Package 'HGLD'

October 25, 2018

Type Package

Title Fit the Hurdle Generalized Lambda Distribution

Version 0.1.0
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<pre>URL http://github.com/dmarcondes/HGLD</pre>
<pre>BugReports https://github.com/dmarcondes/HGLD/issues</pre>
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Description Functions to perform the Hurdle Generalized Lambda Distribution Regression and to fit the Hurdle Generalized Lambda Distribution to data. The functions of this package are modifications of the functions of packages gamlss, GLDEX and GLDReg, so that most of the credit for the functions of this package must go to the authors and maintainers of these three packages.
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Imports ggplot2 (>= 2.2.1), gridExtra (>= 2.1.1), grid (>= 3.3), gamlss.dist (>= 5.0-2), cluster (>= 2.0.6)
Depends R (>= 3.3), gamlss (>= 5.0-2), GLDEX (>= 2.0.0.5), GLDreg (>= 1.0.7)
Encoding UTF-8
LazyData true
RoxygenNote 6.0.1
Reference Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) arxiv1712.02183
R topics documented:
dhgld 2 diag.hgld 3 fit.hgld 4 healthcare 6

2 dhgld

	phgld plot.fit.hgld																		
	plot.reg.hgld																	 	 9
	qhgld																	 	 10
	qhgld.reg .																	 	 12
	reg.hgld																	 	 13
	rhgld																	 	 15
Index																			16

dhgld

The Hurdle Generalized Lambda Distribution Family

Description

Density of the Hurdle Generalized Lambda Distribution.

Usage

```
dhgld(x, mixture = FALSE, lambda1, lambda2 = NULL, prob = NULL,
  param = "fmkl", inverse.eps = 1e-08, max.iterations = 500)
```

Arguments

X	Vector of data.				
mixture	Whether to give the density of a mixture of HGLDs.				
lambda1	A vector of length 5 with the five parameters of the HGLD, or of the first HGLD if mixture = TRUE.				
lambda2	A vector of length 4 with the four parameters of the second HGLD if mixture = $TRUE$.				
prob	The cluster parameter (probability) for the mixture of HGLDs.				
param	"fmkl" or "rs".				
inverse.eps	Accuracy of calculation for the numerical determination of $F(x)$, defaults to 1e-8.				
max.iterations					
	Maximum number of iterations in the numerical determination of $F(x)$, defaults to 500.				

Details

If the parametrization of the RS or FMKL HGLD is not acceptable, the function returns NA. This function is based on the \overline{GLDEX} package.

Value

The probability density of the continuous part of the HGLD.

diag.hgld 3

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S.; Fitting Single and Mixture of Generalized Lambda Distributions to Data via Discretized and Maximum Likelihood Methods: GLDEX in R. (2007), Journal of Statistical Software: *21* 9.

Examples

diag.hgld

Diagnostic for the Hurdle Generalized Lambda Distribution

Description

Diagnostic plots and measures of goodness-of-fit for a Hurdle Generalized Lambda Distribution.

Usage

```
diag.hgld(fit, facet = FALSE, facet.breaks, facet.labels, facet.ncol,
  trace = TRUE, no.test = 1000, len = floor(0,9 * length(fit$data[fit$data
!= 0])), alpha = 0,05, plotKS = TRUE, KS = TRUE)
```

Whether the resample KS test must be performed to the non-zero values.

Arguments

KS

fit. An object of class fit.hgld. Whether the plots must be faceted for better visualization. facet facet . breaks The breaks in which to facet the data. Must be the endpoints of the intervals. facet.labels The labels of the categories given by the facet breaks. facet.ncol The number of columns for the facet plot. Whether a progress bar must be printed in order to trace the algorithm. trace no.test Total number of KS tests required. Number of data to sample at each KS test. len Significance level of KS test. alpha plotKS Whether to plot the KS resample test result within each plot.

4 fit.hgld

Details

The diagnostics techniques are applied to the non-zero data values. Returns the qq-plot and the quantile plot between the data and the theoretical fitted HGLD. Also returns a table comparing sample moments with theoretical moments. A Kolmogorov-Simornov resample test is performed and the percentage of the times that the null hypotheses, i.e., goodness-of-fit, is not rejected is displayed. All diagnostics are performed for both the RS and FMKL HGLD.

