

# Package ‘extremeStat’

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**Type** Package

**Title** Extreme Value Statistics and Quantile Estimation

**Version** 1.4.0

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**Depends** R (>= 2.10)

**Imports** lmomco (>= 2.2.5), berryFunctions (>= 1.15.6), pbapply,  
RColorBrewer, grDevices, graphics, methods, stats, utils, evir,  
ismev, fExtremes, extRemes, evd, Renext

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**Description** Code to fit, plot and compare several (extreme value)  
distribution functions. Can also compute (truncated) distribution quantile estimates and  
draw a plot with return periods on a linear scale.

**License** GPL (>= 2)

**URL** <https://github.com/brry/extremeStat>

**RoxygenNote** 6.0.1.9000

**Suggests** testthat, knitr, rmarkdown

**VignetteBuilder** knitr

**BugReports** <https://github.com/brry/extremeStat>

**NeedsCompilation** no

**Repository** CRAN

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<b>annMax</b>	<i>annual discharge maxima (streamflow)</i>
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---

**Description**

Annual discharge maxima of a stream in Austria called Griesler or Fuschler Ache, at the measurement station (gauge) near St. Lorenz, catchment area ca 100 km<sup>2</sup>. Extracted from the time series 1976-2010 with a resolution of 15 Minutes.

**Format**

```
num [1:35] 61.5 77 37 69.3 75.6 74.9 43.7 50.8 55.6 84.1 ...
```

**Source**

Hydrographische Dienste Oberoesterreich und Salzburg, analyzed by package author (<berry-b@gmx.de>)

**Examples**

```
data(annMax)
str(annMax)
str(annMax)
plot(1976:2010, annMax, type="l", las=1, main="annMax dataset from Austria")
# Moving Average with different window widths:
berryFunctions::movAvLines(annMax, x=1976:2010, lwd=3, alpha=0.7)
```

---

distLexBoot*Bootstrapping uncertainty intervals for return periods*

---

**Description**

Calculates and plots bootstrap uncertainty intervals for [plotLextrme](#).

**Usage**

```
distLexBoot(dlf, nbest = 3, selection = NULL, n = 100, prop = 0.8,
            conf.lev = 0.95, RPs = NULL, log = TRUE, progbars = TRUE,
            quiet = FALSE)
```

**Arguments**

dlf	dlf object, as returned by <a href="#">distLextrme</a>
nbest	Number of best fitted distribution functions in dlf for which bootstrapping is to be done. Overridden by selection. DEFAULT: 3
selection	Character vector with distribution function names to be used. Suggested to keep this low. DEFAULT: NULL
n	Number of subsamples to be processed (computing time increases extraordinarily). DEFAULT: 100
prop	Proportion of sample to be used in each run. DEFAULT: 0.8
conf.lev	Confidence level (Proportion of subsamples within 'confidence interval'). Quantiles extracted from this value are passed to <a href="#">quantileMean</a> . DEFAULT: 0.95
RPs	Return Period vector, by default calculated internally based on value of log. DEFAULT: NULL
log	RPs suitable for plot on a logarithmic axis? DEFAULT: TRUE
progbars	Show progress bar for Monte Carlo simulation? DEFAULT: TRUE
quiet	Logical: suppress messages? See <a href="#">distLquantile</a> . DEFAULT: FALSE

**Details**

Has not been thoroughly tested yet. Bootstrapping defaults can probably be improved.

**Value**

invisible dlf object, see [printL](#). Additional elements are: exBootCL (confidence level), exBootRPs (x values for plot) exBootSim (all simulation results) and exBootCI (aggregated into CI band). The last two are each a list with a matrix (return levels)

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, Sept 2015 + Dec 2016

**See Also**

[plotLexBoot](#), [distLextreme](#)

**Examples**

```
data(annMax)
dlf <- distLextreme(annMax, selection=c("wak", "gum", "gev", "nor"))
dlfB <- distLexBoot(dlf, nbest=4, conf.lev=0.5, n=10) # n low for quick example tests
plotLexBoot(dlfB)
```

**distLextreme**

*Extreme value stats*

**Description**

Extreme value statistics for flood risk estimation. Input: vector with annual discharge maxima (or all observations for POT approach). Output: discharge estimates for given return periods, parameters of several distributions (fit based on L-moments), quality of fits, plot with linear/logarithmic axis. (plotting positions by Weibull and Gringorton).

