchSim())

## formula -
formula(fit)

## A Bivariate series and mis-specified formula:
x = garchSim(n = 500)
y = garchSim(n = 500)
z = cbind(x, y)
colnames(z)
class(z)
## Not run:
garchFit(z ~garch(1, 1), data = z, trace = FALSE)

## End(Not run)
# Returns:
# Error in .garchArgsParser(formula = formula, data = data, trace = FALSE) :
# Formula and data units do not match.

## Doubled column names in data set - formula can't fit:
colnames(z) <- c("x", "x")
z[1:6,]
## Not run:
garchFit(x ~garch(1, 1), data = z, trace = FALSE)

## End(Not run)
# Again the error will be noticed:
# Error in garchFit(x ~ garch(1, 1), data = z) :
# Column names of data are not unique.

## Missing column names in data set - formula can't fit:
z.mat <- as.matrix(z)
colnames(z.mat) <- NULL
z.mat[1:6,]
## Not run:
```
Estimates the parameters of an univariate ARMA-GARCH/APARCH process.

Usage

```r
garchFit(formula = ~ garch(1, 1), data = dem2gbp, 
  init.rec = c("mci", "uev"), 
  delta = 2, skew = 1, shape = 4, 
  cond.dist = c("norm", "snorm", "ged", "sged", "std", "sstd", 
                "snig", "QMLE"), 
  include.mean = TRUE, include.delta = NULL, include.skew = NULL, 
  include.shape = NULL, leverage = NULL, trace = TRUE, 
  algorithm = c("nlminb", "lbfgsb", "nlminb+nm", "lbfgsb+nm"), 
  hessian = c("ropt", "rcd"), control = list(), 
  title = NULL, description = NULL, ...) 
```

garchKappa(cond.dist = c("norm", "ged", "std", "snorm", "sged", "sstd", 
                         "snig"), gamma = 0, delta = 2, skew = NA, shape = NA)

Arguments

- **algorithm**: a string parameter that determines the algorithm used for maximum likelihood estimation.
- **cond.dist**: a character string naming the desired conditional distribution. Valid values are "dnorm", "dged", "dstd", "dsnorm", "dsged", "dsstd" and "QMLE". The default value is the normal distribution. See Details for more information.
- **control**: control parameters, the same as used for the functions from nlminb, and 'bfgs' and 'Nelder-Mead' from optim.
- **data**: an optional timeSeries or data frame object containing the variables in the model. If not found in data, the variables are taken from environment(formula), typically the environment from which armaFit is called. If data is an univariate series, then the series is converted into a numeric vector and the name of the response in the formula will be neglected.
garchFit

delta  a numeric value, the exponent delta of the variance recursion. By default, this value will be fixed, otherwise the exponent will be estimated together with the other model parameters if include.delta=FALSE.

description  a character string which allows for a brief description.

formula  formula object describing the mean and variance equation of the ARMA-GARCH/APARCH model. A pure GARCH(1,1) model is selected when e.g. formula=~garch(1,1).
To specify for example an ARMA(2,1)-APARCH(1,1) use formula =~arma(2,1)+apaarch(1,1).

gamma  APARCH leverage parameter entering into the formula for calculating the expectation value.

hessian  a string denoting how the Hessian matrix should be evaluated, either hessian ="rcd", or "ropt", the default, "rcd" is a central difference approximation implemented in R and "ropt" use the internal R function optimhess.

include.delta  a logical flag which determines if the parameter for the recursion equation delta will be estimated or not. If include.delta=FALSE then the shape parameter will be kept fixed during the process of parameter optimization.

include.mean  this flag determines if the parameter for the mean will be estimated or not. If include.mean=TRUE this will be the case, otherwise the parameter will be kept fixed during the process of parameter optimization.

include.shape  a logical flag which determines if the parameter for the shape of the conditional distribution will be estimated or not. If include.shape=FALSE then the shape parameter will be kept fixed during the process of parameter optimization.

include.skew  a logical flag which determines if the parameter for the skewness of the conditional distribution will be estimated or not. If include.skew=FALSE then the skewness parameter will be kept fixed during the process of parameter optimization.

init.rec  a character string indicating the method how to initialize the mean and variance recursion relation.

leverage  a logical flag for APARCH models. Should the model be leveraged? By default leverage=TRUE.

shape  a numeric value, the shape parameter of the conditional distribution.

skew  a numeric value, the skewness parameter of the conditional distribution.

title  a character string which allows for a project title.

trace  a logical flag. Should the optimization process of fitting the model parameters be printed? By default trace=TRUE.

...  additional arguments to be passed.

Details

"QMLE" stands for Quasi-Maximum Likelihood Estimation, which assumes normal distribution and uses robust standard errors for inference. Bollerslev and Wooldridge (1992) proved that if the mean and the volatility equations are correctly specified, the QML estimates are consistent and asymptotically normally distributed. However, the estimates are not efficient and “the efficiency loss can be marked under asymmetric ... distributions” (Bollerslev and Wooldridge (1992), p. 166). The
robust variance-covariance matrix of the estimates equals the (Eicker-White) sandwich estimator, i.e.

\[ V = H^{-1}G^rG^{-1}, \]

where \( V \) denotes the variance-covariance matrix, \( H \) stands for the Hessian and \( G \) represents the matrix of contributions to the gradient, the elements of which are defined as

\[ G_{t,i} = \frac{\partial l_t}{\partial \zeta_i}, \]

where \( t \) is the log likelihood of the \( t \)-th observation and \( \zeta \) is the \( i \)-th estimated parameter. See sections 10.3 and 10.4 in Davidson and MacKinnon (2004) for a more detailed description of the robust variance-covariance matrix.

Value

garchFit

returns a S4 object of class "fGARCH" with the following slots:

@call the call of the garch function.
@formula a list with two formula entries, one for the mean and the other one for the variance equation.
@method a string denoting the optimization method, by default the returneds string is "Max Log-Likelihood Estimation".
@data a list with one entry named \( x \), containing the data of the time series to be estimated, the same as given by the input argument series.
@fit a list with the results from the parameter estimation. The entries of the list depend on the selected algorithm, see below.
@residuals a numeric vector with the (raw, unstandardized) residual values.
@fitted a numeric vector with the fitted values.
@h.t a numeric vector with the conditional variances (\( h_t = \sigma_t^2 \)).
@sigma.t a numeric vector with the conditional standard deviation.
@title a title string.
@description a string with a brief description.

The entries of the @fit slot show the results from the optimization.

Author(s)

Diethelm Wuertz for the Rmetrics R-port,
R Core Team for the 'optim' R-port,
Douglas Bates and Deepayan Sarkar for the 'nlmrb' R-port,
Bell-Labs for the underlying PORT Library,
Ladislav Luksan for the underlying Fortran SQP Routine,
Zhu, Byrd, Lu-Chen and Nocedal for the underlying L-BFGS-B Routine.
References


Examples

```r
## UNIVARIATE TIME SERIES INPUT:
# In the univariate case the lhs formula has not to be specified ...