Value

qqRSggplot qq-plot for the RS HGLD.qqFMKLggplot qq-plot for the FMKL HGLD.quantRSggplot quantile plot for the RS HGLD.quantFMKLggplot quantile plot for the FMKL HGLD.momentsMoments comparison for the GLD fitted to the non-zero data for both parametrizations. These are not the moments of the HGLD, but are instead the moments of the GLD fitted to the non-zero data values.KSPercentage of no rejection for the KS resample test.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S. Fitting Single and Mixture of Generalized Lambda Distributions to Data via Discretized and Maximum Likelihood Methods: GLDEX in R. (2007), Journal of Statistical Software: *21* 9.

Examples

```
set.seed(100)
data <- healthcare[sample(1:nrow(healthcare),50),]
fit <- fit.hgld(data$log_expense)
d <- diag.hgld(fit,facet = FALSE,plotKS = FALSE)

#mixture
set.seed(100)
data <- c(rcauchy(20,location = 10),rep(0,10),rcauchy(20))
fit <- fit.hgld(data = data,mixture = TRUE)
d <- suppressWarnings(diag.hgld(fit))</pre>
```

fit.hgld

Fit the Hurdle Generalized Lambda Distribution

Description

Fit the Hurdle Generalized Lambda Distribution to a dataset by the Numerical Maximum Likelihood Method.

fit.hgld 5

Usage

```
fit.hgld(data, mixture = FALSE, clustering.m = clara, threshold = NULL,
  leap1 = 3, leap2 = 3, fun1 = "runif.sobol", fun2 = "runif.sobol",
  rs.leap = 3, fmkl.leap = 3, rs.init = c(-1,5, 1,5),
  fmkl.init = c(-0,25, 1,5), FUN = "runif.sobol", no = 10000)
```

Arguments

data	A vector of data.
mixture	Whether a mixture of HGLD must be fitted.
clustering.m	Clustering method used in classifying the dataset into two parts when fitting a mixture of HGLD. Valid arguments include clara, fanny and pam from the cluster library, or threshold, if the data must be divided by a threshold. Default is clara. Or a logical vector specifying how data should be split. See fun.auto.bimodal.pml for more details.
threshold	The threshold to divide the data if $clustering.m = "threshold"$.
leap1	Scrambling (0,1,2,3) for the sobol sequence for the first distribution fit when fitting a mixture of HGLD. See scrambling/leap argument for runif.sobol, runif.halton or QUnif of the GLDEX package.
leap2	Scrambling (0,1,2,3) for the sobol sequence for the second distribution fit when fitting a mixture of HGLD. See scrambling/leap argument for runif.sobol, runif.halton or QUnif of the GLDEX package.
fun1	A character string of either "runif.sobol" (default), "runif.halton" or "QUnif" for the first distribution fit when fitting a mixture of HGLD. See fun.auto.bimodal.pml for more details.
fun2	A character string of either "runif.sobol" (default), "runif.halton" or "QUnif" for the second distribution fit when fitting a mixture of HGLD. See fun.auto.bimodal.pml for more details.
rs.leap	Scrambling (0,1,2,3) for the sobol sequence for the RS generalized lambda distribution fit. See scrambling/leap argument for runif.sobol, runif.halton or QUnif of the GLDEX package. See fun.data.fit.ml for more details.
fmkl.leap	Scrambling (0,1,2,3) for the sobol sequence for the FMKL generalized lambda distribution fit. See scrambling/leap argument for runif.sobol, runif.halton or QUnif of the GLDEX package. See fun.data.fit.ml for more details.
rs.init	Initial values (lambda3 and lambda4) for the RS generalized lambda distribution. See fun.data.fit.ml for more details.
fmkl.init	Initial values (lambda3 and lambda4) for the FMKL generalized lambda distribution. See fun.data.fit.ml for more details.
FUN	A character string of either "runif.sobol" (default), "runif.halton" or "QUnif". See fun.data.fit.ml for more details.
no	Number of initial random values to find the best initial values for optimization. See fun.data.fit.ml for more details.

Details

Given a dataset, estimate by the Numerical Maximum Likelihood Method the five parameters of the HGLD. Fit both the RS and the FMKL parametrizations. Also fit a mixture of HGLDs.

6 healthcare

Value

par The estimate of the HGLD five parameters for both the RS and FMKL parametriza-

tions if *mixture* = *FALSE*. Otherwise present the estimation of ten parameters: the zero probability mass, the four parameters of each GLD and the clustering

parameter p.

data The data used in the fit.

mixture Whether a mixture of HGLD was fitted.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S.; Fitting Single and Mixture of Generalized Lambda Distributions to Data via Discretized and Maximum Likelihood Methods: GLDEX in R.(2007), Journal of Statistical Software: *21* 9.