**Usage**

```
distLextreme(dat = NULL, dlf = NULL, RPs = c(2, 5, 10, 20, 50), npy = 1,
             truncate = 0, quiet = FALSE, ...)
```

**Arguments**

<b>dat</b>	Vector with <i>either</i> (for Block Maxima Approach) extreme values like annual discharge maxima <i>or</i> (for Peak Over Threshold approach) all values in time-series. Ignored if dlf is given. DEFAULT: NULL
<b>dlf</b>	List as returned by <a href="#">distLfit</a> . See also <a href="#">distLquantile</a> . Overrides dat! DEFAULT: NULL
<b>RPs</b>	Return Periods (in years) for which discharge is estimated. DEFAULT: c(2,5,10,20,50)
<b>npy</b>	Number of observations per year. Leave npy=1 if you use annual block maxima (and leave truncate at 0). If you use a POT approach (see <a href="#">vignette</a> and examples below) e.g. on daily data, use npy=365.24. DEFAULT: 1
<b>truncate</b>	Truncated proportion to determine POT threshold, see <a href="#">distLquantile</a> . DEFAULT: 0
<b>quiet</b>	Suppress notes and progbars? DEFAULT: FALSE
<b>...</b>	Further arguments passed to <a href="#">distLquantile</a> like truncate, selection, time, progbars

## Details

`plotLextreme` adds weibull and gringorton plotting positions to the distribution lines, which are estimated from the L-moments of the data itself.

I personally believe that if you have, say, 35 values in dat, the highest return period should be around 36 years (Weibull) and not 60 (Gringorton).

The plotting positions don't affect the distribution parameter estimation, so this dispute is not really important. But if you care, go ahead and google "weibull vs gringorton plotting positions".

Plotting positions are not used for fitting distributions, but for plotting only. The ranks of ascendingly sorted extreme values are used to compute the probability of non-exceedance Pn:

```
Pn_w <- Rank      /(n+1)      # Weibull
Pn_g <- (Rank-0.44)/(n+0.12)    # Gringorton (taken from lmom:::evplot.default)
Finally: RP = Return period = recurrence interval = 1/P_exceedance = 1/(1-P_nonexc.), thus:
RPweibull = 1/(1-Pn_w) and analogous for gringorton.
```

## Value

invisible dlf object, see `printL`. The added element is `returnlev`, a data.frame with the return level (discharge) for all given RPs and for each distribution. Note that this differs from `distLquantile` (matrix output, not data.frame)

## Note

This function replaces `berryFunctions::extremeStatLmom`

## Author(s)

Berry Boessenkool, <berry-b@gmx.de>, 2012 (first draft) - 2014 & 2015 (main updates)

## References

<http://RclickHandbuch.wordpress.com> Chapter 15 (German)  
 Christoph Mudersbach: Untersuchungen zur Ermittlung von hydrologischen Bemessungsgroessen mit Verfahren der instationaeren Extremwertstatistik

## See Also

`distLfit`, `distLexBoot` for confidence interval from Bootstrapping, `fevd` in the package `extRemes`.