# A numeric Vector from default GARCH(1,1) - fix the seed:
N = 200
x.vec = as.vector(garchSim(garchSpec(rseed = 1985), n = N)[,1])
garchFit(~ garch(1,1), data = x.vec, trace = FALSE)

# An univariate timeSeries object with dummy dates:
x.timeSeries = dummyDailySeries(matrix(x.vec), units = "GARCH11")
garchFit(~ garch(1,1), data = x.timeSeries, trace = FALSE)

## Not run:
# An univariate zoo object:
x.zoo = zoo(as.vector(x.vec), order.by = as.Date(rownames(x.timeSeries)))
garchFit(~ garch(1,1), data = x.zoo, trace = FALSE)

## End(Not run)

# An univariate "ts" object:
x.ts = as.ts(x.vec)
garchFit(~ garch(1,1), data = x.ts, trace = FALSE)

## MULTIVARIATE TIME SERIES INPUT:
```
# For multivariate data inputs the lhs formula must be specified ...

# A numeric matrix binded with dummy random normal variates:
X.mat = cbind(GARCH11 = x.vec, R = rnorm(N))
garchFit(GARCH11 ~ garch(1,1), data = X.mat)

# A multivariate timeSeries object with dummy dates:
X.timeSeries = dummyDailySeries(X.mat, units = c("GARCH11", "R"))
garchFit(GARCH11 ~ garch(1,1), data = X.timeSeries)

## Not run:
# A multivariate zoo object:
X.zoo = zoo(X.mat, order.by = as.Date(rownames(x.timeSeries)))
garchFit(GARCH11 ~ garch(1,1), data = X.zoo)

## End(Not run)

# A multivariate "mts" object:
X.mts = as.ts(X.mat)
garchFit(GARCH11 ~ garch(1,1), data = X.mts)

## Modeling The Percentual SPI/SBI Spread From LPP Benchmark:

X.timeSeries = as.timeSeries(data(LPP2005REC))
X.mat = as.matrix(x.timeSeries)
## Not run: X.zoo = zoo(X.mat, order.by = as.Date(rownames(x.timeSeries)))
X.mts = ts(X.mat)
garchFit(100*(SPI - SBI) ~ garch(1,1), data = X.timeSeries)
# The remaining are not yet supported ...  
# garchFit(100*(SPI - SBI) ~ garch(1,1), data = X.mat)
# garchFit(100*(SPI - SBI) ~ garch(1,1), data = X.zoo)
# garchFit(100*(SPI - SBI) ~ garch(1,1), data = X.mts)

## Modeling High/Low Return Spreads From MSFT Price Series:

X.timeSeries = MSFT
garchFit(Open ~ garch(1,1), data = returns(X.timeSeries))
garchFit(100*(High-Low) ~ garch(1,1), data = returns(X.timeSeries))

---

**garchFitControl**  

**GARCH Fitting Algorithms and Control**

### Description

Estimates the parameters of an univariate GARCH process.

### Usage

```r

garchFitControl()
```
Arguments

- `llh`: `llh = c("filter", "internal", "testing")[1]`, defaults to "filter".
- `nlminb.eval.max`: Maximum number of evaluations of the objective function allowed, defaults to 200.
- `nlminb.iter.max`: Maximum number of iterations allowed, defaults to 150.
- `nlminb.abs.tol`: Absolute tolerance, defaults to 1e-20.
**garchFitControl**

- `nlminb.rel.tol` Relative tolerance, defaults to 1e-10.
- `nlminb.x.tol` X tolerance, defaults to 1.5e-8.
- `nlminb.fsca`le defaults to FALSE.
- `nlminb.xscale` default to FALSE.
- `nlminb.step.min` Minimum step size, defaults to 2.2e-14.
- `nlminb.scale` defaults to 1.
- `sqp.mit` maximum number of iterations, defaults to 200.
- `sqp.mfv` maximum number of function evaluations, defaults to 500.
- `sqp.met` specifies scaling strategy:
  - `sqp.met=1` - no scaling
  - `sqp.met=2` - preliminary scaling in 1st iteration (default)
  - `sqp.met=3` - controlled scaling
  - `sqp.met=4` - interval scaling
  - `sqp.met=5` - permanent scaling in all iterations
- `sqp.mec` correction for negative curvature:
  - `sqp.mec=1` - no correction
  - `sqp.mec=2` - Powell correction (default)
- `sqp.mer` restarts after unsuccessful variable metric updates:
  - `sqp.mer=0` - no restarts
  - `sqp.mer=1` - standard restart
- `sqp.mes` interpolation method selection in a line search:
  - `sqp.mes=1` - bisection
  - `sqp.mes=2` - two point quadratic interpolation
  - `sqp.mes=3` - three point quadratic interpolation
  - `sqp.mes=4` - three point cubic interpolation (default)
- `sqp.xmax` maximum stepsize, defaults to 1.0e+3.
- `sqp.tolx` tolerance for the change of the coordinate vector, defaults to 1.0e-16.
- `sqp.tolc` tolerance for the constraint violation, defaults to 1.0e-6.
- `sqp.tolg` tolerance for the Lagrangian function gradient, defaults to 1.0e-6.
- `sqp.told` defaults to 1.0e-6.
- `sqp.tols` defaults to 1.0e-4.
- `sqp.rpf` value of the penalty coefficient, default to 1.0D-4. The default value may be relatively small. Therefore, larger value, say one, can sometimes be more suitable.
- `lbfgsb.REPORT` The frequency of reports for the "BFGS" and "L-BFGS-B" methods if control\$trace is positive. Defaults to every 10 iterations.
- `lbfgsb.lm` is an integer giving the number of BFGS updates retained in the "L-BFGS-B" method. It defaults to 5.
- `lbfgsb.factr` controls the convergence of the "L-BFGS-B" method. Convergence occurs when the reduction in the objective is within this factor of the machine tolerance. Default is 1e7, that is a tolerance of about 1.0e-8.
Value

returns a list.

Author(s)

Diethelm Wuertz for the Rmetrics R-port,
R Core Team for the ’optim‘ R-port,
Douglas Bates and Deepayan Sarkar for the ’nlmib‘ R-port,
Bell-Labs for the underlying PORT Library,
Ladislav Luksan for the underlying Fortran SQP Routine,
Zhu, Byrd, Lu-Chen and Nocedal for the underlying L-BFGS-B Routine.

Examples

##
Description

Simulates a univariate GARCH/APARCH time series model.

Usage

garchSim(spec = garchSpec(), n = 100, n.start = 100, extended = FALSE)

Arguments

extended logical parameter if the output series should be a 3 columns timeSeries object with garch, sigma and eps data (extended = TRUE) or a univariate GARCH/APARCH time series (extended = FALSE)

spec a specification object of class "fGARCHSPEC" as returned by the function garchSpec. The model parameters are taken from the @model slot, a list with the following entries:

omega - the constant coefficient of the variance equation, by default 1e-6;
alpha - the value or vector of autoregressive coefficients, by default 0.1, specifying a model of order 1;
beta - the value or vector of variance coefficients, by default 0.8, specifying a model of order 1;
The optional values for the linear part are:
mu - the intercept value, by default 0 (it implies that the mean = mu/(1-sum(ar)));
ar - the autoregressive ARMA coefficients, by default 0;
ma - the moving average ARMA coefficients, by default 0.
The optional parameters for the conditional distributions are:
skew - the skewness parameter (also named xi), by default 0.9, effective only for the "dsnorm", the "dsged", and the "dsstd" skewed conditional distributions;
shape = the shape parameter (also named nu), by default 2 for the "dged" and "dsged", and by default 4 for the "dsstd" and "dsstd" conditional distributions.
See also below for further details.

n length of output series, an integer value. An integer value, by default n=100.
n.start length of "burn-in" period, by default 100.

Details

The function garchSim simulates an univariate GARCH or APARCH time series process as specified by the argument model.
The model is an object of class "fGARCHSPEC" as returned by the function garchSpec. The returned model specification comes with a slot @model which is a list of just the numeric parameter entries. These are recognized and extracted for use by the function garchSim.

By default the series will be returned as an object of class "ts" or as a "numeric" vector. Having time/date positions, e.g. from an empirical process the numeric vector can be easily transformed.
into other time series objects like "timeSeries" or "zoo". So one can estimate the parameters of a GARCH process from empirical data using the function garchFit and simulate than statistically equivalent GARCH processes with the same set of model parameters using the function garchSim.

The third entry in the argument returnType="mts" allows to return a trivariate time series, where the first column contains the simulated "garch" process, the second column the conditional standard deviations "h", and the last column the innovations named "eps".

Note, the default model specifies Bollerslev’s GARCH(1,1) model with normal distributed innovations.

**Value**

The function garchSim returns an objects of class "timeSeries" attributed by a list with entry $garchSpec giving the GARCH specification structure as returned by the function garchSpec and with information on conditional standard deviations and innovations. See details above.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**Examples**