Examples

```
set.seed(100)
data <- healthcare[sample(1:nrow(healthcare),30),]
fit <- fit.hgld(data$log_expense)

#mixture
set.seed(100)
data <- c(rcauchy(20,location = 10),rep(0,10),rcauchy(20))
fit2 <- fit.hgld(data = data,mixture = TRUE)</pre>
```

healthcare

Healthcare dataset

Description

Dataset containing the healthcare expense of 129,257 customers of a Brazilian healthcare company between 2006 and 2009.

Usage

healthcare

Format

An object of class tbl_df (inherits from tbl, data.frame) with 289456 rows and 8 columns.

Details

The expenses are in Reais (Brazilian currency) and were deflated to the January 2006 value. In order to fit the models of the paper in the references it is necessary to truncate the expanses at R\$ 100.

7 phgld

Value

ID	The ID of the customer.					
sex	The sex of the customer.					
age	The age of the customer on the considered year.					
expense	The healthcare expense of the customer on the considered year.					
log_expense	The logarithm of the healthcare expense of the customer on the considered year.					
year	The considered year.					
previous_expense						
	The healthcare expense of the customer on the previous year.					

log_previous_expense

The logarithm of the healthcare expense of the customer on the previous year.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) arxiv1712.02183

phgld The Hurdle Generalized Lambda Distribution Family

Description

Acumulated probability function of the Hurdle Generalized Lambda Distribution.

Usage

```
phgld(q, mixture = FALSE, lambda1, lambda2 = NULL, prob = NULL,
 param = "fmkl", inverse.eps = 1e-08, max.iterations = 500)
```

Arguments

q	Vector of quantiles.				
mixture	Whether to give the acumulated probability function of a mixture of HGLDs.				
lambda1	A vector of length 5 with the five parameters of the HGLD, or of the first HGLD if mixture = TRUE.				
lambda2	A vector of length 4 with the four parameters of the second HGLD if mixture = TRUE.				
prob	The cluster parameter for the mixture of HGLDs.				
param	"fmkl" or "rs".				
inverse.eps	Accuracy of calculation for the numerical determination of $F(x)$, defaults to 1e-8.				
max.iterations					
	Maximum number of iterations in the numerical determination of $F(x)$, defaults to 500.				

8 plot.fit.hgld

Details

If the parametrization of the RS or FMKL GLD is not acceptable, the function returns NA. This function is based on the GLDEX package.

Value

The acumulated probability function of the HGLD.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S.; Fitting Single and Mixture of Generalized Lambda Distributions to Data via Discretized and Maximum Likelihood Methods: GLDEX in R. (2007), Journal of Statistical Software: *21* 9.

Examples

plot.fit.hgld

Plot the Hurdle Generalized Lambda Distribution

Description

Density plot of the fit given by an object of class fit.hgld.

Usage

```
## S3 method for class 'fit.hgld'
plot(x, histogram = TRUE, hcolor = "white",
   hfill = "black", bins = 50, dcolor = c("black", "red"),
   dtype = c("solid", "solid"), xlab = "Data", ylab = "Density", ...)
```

Arguments

```
    A fit.hgld object.
    histogram Logical. Whether the estimated density must be superimposed by the data histogram.
    hcolor Color of the histogram.
    hfill Color to fill the histogram.
```

plot.reg.hgld 9

bins	Number of histogram bins.
dcolor	Color of the RS and FMKL density plot.
dtype	Type of the RS and FMKL density line.
xlab	Label of the x-axis.
ylab	Label of the y-axis.
	Arguments to be passed to methods.

Details

The density may be plotted by itself or superimposed by the data histogram. Plot only the non-zero data values.

Value

```
RS ggplot plot of the fitted RS GLD.

FMKL ggplot plot of the fitted FMKL GLD.

RF ggplot plot of the fitted RS and FMKL GLD on the same plot.
```

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Examples

```
set.seed(100)
data <- healthcare[sample(1:nrow(healthcare),50),]
fit <- fit.hgld(data$log_expense)
plot(fit)

#mixture
set.seed(100)
data <- c(rcauchy(20,location = 10),rep(0,10),rcauchy(20))
fit <- fit.hgld(data = data,mixture = TRUE)
plot(fit)</pre>
```

plot.reg.hgld

Predict density plot of a Hurdle Generalized Lambda Regression

Description

Predict density plot of a Hurdle Generalized Lambda Regression.