## Examples

```
# Basic examples
# BM vs POT
# Plotting options
# weighted mean based on Goodness of fit (GOF)
# Effect of data proportion used to estimate GOF
# compare extremeStat with other packages

library(lmomco)
```

```

library(berryFunctions)

data(annMax) # annual streamflow maxima in river in Austria

# Basic examples -----
dlf <- distLextreme(annMax)
plotLextreme(dlf, log=TRUE)

# Object structure:
str(dlf, max.lev=2)
printL(dlf)

# discharge levels for default return periods:
dlf$returnlev

# Estimate discharge that could occur every 80 years (at least empirically):
Q80 <- distLextreme(dlf=dlf, RPs=80)$returnlev
round(sort(Q80[1:17,1]),1)
# 99 to 143 m^3/s can make a relevant difference in engineering!
# That's why the rows weighted by GOF are helpful. Weights are given as in
plotWeights(dlf) # See also section weighted mean below
# For confidence intervals see ?distLexBoot

# Return period of a given discharge value, say 120 m^3/s:
round0(sort(1/(1-sapply(dlf$parameter, plmomco, x=120) ) ),1)
# exponential:           every 29 years
# gev (general extreme value dist): 59,
# Weibull:                 every 73 years only

# BM vs POT -----
# Return levels by Block Maxima approach vs Peak Over Threshold approach:
# BM distribution theoretically converges to GEV, POT to GPD

data(rain, package="ismev")
days <- seq(as.Date("1914-01-01"), as.Date("1961-12-30"), by="days")
BM <- tapply(rain, format(days,"%Y"), max) ; rm(days)
dlfBM <- plotLextreme(distLextreme(BM, emp=FALSE), ylim=lim0(100), log=TRUE, nbest=10)
plotLexBoot(distLexBoot(dlfBM, quiet=TRUE), ylim=lim0(100))
plotLextreme(dlfBM, log=TRUE, ylim=lim0(100))

dlfPOT99 <- distLextreme(rain, npy=365.24, trunc=0.99, emp=FALSE)
dlfPOT99 <- plotLextreme(dlfPOT99, ylim=lim0(100), log=TRUE, nbest=10, main="POT 99")
printL(dlfPOT99)

# using only nonzero values (normally yields better fits, but not here)
rainnz <- rain[rain>0]
dlfPOT99nz <- distLextreme(rainnz, npy=length(rainnz)/48, trunc=0.99, emp=FALSE)
dlfPOT99nz <- plotLextreme(dlfPOT99nz, ylim=lim0(100), log=TRUE, nbest=10,
                           main=paste("POT 99 x>0, npy =", round(dlfPOT99nz$npy,2)))

## Not run: ## Excluded from CRAN R CMD check because of computing time

```

```

dlfPOT99boot <- distLexBoot(dlfPOT99, prop=0.4)
printL(dlfPOT99boot)
plotLexBoot(dlfPOT99boot)

dlfPOT90 <- distExtreme(rain, npy=365.24, trunc=0.90, emp=FALSE)
dlfPOT90 <- plotExtreme(dlfPOT90, ylim=lim0(100), log=TRUE, nbest=10, main="POT 90")

dlfPOT50 <- distExtreme(rain, npy=365.24, trunc=0.50, emp=FALSE)
dlfPOT50 <- plotExtreme(dlfPOT50, ylim=lim0(100), log=TRUE, nbest=10, main="POT 50")

## End(Not run)

ig99 <- ismev::gpd.fit(rain, dlfPOT99$threshold)
ismevo::gpd.diag(ig99); title(main=paste(99, ig99$threshold))
## Not run:
ig90 <- ismev::gpd.fit(rain, dlfPOT90$threshold)
ismev::gpd.diag(ig90); title(main=paste(90, ig90$threshold))
ig50 <- ismev::gpd.fit(rain, dlfPOT50$threshold)
ismev::gpd.diag(ig50); title(main=paste(50, ig50$threshold))

## End(Not run)

# Plotting options -----
plotExtreme(dlf=dlf)
# Line colors / select distributions to be plotted:
plotExtreme(dlf, nbest=17, distcols=heat.colors(17), lty=1:5) # lty is recycled
plotExtreme(dlf, selection=c("gev", "gam", "gum"), distcols=4:6, PPcol=3, lty=3:2)
plotExtreme(dlf, selection=c("gpa", "glo", "wei", "exp"), pch=c(NA,NA,6,8),
            order=TRUE, cex=c(1,0.6, 1,1), log=TRUE, PPpch=c(16,NA), n_pch=20)
# use n_pch to say how many points are drawn per line (important for linear axis)

plotExtreme(dlf, legarg=list(cex=0.5, x="bottom", box.col="red", col=3))
# col in legarg list is (correctly) ignored
## Not run:
## Excluded from package R CMD check because it's time consuming

plotExtreme(dlf, PPpch=c(1,NA)) # only Weibull plotting positions
# add different dataset to existing plot:
distExtreme(Nile/15, add=TRUE, PPpch=NA, distcols=1, selection="wak", legend=FALSE)

# Logarithmic axis
plotExtreme(distExtreme(Nile), log=TRUE, nbest=8)

# weighted mean based on Goodness of fit (GOF) -----
# Add discharge weighted average estimate continuously:
plotExtreme(dlf, nbest=17, legend=FALSE)
abline(h=115.6, v=50)
RP <- seq(1, 70, len=100)
DischargeEstimate <- distExtreme(dlf=dlf, RPs=RP, plot=FALSE)$returnlev