```r
## garchSpec -
  spec = garchSpec()
  spec

## garchSim -
  # Simulate a "timeSeries" object:
  x = garchSim(spec, n = 50)
  class(x)
  print(x)

## More simulations ...

  # Default GARCH(1,1) - uses default parameter settings
  spec = garchSpec(model = list())
  garchSim(spec, n = 10)

  # ARCH(2) - use default omega and specify alpha, set beta=0!
  spec = garchSpec(model = list(alpha = c(0.2, 0.4), beta = 0))
  garchSim(spec, n = 10)

  # AR(1)-ARCH(2) - use default mu, omega
  spec = garchSpec(model = list(ar = 0.5, alpha = c(0.3, 0.4), beta = 0))
  garchSim(spec, n = 10)

  # AR([1,5])-GARCH(1,1) - use default garch values and subset ar[.]
  spec = garchSpec(model = list(mu = 0.001, ar = c(0.5,0,0,0,0.1)))
  garchSim(spec, n = 10)

  # ARMA(1,2)-GARCH(1,1) - use default garch values
  spec = garchSpec(model = list(ar = 0.5, ma = c(0.3, -0.3)))
```
garchSim(spec, n = 10)

# GARCH(1,1) - use default omega and specify alpha/beta
spec = garchSpec(model = list(alpha = 0.2, beta = 0.7))
garchSim(spec, n = 10)

# GARCH(1,1) - specify omega/alpha/beta
spec = garchSpec(model = list(omega = 1e-6, alpha = 0.1, beta = 0.8))
garchSim(spec, n = 10)

# GARCH(1,2) - use default omega and specify alpha[1]/beta[2]
spec = garchSpec(model = list(omega = 1e-6, alpha = 0.1, beta = c(0.4, 0.4)))
garchSim(spec, n = 10)

# GARCH(2,1) - use default omega and specify alpha[2]/beta[1]
spec = garchSpec(model = list(omega = c(0.12, 0.04), alpha = 0.8))
garchSim(spec, n = 10)

# snorm-ARCH(1) - use defaults with skew Normal
spec = garchSpec(model = list(beta = 0, skew = 0.8), cond.dist = "snorm")
garchSim(spec, n = 10)

# sged-GARCH(1,1) - using defaults with skew GED
model = garchSpec(model = list(skew = 0.93, shape = 3), cond.dist = "sged")
garchSim(model, n = 10)

# Taylor Schwert GARCH(1,1) - this belongs to the family of APARCH Models
spec = garchSpec(model = list(delta = 1))
garchSim(spec, n = 10)

# AR(1)-t-APARCH(2, 1) - a little bit more complex specification ...
spec = garchSpec(model = list(mu = 1.0e-4, ar = 0.5, omega = 1.0e-6, alpha = c(0.10, 0.05), gamma = c(0, 0), beta = 0.8, delta = 1.8, shape = 4, skew = 0.85), cond.dist = "ssstd")
garchSim(spec, n = 10)

---

**garchSpec**

**Univariate GARCH Time Series Specification**

**Description**

Specifies an univariate GARCH time series model.

**Usage**