Usage

```
## S3 method for class 'reg.hgld'
plot(x, newvalues, name = row.names(newvalues),
  color = NULL, xlab = "Data",
  xlim = c(min(x$NZdata[[all.vars(x$loc.formula)[1]]]),
  max(x$NZdata[[all.vars(x$loc.formula)[1]]])), title = "", ...)
```

10 qhgld

Arguments

X	An object of class reg.hgld.
newvalues	A data frame with the new values of the covariates. Column names must match the ones given in formulas <i>loc.formula</i> and <i>zero.formula</i> .
name	A vector with the names of the new values profiles. Default is the row names of the newvalues data frame.
color	The color of each density curve. Must have one color for each row of newvalues.
xlab	Label of the x-axis.
xlim	A vector with the limits of the x-axis.
title	Legend title.
	Arguments to be passed to methods.

Details

Given an object of class reg.hgld and new values for the covariates, returns the density function of the fitted HGLD, given the covariates. The contrast on the *newvalues* data frame must be same of the *data* used in the reg.hgld object. All density curves are plotted in the same plot.

Value

plot ggplot density plot for the given new values

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distributions. (2017) *arxiv1712.02183*

Examples

qhgld

The Hurdle Generalized Lambda Distribution Family

Description

Quantile function of a Hurdle Generalized Lambda Distribution.

Usage

```
qhgld(p, mixture = FALSE, lambda1, lambda2 = NULL, prob = NULL,
  param = "fmkl", trace = FALSE, inverse.eps = 1e-08,
  max.iterations = 500)
```

qhgld 11

Arguments

р	Vector of probabilities.				
mixture	Whether to give the quantile function of a mixture of HGLDs.				
lambda1	A vector of length 5 with the five parameters of the HGLD, or of the first HGLD if mixture = TRUE.				
lambda2	A vector of length 4 with the four parameters of the second HGLD if mixture = TRUE.				
prob	The cluster parameter for the mixture HGLD.				
param	"fmkl" or "rs".				
trace	Whether a progress bar must be printed in order to trace the algorithm.				
inverse.eps	Accuracy of calculation for the numerical determination of $F(x)$, defaults to 1e-8.				
max.iterations					
	Maximum number of iterations in the numerical determination of $F(x)$, defaults to 500.				

Details

The HGLD must be non-negative, otherwise the quantile is only approximate. If the parametrization of the RS or FMKL GLD is not acceptable, the function returns NA. This function is based on the GLDEX package.

Value

The quantile function of a HGLD.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S.; Fitting Single and Mixture of Generalized Lambda Distributions to Data via Discretized and Maximum Likelihood Methods: GLDEX in R. (2007), Journal of Statistical Software: *21* 9.

12 qhgld.reg

qhgld.reg Predict quantiles of a Hurdle Generalized Lambda regression	
---	--

Description

Quantile function of a Hurdle Generalized Lambda Regression.

Usage

```
qhgld.reg(p, reg, newvalues, 10 = TRUE, location = TRUE)
```

Arguments

р	Vector of probabilities.
reg	An object of class reg.hgld.
newvalues	A data frame with the new values of the covariates. Column names must match the ones given in formulas <i>loc.formula</i> and <i>zero.formula</i> of the reg.hgld object.
10	Whether to return the lambda0 of each profile.
location	Whether to return the location of each profile.

Details

Given an object of class reg.hgld, a percentile and new values for the covariates, it returns the quantile of the fitted HGLD, given the covariates. The fitted HGLD must be non-negative. The contrast on the *newvalues* data frame must be the same of the *data* used to fit the reg.hgld regression.

Value

The quantile of the new values, according to the fitted HGLD regression.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

```
set.seed(100)
tmp <- na.omit(healthcare)
data <- tmp[sample(1:nrow(tmp),50),]
formula <- log_expense ~ age + sex + log_previous_expense
reg <- suppressWarnings(reg.hgld(data = data,zero.formula = formula,loc.formula = full = FALSE,param = "rs"))
newvalues <- tmp[sample(1:nrow(tmp),5),c(2,3,8)]
qhgld.reg(p = seq(0.05,0.95,0.1),reg,newvalues)</pre>
```

reg.hgld

reg.hgld	Fit a Hurdle Generalized Lambda Distribution Regression model

Description

Fit a Hurdle Generalized Lambda Distribution Regression model to a dataset.

Usage

```
reg.hgld(data, zero.formula, loc.formula, full = FALSE, param = "fmkl",
  maxit = 20000, init = NULL, alpha = 0,05, n.simu = 1000,
  plotKS = TRUE, h.bins = 50)
```

Arguments

data	A dataset containing the variables of the model.
zero.formula	A symbolic expression of the model to be fitted to the hurdle parameter of the distribution.
loc.formula	A symbolic expression of the model to be fitted to the location of the distribution.
full	Whether a simulation method must be applied to derive a confidence interval for the location regression coefficients.
param	"fmkl" or "rs".
maxit	Maximum number of iterations for numerical optimization.
init	Choose a different set of initial values to start the optimization process. This can either be full set of parameters including GLD parameter estimates, or it can just be the coefficient estimates of the regression model.
alpha	Significance level of the Confidence Interval for the GLD regression.
n.simu	Number of times to repeat the simulation runs, defaults to 1000.
plotKS	Whether to plot the KS resample test result within each plot.
h.bins	Number of bins for the GLD Regression normalized quantiles residuals histogram.