```

```

lines(RP, DischargeEstimate["weighted2",], lwd=3, col="orange")

# Or, on log scale:
plotLextreme(dlf, nbest=17, legend=FALSE, log=TRUE)
abline(h=115.9, v=50)
RP <- unique(round(logSpaced(min=1, max=70, n=200, plot=FALSE),2))
DischargeEstimate <- distLextreme(dlf=dlf, RPs=RP)$returnlev
lines(RP, DischargeEstimate["weighted2",], lwd=5)

# Minima -----
browseURL("http://nrfa.ceh.ac.uk/data/station/meanflow/39072")
qfile <- system.file("extdata/discharge39072.csv", package="berryFunctions")
Q <- read.table(qfile, skip=19, header=TRUE, sep=",", fill=TRUE)[,1:2]
rm(qfile)
colnames(Q) <- c("date","discharge")
Q$date <- as.Date(Q$date)
plot(Q, type="l")
Qmax <- tapply(Q$discharge, format(Q$date,"%Y"), max)
plotLextreme(distLextreme(Qmax, quiet=TRUE))
Qmin <- tapply(Q$discharge, format(Q$date,"%Y"), min)
dlf <- distLextreme(-Qmin, quiet=TRUE, RPs=c(2,5,10,20,50,100,200,500))
plotLextreme(dlf, ylim=c(0,-31), yaxs="i", yaxt="n", ylab="Q annual minimum", nbest=14)
axis(2, -(0:3*10), 0:3*10, las=1)
-dlf$returnlev[c(1:14,21), ]
# Some distribution functions are an obvious bad choice for this, so I use
# weighted 3: Values weighted by GOF of dist only for the best half.
# For the Thames in Windsor, we will likely always have > 9 m^3/s streamflow

# compare extremeStat with other packages: -----
library(extRemes)
plot(fevd(annMax))
par(mfrow=c(1,1))
return.level(fevd(annMax, type="GEV")) # "GP", "PP", "Gumbel", "Exponential"
distLextreme(dlf=dlf, RPs=c(2,20,100))$returnlev["gev",]
# differences are small, but noticeable...
# if you have time for a more thorough control, please pass me the results!

# yet another dataset for testing purposes:
Dresden_AnnualMax <- c(403, 468, 497, 539, 542, 634, 662, 765, 834, 847, 851, 873,
885, 983, 996, 1020, 1028, 1090, 1096, 1110, 1173, 1180, 1180,
1220, 1270, 1285, 1329, 1360, 1360, 1387, 1401, 1410, 1410, 1456,
1556, 1580, 1610, 1630, 1680, 1734, 1740, 1748, 1780, 1800, 1820,
1896, 1962, 2000, 2010, 2238, 2270, 2860, 4500)
plotLextreme(distLextreme(Dresden_AnnualMax))

## End(Not run) # end dontrun

```

---

<code>distLfit</code>	<i>Fit distributions via L-moments</i>
-----------------------	----------------------------------------

---

## Description

Fit several distributions via L-moments with `lmomco::lmom2par` and compute goodness of fit measures.