```r
garchSpec(model = list(), presample = NULL, 
    cond.dist = c("norm", "ged", "std", "snorm", "sged", "ssstd"), 
rseed = NULL)
```
Arguments

cond.dist a character string naming the desired conditional distribution. Valid values are "norm", "ged", "std", "snorm", "sged", "sstd". The default value is the normal distribution.

model a list of GARCH model parameters:
  omega - the constant coefficient of the variance equation, by default 1e-6;
  alpha - the value or vector of autoregressive coefficients, by default 0.1, specifying a model of order 1;
  beta - the value or vector of variance coefficients, by default 0.8, specifying a model of order 1;
  The values for the linear part are:
  mu - the mean value, by default NULL;
  ar - the autoregressive ARMA coefficients, by default NULL;
  ma - the moving average ARMA coefficients, by default NULL.
  The parameters for the conditional distributions are:
  skew - the skewness parameter (also named "xi"), by default 0.9, effective only for the "dsnorm", the "dsged", and the "dsstd" skewed conditional distributions;
  shape - the shape parameter (also named "nu"), by default 2 for the "dged" and "dsged", and by default 4 for the "dstd" and "dsstd" conditional distributions.

Note, the default model=list() specifies Bollerslev's GARCH(1,1) model with normal conditional distributed innovations.

presample a numeric three column matrix with start values for the series, for the innovations, and for the conditional variances. For an ARMA(m,n)-GARCH(p,q) process the number of rows must be at least max(m,n,p,q)+1, longer presamples are cutted. Note, all presamples are initialized by a normal-GARCH(p,q) process.

rseed single integer argument, the seed for the initialization of the random number generator for the innovations. Using the default value rseed=NULL then the random number generation will be started with set.seed(0).

Details

The function garchSpec specifies a GARCH or APARCH time series process which we can use for simulating artificial GARCH and/or APARCH models. This is very useful for testing the GARCH parameter estimation results, since your model parameters are known and well specified.

For example specifying a subset AR(5[1,5])-GARCH(2,1) model with a standardized Student-t distribution with four degrees of freedom will return the following printed output:

```
garchSpec(model = list(ar = c(0.5,0,0,0,0.1), alpha =
  c(0.1, 0.1), beta = 0.75, shape = 4), cond.dist = "std")

Formula:
~ ar(5) + garch(2, 1)
Model:
  ar:  0.5  0  0  0  0.1
```
omega: 1e-06
alpha: 0.1 0.1
beta: 0.75
Distribution:
std
Distributional Parameter:
nu = 4
Presample:
   time    z     h     y
0  0    -0.3262334 2e-05 0
-1  1    1.3297993 2e-05 0
-2  2    1.2724293 2e-05 0
-3  3    0.4146414 2e-05 0
-4  4    -1.5399500 2e-05 0

The "Formula" describes the formula expression specifying the generating process, "Model" lists the associated model parameters, "Distribution" the type of the conditional distribution function in use, "Distributional Parmeters" lists the distributional parameter (if any), and the "Presample' shows the presample input matrix.

If we have specified presample=NULL in the argument list, then the presample is generated automatically by default as norm-AR()-GARCH() process.

Value

The returned value is an object of class "fGARCHSPEC".

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

Examples

```r
## garchSpec -

# Normal Conditional Distribution:
spec = garchSpec()
spec

# Skewed Normal Conditional Distribution:
spec = garchSpec(model = list(skew = 0.8), cond.dist = "snorm")
spec

# Skewed GED Conditional Distribution:
spec = garchSpec(model = list(skew = 0.9, shape = 4.8), cond.dist = "sged")
spec

## More specifications ...

# Default GARCH(1,1) - uses default parameter settings
```
ged

Generalized Error Distribution

Description

Functions to compute density, distribution function, quantile function and to generate random variates for the generalized error distribution.

garchSpec(model = list())

# ARCH(2) - use default omega and specify alpha, set beta=0!
garchSpec(model = list(alpha = c(0.2, 0.4), beta = 0))

# AR(1)-ARCH(2) - use default mu, omega
garchSpec(model = list(ar = 0.5, alpha = c(0.3, 0.4), beta = 0))

# AR(1,5)-GARCH(1,1) - use default garch values and subset ar[.]
garchSpec(model = list(mu = 0.001, ar = c(0.5,0,0,0,1)))

# ARMA(1,2)-GARCH(1,1) - use default garch values
garchSpec(model = list(ar = 0.5, ma = c(0.3, -0.3)))

# GARCH(1,1) - use default omega and specify alpha/beta
garchSpec(model = list(omega = 1e-6, alpha = 0.1, beta = 0.8))

# GARCH(1,2) - use default omega and specify alpha[1]/beta[2]
garchSpec(model = list(omega = 0.1, beta = c(0.4, 0.4)))

# GARCH(2,1) - use default omega and specify alpha[2]/beta[1]
garchSpec(model = list(omega = c(0.12, 0.04), beta = 0.08))

# snorm-ARCH(1) - use defaults with skew Normal
garchSpec(model = list(beta = 0, skew = 0.8), cond.dist = "snorm")

# sged-GARCH(1,1) - using defaults with skew GED
garchSpec(model = list(skew = 0.93, shape = 3), cond.dist = "sged")

# Taylor Schwert GARCH(1,1) - this belongs to the family of APARCH Models
garchSpec(model = list(delta = 1))

# AR(1)-t-APARCH(2, 1) - a little bit more complex specification ...
garchSpec(model = list(mu = 1e-4, ar = 0.5, omega = 1.0e-6, alpha = c(0.10, 0.05), gamma = c(0, 0), beta = 0.8, delta = 1.8, shape = 4, skew = 0.85), cond.dist = "sstd")
Usage

dged(x, mean = 0, sd = 1, nu = 2, log = FALSE)
pged(q, mean = 0, sd = 1, nu = 2)
qged(p, mean = 0, sd = 1, nu = 2)
rged(n, mean = 0, sd = 1, nu = 2)

Arguments

mean, sd, nu  location parameter mean, scale parameter sd, shape parameter nu.
n  the number of observations.
p  a numeric vector of probabilities.
x, q  a numeric vector of quantiles.
log  a logical; if TRUE, densities are given as log densities.

Value

d* returns the density, p* returns the distribution function, q* returns the quantile function, and r* generates random deviates,
all values are numeric vectors.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References

Fernandez C., Steel M.F.J. (2000); On Bayesian Modelling of Fat Tails and Skewness, Preprint, 31 pages.

Examples

## sged -
par(mfrow = c(2, 2))
set.seed(1953)
r = rsged(n = 1000)
plot(r, type = "l", main = "sged", col = "steelblue")

# Plot empirical density and compare with true density:
hist(r, n = 25, probability = TRUE, border = "white", col = "steelblue")
box()
x = seq(min(r), max(r), length = 201)
lines(x, dsged(x), lwd = 2)

# Plot df and compare with true df:
plot(sort(r), (1:1000)/1000, main = "Probability", col = "steelblue",
     ylab = "Probability")
lines(x, psged(x), lwd = 2)
# Compute quantiles:
round(qsged(psged(q = seq(-1, 5, by = 1))), digits = 6)

---

**gedFit**

*Generalized Error Distribution Parameter Estimation*

**Description**

Function to fit the parameters of the generalized error distribution.

**Usage**