Details

Given a dataset, estimate by the Numerical Maximum Likelihood method the regression coefficients of the model and the five parameters of the error GLD. The regression coefficients that model the location of the distribution are estimated by the functions GLD.lm and GLD.lm.full of package GLDreg. The regression coefficients that model the hurdle parameter of the distribution are estimated by function gamlss.

Value

coefficients	The estimated coefficients of the HGLD regression.
Zplot	A function that generates the four diagnostic plots of the logistic regression.
Zres.sumarry	Summary of the normalised quantile residuals of the logistic regression.
Zfit	Normalised quantile residuals versus fitted values for the logistic regression.
Zindex	Normalised quantile residuals versus index for the logistic regression.

14 reg.hgld

Zdensity Normalised quantile residuals density for the logistic regression.

Zqq QQ-norm plot of the normalised quantile residuals for the logistic regression.

NZqq QQ-plot for the GLD regression residuals.

NZquant Quantile plot for the GLD regression residuals.

NZhistogram The histogram of the GLD regression residuals.

NZplot The normalised quantile residuals plots for the GLD regression.

NZres.sumarry

Summary of the normalised quantile residuals of the GLD regression.

NZfit Normalised quantile residuals versus fitted values for the GLD regression.

NZindex Normalised quantile residuals versus index for the GLD regression.

NZdensity normalised quantile residuals density for the GLD regression.

NZqqQuant QQ-norm plot of the normalised quantile residuals for the GLD regression.

KS test p-value for the GLD regression.

gamlss The gamlss object of the fitted logistic regression.

GLDreg The GLDreg object of the fitted GLD regression.

Zdata The data used to fit the logistic regression NZdata The data used to fit the GLD regression.

zero.formula A symbolic expression of the model to be fitted to the hurdle parameter of the

distribution.

loc.formula A symbolic expression of the model to be fitted to the location of the distribution.

param "fmkl" or "rs".

full Whether a simulation method must be applied to derive a confidence interval for

the location regression coefficients.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S.; Flexible Parametric Quantile Regression Model. (2015), Statistics & Computing May 2015, Volume 25, Issue 3, pp 635-650

rhgld 15

rhgld	The Hurdle Generalized Lambda Distribution Family	

Description

Sample from a Hurdle Generalized Lambda Distribution.

Usage

```
rhgld(n, mixture = FALSE, lambda1, lambda2 = NULL, prob = NULL,
   param = "fmkl")
```

Arguments

n	Number of observations to be generated.
mixture	Whether to sample from a mixture of HGLDs.
lambda1	A vector of length 5 with the five parameters of the HGLD, or of the first HGLD if mixture = TRUE.
lambda2	A vector of length 4 with the four parameters of the second HGLD if mixture = $TRUE$
prob	The cluster parameter for the mixture HGLD.
param	"fmkl" or "rs".

Details

If the parametrization of the RS or FMKL GLD is not acceptable, the function returns NA. This function is based on the GLDEX package.

Value

A sample of a HGLD.

References

Marcondes, D.; Peixoto, C.; Maia, A. C.; A Survey of a Hurdle Model for Heavy-Tailed Data Based on the Generalized Lambda Distribution. (2017) *arxiv1712.02183*

Su, S.; Fitting Single and Mixture of Generalized Lambda Distributions to Data via Discretized and Maximum Likelihood Methods: GLDEX in R. (2007), Journal of Statistical Software: *21* 9.

Index

```
*Topic datasets
    healthcare, 6
dhgld, 2
diag.hgld, 3
fit.hgld, 3, 4, 8
fun.auto.bimodal.pml,5
fun.data.fit.ml,5
gamlss, 13, 14
ggplot, 4, 9, 10
GLD.lm, 13
GLD.lm.full, 13
GLDEX, 2, 5, 8, 11, 15
GLDreg, 13, 14
healthcare, 6
phgld, 7
plot.fit.hgld, 8
plot.reg.hgld, 9
qhgld, 10
qhgld.reg, 12
QUnif, 5
reg.hgld, 10, 12, 13
rhgld, 15
runif.halton,5
runif.sobol,5
```