## Usage

```
distLfit(dat, datname = deparse(substitute(dat)), selection = NULL,
         speed = TRUE, ks = FALSE, truncate = 0,
         threshold = berryFunctions::quantileMean(dat, truncate),
         progbars = length(dat) > 200, time = TRUE, quiet = FALSE,
         ssquiet = quiet, ...)
```

## Arguments

<code>dat</code>	Vector with values
<code>datname</code>	Character string for main, xlab etc. DEFAULT: <code>deparse(substitute(dat))</code>
<code>selection</code>	Selection of distributions. Character vector with types as in <code>lmom2par</code> . Overrides speed. DEFAULT: NULL
<code>speed</code>	If TRUE, several distributions are omitted, for the reasons shown in <code>lmomco::dist.list()</code> . DEFAULT: TRUE
<code>ks</code>	Include ks.test results and CDF R^2 in <code>dlf\$gof?</code> Computing is much faster when FALSE. DEFAULT: FALSE
<code>truncate</code>	Number between 0 and 1. POT Censored <code>distLquantile</code> : fit to highest values only (truncate lower proportion of x). Probabilities are adjusted accordingly. DEFAULT: 0
<code>threshold</code>	POT cutoff value. If you want correct percentiles, set this only via truncate, see Details of <code>q_gpd</code> . DEFAULT: <code>quantileMean(x, truncate)</code>
<code>progbars</code>	Show progress bars for each loop? DEFAULT: TRUE if <code>n &gt; 200</code>
<code>time</code>	<code>message</code> execution time? DEFAULT: TRUE
<code>quiet</code>	Suppress notes? DEFAULT: FALSE
<code>ssquiet</code>	Suppress sample size notes? DEFAULT: quiet
<code>...</code>	Further arguments passed to <code>distLweights</code> like <code>weightc, order=FALSE</code>

## Value

invisible dlf object, see `printL`.

## Author(s)

Berry Boessenkool, <berry-b@gmx.de>, Sept 2014, July 2015, Dec 2016

**See Also**

[plotLfit](#), [distWeights](#), [plotWeights](#), [extRemes::fevd](#), [MASS::fitdistr](#).

More complex estimates of quality of fits: Fard, M.N.P. and Holmquist, B. (2013, Chilean Journal of Statistics): Powerful goodness-of-fit tests for the extreme value distribution. [http://chjs.mat.utfsm.cl/volumes/04/01/Fard\\_Holmquist.pdf](http://chjs.mat.utfsm.cl/volumes/04/01/Fard_Holmquist.pdf)

**Examples**

```

data(annMax)
# basic usage on real data (annual discharge maxima in Austria)
dlf <- distLfit(annMax)
str(dlf, max.lev=2)
printL(dlf)
plotLfit(dlf)

# arguments that can be passed to plotting function:
plotLfit(dlf, lty=2, col=3, nbest=17, legargs=list(lwd=3), main="booh!")
set.seed(42)
dlf_b <- distLfit(rbeta(100, 5, 2))
plotLfit(dlf_b, nbest=10, legargs=c(x="left"))
plotLfit(dlf_b, selection=c("gpa", "glo", "gev", "wak"))
plotLfit(dlf_b, selection=c("gpa", "glo", "gev", "wak"), order=TRUE)
plotLfit(dlf_b, distcols=c("orange",3:6), lty=1:3) # lty is recycled
plotLfit(dlf_b, cdf=TRUE)
plotLfit(dlf_b, cdf=TRUE, histargs=list(do.points=FALSE), sel="nor")

# logarithmic axes:
set.seed(1)
y <- 10^rnorm(300, mean=2, sd=0.3) # if you use 1e4, distLfit will be much slower
hist(y, breaks=20)
berryFunctions::logHist(y, col=8)
dlf <- distLfit(log10(y))
plotLfit(dlf, breaks=50)
plotLfit(dlf, breaks=50, log=TRUE)

# Goodness of fit: how well do the distributions fit the original data?
# measured by RMSE of cumulated distribution function and ?ecdf
# RMSE: root of average of ( errors squared ) , errors = line distances
dlf <- distLfit(annMax, ks=TRUE)
plotLfit(dlf, cdf=TRUE, sel=c("wak", "revgum"))
x <- sort(annMax)
segments(x0=x, y0=lmomco::plmomco(x, dlf$parameter$revgum), y1=ecdf(annMax)(x), col=2)
segments(x0=x, y0=lmomco::plmomco(x, dlf$parameter$wak), y1=ecdf(annMax)(x), col=4, lwd=2)
# weights by three different weighting schemes, see distWeights:
plotWeights(dlf)
plotLfit(distLfit(annMax ), cdf=TRUE, nbest=17)$gof
plotLfit(distLfit(annMax, truncate=0.7), cdf=TRUE, nbest=17)$gof
pairs(dlf$gof[,-(2:5)]) # measures of goodness of fit are correlated quite well here.
dlf$gof