```r
gedFit(x, ...)
```

**Arguments**

- `x`: a numeric vector of quantiles.
- `...`: parameters parsed to the optimization function `nlm`.

**Value**

`gedFit` returns a list with the following components:

- `par`: The best set of parameters found.
- `objective`: The value of objective corresponding to `par`.
- `convergence`: An integer code. 0 indicates successful convergence.
- `message`: A character string giving any additional information returned by the optimizer, or NULL. For details, see PORT documentation.
- `iterations`: Number of iterations performed.
- `evaluations`: Number of objective function and gradient function evaluations.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**References**


Examples

```r
gedSlider -
set.seed(1953)
r = rged(n = 1000)
gedSlider()
```

```r
gedFit -
gedFit(r)
```

**gedSlider**  
*Geeralized Error Distribution Slider*

**Description**
Displays interactively the dependence of the GED distribution on its parameters.

**Usage**
```r
gedSlider(type = c("dist", "rand"))
```

**Arguments**
- `type`: a character string denoting which interactive plot should be displayed. Either a distribution plot `type="dist"`, the default value, or a random variates plot, `type="rand"`.

**Value**
a Tcl object.

**Author(s)**
Diethelm Wuertz for the Rmetrics R-port.

**References**

**Examples**
```r
## Not run:
## gedSlider -
require(tcltk)
gedSlider("dist")
gedSlider("rand")
```

## End(Not run)
Description

Plot methods for GARCH Modelling.

Usage

```r
## S4 method for signature 'fGARCH,missing'
plot(x, which = "ask", ...)
```

Arguments

- `x`: an object of class "fGARCH"
- `which`: a character string denoting which plot should be displayed.
- `...`: optional arguments to be passed.

Details

The generic function `plot` allows to display 13 graphs. These are the

- Time Series Plot
- Conditional Standard Deviation Plot
- Series Plot with 2 Conditional SD Superimposed
- Autocorrelation function Plot of Observations
- Autocorrelation function Plot of Squared Observations
- Cross Correlation Plot
- Residuals Plot
- Conditional Standard Deviations Plot
- Standardized Residuals Plot
- ACF Plot of Standardized Residuals
- ACF Plot of Squared Standardized Residuals
- Cross Correlation Plot between $\text{sr}^2$ and $r$
- Quantile-Quantile Plot of Standardized Residuals

Methods

- `x = "ANY", y = "ANY"` Generic function.
- `x = "fGARCH", y = "missing"` Plot function for objects of class "fGARCH".

Author(s)

Diethelm Wuertz for the Rmetrics R-port.
Examples

```r
## garchSim -
# Default Garch(1,1) Model:
x = garchSim(n = 200)
head(x)

## garchFit -
fit = garchFit(formula = ~ garch(1, 1), data = x, trace = FALSE)

## Batch Plot:
plot(fit, which = 3)

## Not run:
## Plot:
# # Interactive Plot:
plot(fit)
## End(Not run)
```

**predict-methods**  

*GARCH Prediction Function*

**Description**

Predicts a time series from a fitted GARCH object.

**Usage**

```r
## S4 method for signature 'fGARCH'
predict(object, n.ahead = 10, trace = FALSE, mse = c("cond","uncond"),plot=FALSE,nx=NULL,crit_val=NULL)
```

**Arguments**

- `n.ahead` an integer value, denoting the number of steps to be forecasted, by default 10.
- `object` an object of class fGARCH as returned by the function garchFit.
- `trace` a logical flag. Should the prediction process be traced? By default trace=FALSE.
- `mse` If set to "cond", meanError is defined as the conditional mean errors \( \sqrt{E_t[x_{t+h} - E_t(x_{t+h})]^2} \).
  If set to "uncond", it is defined as \( \sqrt{E[x_{t+h} - E_t(x_{t+h})]^2} \).
- `plot` If set to TRUE, the confidence intervals are computed and plotted
- `nx` The number of observations to be plotted along with the predictions. The default is round(n*0.25), where n is the sample size.
- `crit_val` The critical values for the confidence intervals when plot is set to TRUE. The intervals are defined as \( \hat{x}_{t+h} + \text{crit}_val[2] \times \text{meanError} \) and \( \hat{x}_{t+h} + \text{crit}_val[1] \times \text{meanError} \) if two critical values are provided and \( \hat{x}_{t+h} \pm \text{crit}_val \times \text{meanError} \) if only one is given. If you do not provide critical values, they will be computed automatically.
The confidence level for the confidence intervals if crit_val is not provided. By default it is set to 0.95. The critical values are then computed using the conditional distribution that was chosen to create the object with garchFit using the same shape and skew parameters. If the conditional distribution was set to "QMLE", the critical values are computed using the empirical distribution of the standardized residuals.

... additional arguments to be passed.

Value

returns a data frame with the following columns: "meanForecast", "meanError", and "standardDeviation". The number of records equals the number of forecasting steps n.ahead.

Methods

object = "ANY" Generic function.
object = "fGARCH" Predict function for objects of class "fGARCH".

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

Examples

```r
## garchFit -
# Parameter Estimation of Default GARCH(1,1) Model:
set.seed(123)
fit = garchFit(~ garch(1, 1), data = garchSim(), trace = FALSE)
fit

## predict -
predict(fit, n.ahead = 10)
predict(fit, n.ahead = 10, mse="uncond")

## predict with plotting: critical values = +- 2

predict(fit, n.ahead = 10, plot=TRUE, crit_val=2)

## predict with plotting: automatic critical values
## for different conditional distributions

set.seed(321)
fit2 = garchFit(~ garch(1, 1), data = garchSim(), trace = FALSE, cond.dist="sged")

## 95% confidence level
predict(fit2,n.ahead=20,plot=TRUE)

set.seed(444)
fit3 = garchFit(~ garch(1, 1), data = garchSim(), trace = FALSE, cond.dist="QMLE")

## 90% confidence level and nx=100
```
predict(fit3,n.ahead=20,plot=TRUE,conf=.9,nx=100)

residuals-methods Extract GARCH Model Residuals

Description

Extracts residuals from a fitted GARCH object.

Usage

## S4 method for signature 'fGARCH'
residuals(object, standardize = FALSE)

Arguments

object an object of class "fGARCH" as returned from the function garchFit.
standardize a logical flag, should the residuals be standardized?

Details

The function extracts the @residuals slot from an object of class "fGARCH" as returned by the function garchFit.

The class of the returned value depends on the input to the function garchFit who created the object. The returned value is always of the same class as the input object to the argument data in the function garchFit, i.e. if you fit a "timeSeries" object, you will get back from the function fitted also a "timeSeries" object, if you fit an object of class "zoo", you will get back again a "zoo" object. The same holds for a "numeric" vector, for a "data.frame", and for objects of class "ts", "mts".

In contrast, the slot itself returns independent of the class of the data input always a numeric vector, i.e. the function call rslot(object, "fitted") will return a numeric vector.

Methods

object = "ANY" Generic function
object = "fGARCH" Extractor function for residual from an object of class "fGARCH".

Note

residuals is a generic function which extracts residual values from objects returned by modeling functions.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.
Examples

```r
## Swiss Pension func Index -
  x = as.timeSeries(data(LPP2005REC))

## garchFit
  fit = garchFit(LPP40 ~ garch(1, 1), data = 100*x, trace = FALSE)
  fit

## residuals -
  res = residuals(fit)
  head(res)
  class(res)

## slot -
  res = slot(fit, "residuals")
  head(res)
```

sged | *Skew Generalized Error Distribution*

Description

Functions to compute density, distribution function, quantile function and to generate random variates for the skew generalized error distribution.

Usage

```r
dsged(x, mean = 0, sd = 1, nu = 2, xi = 1.5, log = FALSE)
psegd(q, mean = 0, sd = 1, nu = 2, xi = 1.5)
qsegd(p, mean = 0, sd = 1, nu = 2, xi = 1.5)
rsegd(n, mean = 0, sd = 1, nu = 2, xi = 1.5)
```

Arguments

- `mean`, `sd`, `nu`, `xi`
  - location parameter `mean`, scale parameter `sd`, shape parameter `nu`, skewness parameter `xi`.
- `n`
  - the number of observations.
- `p`
  - a numeric vector of probabilities.
- `q`
  - a numeric vector of quantiles.
- `log`
  - a logical; if TRUE, densities are given as log densities.

Value

- `d` returns the density, `p` returns the distribution function, `q` returns the quantile function, and `r` generates random deviates,
  - all values are numeric vectors.
Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References


Fernandez C., Steel M.F.J. (2000); On Bayesian Modelling of Fat Tails and Skewness, Preprint, 31 pages.

Examples

```r
## sged
par(mfrow = c(2, 2))
set.seed(1953)
r = rsged(n = 1000)
plot(r, type = "l", main = "sged", col = "steelblue")

# Plot empirical density and compare with true density:
hist(r, n = 25, probability = TRUE, border = "white", col = "steelblue")
box()
x = seq(min(r), max(r), length = 201)
lines(x, dsged(x), lwd = 2)

# Plot df and compare with true df:
plot(sort(r), (1:1000/1000), main = "Probability", col = "steelblue",
ylab = "Probability")
lines(x, psged(x), lwd = 2)

# Compute quantiles:
round(qsged(psged(q = seq(-1, 5, by = 1))), digits = 6)
```

sgedFit

**Skew Generalized Error Distribution Parameter Estimation**

Description

Function to fit the parameters of the skew generalized error distribution.

Usage

`sgedFit(x, ...)`

Arguments

- `x` a numeric vector of quantiles.
- `...` parameters parsed to the optimization function `nlm`. 
Value

sgedFit returns a list with the following components:

par The best set of parameters found.
objective The value of objective corresponding to par.
convergence An integer code. 0 indicates successful convergence.
message A character string giving any additional information returned by the optimizer, or NULL. For details, see PORT documentation.
iterations Number of iterations performed.
evaluations Number of objective function and gradient function evaluations.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References


Fernandez C., Steel M.F.J. (2000); On Bayesian Modelling of Fat Tails and Skewness, Preprint, 31 pages.

Examples

```r
## rsged -
set.seed(1953)
r = rsged(n = 1000)

## sgedFit -
sgedFit(r)
```

---

**sgedSlider**  
*Skew GED Distribution Slider*

Description

Displays interactively the dependence of the skew GED distribution on its parameters.

Usage

```r
sgedSlider(type = c("dist", "rand"))
```
**show-methods**

**Arguments**

*type*  
a character string denoting which interactive plot should be displayed. Either a distribution plot `type="dist"`, the default value, or a random variates plot, `type="rand"`.

**Value**

a Tcl object.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**References**


**Examples**

```r
## Not run:
## sgedSlider -
require(tcltk)
sgedSlider("dist")
sgedSlider("rand")

## End(Not run)
```

**Description**

Show methods for GARCH Modelling.

**Methods**

*object = "ANY"*  
Generic function.

*object = "fGARCH"*  
Print function for objects of class "fGARCH".

*object = "fGARCHSPEC"*  
Print function for objects of class "fGARCH".

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.
Examples

```r
## garchSpec -
spec = garchSpec()
print(spec)

## garchSim -
x = garchSim(spec, n = 500)

## garchFit -
fit = garchFit(~ garch(1, 1), data = x)
print(fit)
```

---

**snorm**  
*Skew Normal Distribution*

---

**Description**

Functions to compute density, distribution function, quantile function and to generate random variates for the skew normal distribution.

**Usage**

```r
dsnorm(x, mean = 0, sd = 1, xi = 1.5, log = FALSE)
psnorm(q, mean = 0, sd = 1, xi = 1.5)
qsnorm(p, mean = 0, sd = 1, xi = 1.5)
rsnorm(n, mean = 0, sd = 1, xi = 1.5)
```

**Arguments**

- `mean`, `sd`, `xi`  
  location parameter `mean`, scale parameter `sd`, skewness parameter `xi`.
- `n`  
  the number of observations.
- `p`  
  a numeric vector of probabilities.
- `x`, `q`  
  a numeric vector of quantiles.
- ...  
  parameters parsed to the optimization function `nlm`.
- `log`  
  a logical; if TRUE, densities are given as log densities.

**Value**

- `d*` returns the density, `p*` returns the distribution function, `q*` returns the quantile function, and `r*` generates random deviates,
  all values are numeric vectors.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.
References
Fernandez C., Steel M.F.J. (2000); On Bayesian Modelling of Fat Tails and Skewness, Preprint. 31 pages.

Examples
```r
## snorm -
# Random Numbers:
par(mfrow = c(2, 2))
set.seed(1953)
r = rsnorm(n = 1000)
plot(r, type = "l", main = "snorm", col = "steelblue")

# Plot empirical density and compare with true density:
hist(r, n = 25, probability = TRUE, border = "white", col = "steelblue")
box()
x = seq(min(r), max(r), length = 201)
lines(x, dsnorm(x), lwd = 2)

# Plot df and compare with true df:
plot(sort(r), (1:1000)/1000, main = "Probability", col = "steelblue",
     ylab = "Probability")
lines(x, psnorm(x), lwd = 2)

# Compute quantiles:
round(qsnorm(psnorm(q = seq(-1, 5, by = 1))), digits = 6)
```

---

**snormFit**  
*Skew Normal Distribution Parameter Estimation*

**Description**
Function to fit the parameters of the skew normal distribution.

**Usage**
```r
snormFit(x, ...)
```

**Arguments**
- **x** a numeric vector of quantiles.
- **...** parameters parsed to the optimization function `nlm`.

**Value**
`snormFit` returns a list with the following components:

- **par** The best set of parameters found.
snormSlider

objective The value of objective corresponding to par.

convergence An integer code. 0 indicates successful convergence.

message A character string giving any additional information returned by the optimizer, or NULL. For details, see PORT documentation.

iterations Number of iterations performed.

evaluations Number of objective function and gradient function evaluations.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References


Examples

```r
## rsnorm -
set.seed(1953)
r = rsnorm(n = 1000)

## snormFit -
snormFit(r)
```

snormSlider Skew Normal Distribution Slider

Description

Displays interactively the dependence of the skew Normal distribution on its parameters.

Usage

```r
snormSlider(type = c("dist", "rand"))
```

Arguments

type a character string denoting which interactive plot should be displayed. Either a distribution plot type="dist", the default value, or a random variates plot, type="rand".

Value

a Tcl object.
**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**References**


**Examples**

```r
## Not run:
## snormSlider -
## require(tcltk)
## snormSlider("dist")
## snormSlider("rand")
##
## End(Not run)
```

---

**sstd**  
*Skew Student-t Distribution and Parameter Estimation*

**Description**

Functions to compute density, distribution function, quantile function and to generate random variates for the skew Student-t distribution.

**Usage**

```r
dssstd(x, mean = 0, sd = 1, nu = 5, xi = 1.5, log = FALSE)
pssstd(q, mean = 0, sd = 1, nu = 5, xi = 1.5)
qssstd(p, mean = 0, sd = 1, nu = 5, xi = 1.5)
rssstd(n, mean = 0, sd = 1, nu = 5, xi = 1.5)
```

**Arguments**

- `mean`, `sd`, `nu`, `xi`  
  location parameter mean, scale parameter sd, shape parameter nu, skewness parameter xi.
- `n`  
  the number of observations.
- `p`  
  a numeric vector of probabilities.
- `x`, `q`  
  a numeric vector of quantiles.
- `log`  
  a logical; if TRUE, densities are given as log densities.

**Value**

- `d*` returns the density, `p*` returns the distribution function, `q*` returns the quantile function, and `r*` generates random deviates,
  all values are numeric vectors.
**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**References**


**Examples**

```r
## sstd -
par(mfrow = c(2, 2))
set.seed(1953)
r = rstd(n = 1000)
plot(r, type = "l", main = "sstd", col = "steelblue")

# Plot empirical density and compare with true density:
hist(r, n = 25, probability = TRUE, border = "white", col = "steelblue")
box()
x = seq(min(r), max(r), length = 201)
lines(x, dsstd(x), lwd = 2)

# Plot df and compare with true df:
plot(sort(r), (1:1000/1000), main = "Probability", col = "steelblue",
    ylab = "Probability")
lines(x, psstd(x), lwd = 2)

# Compute quantiles:
round(qsstd(psstd(q = seq(-1, 5, by = 1))), digits = 6)
```

---

**sstdFit**  
*Skew Student-t Distribution Parameter Estimation*

**Description**

Function to fit the parameters of the Student-t distribution.

**Usage**

```r
sstdFit(x, ...)
```

**Arguments**

- `x` a numeric vector of quantiles.
- `...` parameters parsed to the optimization function `nlm`. 
**Value**

`ssstdFit` returns a list with the following components:

- **par**: The best set of parameters found.
- **objective**: The value of objective corresponding to `par`.
- **convergence**: An integer code. 0 indicates successful convergence.
- **message**: A character string giving any additional information returned by the optimizer, or NULL. For details, see PORT documentation.
- **iterations**: Number of iterations performed.
- **evaluations**: Number of objective function and gradient function evaluations.

**Author(s)**

Diethelm Wuertz for the Rmetrics R-port.

**References**


**Examples**

```r
## sstd -
set.seed(1953)
r = rsstd(n = 1000)

## sstdFit -
ssstdFit(r)
```

---

**ssstdSlider**

*Skew Student-t Distribution Slider*

**Description**

Displays interactively the dependence of the skew Student-t distribution on its parameters.

**Usage**

`ssstdSlider(type = c("dist", "rand"))`

**Arguments**

- **type**: a character string denoting which interactive plot should be displayed. Either a distribution plot type="dist", the default value, or a random variates plot, type="rand".
Value

A Tcl object.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References


Examples

```r
## Not run:
## sstdSlider -
## require(tcltk)
sstdSlider("dist")
sstdSlider("rand")

## End(Not run)
```

---

**std**

*Student-t Distribution*

Description

Functions to compute density, distribution function, quantile function and to generate random variates for the Student-t distribution.

Usage

```r
dstd(x, mean = 0, sd = 1, nu = 5, log = FALSE)
pstd(p, mean = 0, sd = 1, nu = 5)
qstd(q, mean = 0, sd = 1, nu = 5)
rstd(n, mean = 0, sd = 1, nu = 5)
```

Arguments

- `mean`, `sd`, `nu`: location parameter mean, scale parameter sd, shape parameter nu.
- `n`: the number of observations.
- `p`: a numeric vector of probabilities.
- `x, q`: a numeric vector of quantiles.
- `log`: a logical; if TRUE, densities are given as log densities.
Value

d* returns the density, p* returns the distribution function, q* returns the quantile function, and r* generates random deviates,
all values are numeric vectors.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References


Examples

```r
## std -
par(mfrow = c(2, 2))
set.seed(1953)
r = rstd(n = 1000)
plot(r, type = "l", main = "std", col = "steelblue")

# Plot empirical density and compare with true density:
hist(r, n = 25, probability = TRUE, border = "white", col = "steelblue")
box()
x = seq(min(r), max(r), length = 201)
lines(x, dstd(x), lwd = 2)

# Plot df and compare with true df:
plot(sort(r), (1:1000/1000), main = "Probability", col = "steelblue",
     ylab = "Probability")
lines(x, pstd(x), lwd = 2)

# Compute quantiles:
round(qstd(pstd(q = seq(-1, 5, by = 1))), digits = 6)
```

---

**stdFit**

**Student-t Distribution Parameter Estimation**

Description

Function to fit the parameters of the Student-t distribution.

Usage

```
stdFit(x, ...)
```
Arguments

x a numeric vector of quantiles.

... parameters parsed to the optimization function nlm.

Value

stdFit returns a list with the following components:

par The best set of parameters found.
objective The value of objective corresponding to par.
convergence An integer code. 0 indicates successful convergence.
message A character string giving any additional information returned by the optimizer, or NULL. For details, see PORT documentation.
iterations Number of iterations performed.
evaluations Number of objective function and gradient function evaluations.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

References


Examples

```r
## std
set.seed(153)
r = rstd(n = 1000)

## stdFit
stdFit(r)
```

stdSlider Student-t Distribution Slider

Description

Displays interactively the dependence of the Student-t distribution on its parameters.

Usage

```r
stdSlider(type = c("dist", "rand"))
```
Arguments

- **type**: a character string denoting which interactive plot should be displayed. Either a distribution plot type="dist", the default value, or a random variates plot, type="rand".

Value

- a Tcl object.

Author(s)

- Diethelm Wuertz for the Rmetrics R-port.

Examples

```r
## Not run:
## stdslider -
## require(tcltk)
## stdslider("dist")
## stdslider("rand")

## End(Not run)
```

Description

Summary methods for GARCH Modelling.

Methods

- **object = "ANY"**: Generic function
- **object = "fGARCH"**: Summary function for objects of class "fGARCH".

How to read a diagnostic summary report?

The first five sections return the title, the call, the mean and variance formula, the conditional distribution and the type of standard errors:

```r
Title:
GARCH Modelling

Call:
garchFit(~ garch(1, 1), data = garchSim(), trace = FALSE)

Mean and Variance Equation:
```
summary-methods

\[\simarch(0)\]

Conditional Distribution:

\[\text{norm}\]

Std. Errors:

based on Hessian

The next three sections return the estimated coefficients, and an error analysis including standard errors, t values, and probabilities, as well as the log Likelihood values from optimization:

Coefficient(s):

\[
\begin{align*}
\mu & \quad \omega & \quad \alpha & \quad \beta \\
-5.79788e-05 & \quad 7.93017e-06 & \quad 1.59456e-01 & \quad 2.30772e-01 \\
\end{align*}
\]

Error Analysis:

| Estimate  | Std. Error | t value | Pr(>|t|) |
|-----------|------------|---------|----------|
| \(\mu\)  | -5.798e-05 | 2.582e-04 | -0.225  | 0.822  |
| \(\omega\) | 7.930e-06  | 5.309e-06 | 1.494  | 0.135  |
| \(\alpha\) | 1.595e-01  | 1.026e-01 | 1.554  | 0.120  |
| \(\beta\) | 2.308e-01  | 4.203e-01 | 0.549  | 0.583  |

Log Likelihood:

\[ -843.3991 \quad \text{normalized:} \quad -\text{Inf}\]

The next section provides results on standardized residuals tests, including statistic and p values, and on information criterion statistic including AIC, BIC, SIC, and HQIC:

Standardized Residuals Tests:

<table>
<thead>
<tr>
<th>Statistic</th>
<th>p-Value</th>
</tr>
</thead>
<tbody>
<tr>
<td>Jarque-Bera Test</td>
<td>R Chi^2 0.4172129 0.8117146</td>
</tr>
<tr>
<td>Shapiro-Wilk Test</td>
<td>R W 0.9957817 0.8566985</td>
</tr>
<tr>
<td>Ljung-Box Test</td>
<td>R Q(10) 13.05581 0.2205680</td>
</tr>
<tr>
<td>Ljung-Box Test</td>
<td>R Q(15) 14.40879 0.4947788</td>
</tr>
<tr>
<td>Ljung-Box Test</td>
<td>R Q(20) 38.15456 0.008478302</td>
</tr>
<tr>
<td>Ljung-Box Test</td>
<td>R^2 Q(10) 7.619134 0.6659837</td>
</tr>
<tr>
<td>Ljung-Box Test</td>
<td>R^2 Q(15) 13.89721 0.5333388</td>
</tr>
<tr>
<td>Ljung-Box Test</td>
<td>R^2 Q(20) 15.61716 0.7400728</td>
</tr>
<tr>
<td>LM Arch Test</td>
<td>R TR^2 7.049963 0.8542942</td>
</tr>
</tbody>
</table>

Information Criterion Statistics:

<table>
<thead>
<tr>
<th>AIC</th>
<th>BIC</th>
<th>SIC</th>
<th>HQIC</th>
</tr>
</thead>
<tbody>
<tr>
<td>8.473991</td>
<td>8.539957</td>
<td>8.473212</td>
<td>8.500687</td>
</tr>
</tbody>
</table>

Author(s)

Diethelm Wuertz for the Rmetrics R-port.
Examples

```r
## garchSim -
  x = garchSim(n = 200)

## garchFit -
  fit = garchFit(formula = x ~ garch(1, 1), data = x, trace = FALSE)
  summary(fit)
```

Description

Data sets used in the examples of the timeSeries packages.

volatility-methods

**Extract GARCH Model Volatility**

Description

Extracts volatility from a fitted GARCH object.

Usage

```r
## S3 method for class 'fGARCH'
volatility(object, type = c("sigma", "h"), ...)
```

Arguments

- `object`: an object of class `fGARCH` as returned from the function `garchFit()`.
- `type`: a character string denoting if the conditional standard deviations "sigma" or the variances "h" should be returned.
- `...`: additional arguments to be passed.

Details

The function extracts the `@volatility` from the slots `@sigma.t` or `@h.t` of an object of class "fGARCH" as returned by the function `garchFit`.

The class of the returned value depends on the input to the function `garchFit` who created the object. The returned value is always of the same class as the input object to the argument `data` in the function `garchFit`, i.e. if you fit a "timeSeries" object, you will get back from the function fitted also a "timeSeries" object, if you fit an object of class "zoo", you will get back again a "zoo" object. The same holds for a "numeric" vector, for a "data.frame", and for objects of class "ts", "mts".

In contrast, the slot itself returns independent of the class of the data input always a numeric vector, i.e. the function call `rslot(object, "fitted")` will return a numeric vector.
Methods

object = "ANY"  Generic function.
object = "fGARCH"  Extractor function for volatility or standard deviation from an object of class "fGARCH".

Note

volatility is a generic function which extracts volatility values from objects returned by modeling functions.

Author(s)

Diethelm Wuertz for the Rmetrics R-port.

Examples

```r
## Swiss Pension func Index -
x = as.timeSeries(data(LPP2005REC))

## garchFit
fit = garchFit(LPP40 ~ garch(1, 1), data = 100*x, trace = FALSE)
fit

## volatility -
# Standard Deviation:
volatility = volatility(fit, type = "sigma")
head(volatility)
class(volatility)
# Variance:
volatility = volatility(fit, type = "h")
head(volatility)
class(volatility)

## slot -
volatility = slot(fit, "sigma.t")
head(volatility)
class(volatility)
volatility = slot(fit, "h.t")
head(volatility)
class(volatility)
```
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