```

```

# Kolmogorov-Smirnov Tests for normal distribution return slightly different values:
library(lmomco)
ks.test(annMax, "pnorm", mean(annMax), sd(annMax) )$p.value
ks.test(annMax, "cdfnor", pnorm(lmomoms(annMax)))$p.value

# Fit all available distributions (30):
## Not run: # this takes a while...
d_all <- distLfit(annMax, speed=FALSE, progbars=TRUE) # 20 sec
printL(d_all)
plotLfit(d_all, nbest=30, distcols=grey(1:22/29), xlim=c(20,140))
plotLfit(d_all, nbest=30, ylim=c(0,0.04), xlim=c(20,140))
plotLweights(d_all)
d_all$gof

## End(Not run)

```

distLquantile      *distribution quantiles*

## Description

Parametric quantiles of distributions fitted to a sample.

## Usage

```
distLquantile(x = NULL, probs = c(0.8, 0.9, 0.99), truncate = 0,
  threshold = quantileMean(dlf$dat_full[is.finite(dlf$dat_full)], truncate),
  sanerange = NA, sanevals = NA, selection = NULL, order = TRUE,
  dlf = NULL, datname = deparse(substitute(x)), list = FALSE,
  empirical = TRUE, qemp.type = 8, weighted = empirical,
  gpd = empirical, speed = TRUE, quiet = FALSE, ssquiet = quiet,
  ttquiet = quiet, gpquiet = missing(quiet) | quiet, ...)
```

## Arguments

- |           |                                                                                                                                                                                             |
|-----------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| x         | Sample for which parametric quantiles are to be calculated. If it is NULL (the default), dat from dlf is used. DEFAULT: NULL                                                                |
| probs     | Numeric vector of probabilities with values in [0,1]. DEFAULT: c(0.8,0.9,0.99)                                                                                                              |
| truncate  | Number between 0 and 1 (proportion of sample discarded). Censored quantile: fit to highest values only (truncate lower proportion of x). Probabilities are adjusted accordingly. DEFAULT: 0 |
| threshold | POT cutoff value. If you want correct percentiles, set this only via truncate, see Details of <a href="#">q_gpd</a> . DEFAULT: <a href="#">quantileMean</a> (x, truncate)                   |

<code>sanerange</code>	Range outside of which results should be changed to <code>sanevals</code> . This can capture numerical errors in small samples (notably GPD_MLE_extRemes). If NA, this is ignored. Attention: the RMSE column is also checked and changed. DEFAULT: NA
<code>sanevals</code>	Values to be used below [1] and above [2] <code>sanerange</code> . DEFAULT: NA
<code>selection</code>	Distribution type, eg. " gev" or "wak", see <code>lmomco::dist.list</code> . Can be a vector. If NULL (the default), all types present in <code>dfl\$distnames</code> are used. DEFAULT: NULL
<code>order</code>	Logical: sort by RMSE, even if selection is given? See <code>distWeights</code> . DEFAULT: TRUE
<code>dfl</code>	dfl object described in <code>extremeStat</code> . Use this to save computing time for large datasets where you already have dfl. DEFAULT: NULL
<code>datname</code>	Character string: data name, important if list=TRUE. DEFAULT: deparse(substitute(x))
<code>list</code>	Return full dflist with output attached as element quant? If FALSE (the default), just the matrix with quantile estimates is returned. DEFAULT: FALSE
<code>empirical</code>	Add rows "empirical" and "quantileMean" in the output matrix? Uses <code>quantile</code> with <code>qemp.type</code> (ignoring truncation) and <code>quantileMean</code> . DEFAULT: TRUE
<code>qemp.type</code>	Method passed to <code>quantile</code> for row "empirical". Only used if <code>empirical</code> =TRUE. DEFAULT: 8 (NOT the <code>stats::quantile</code> default)
<code>weighted</code>	Include weighted averages across distribution functions to the output? DEFAULT: empirical, so additional options can all be excluded with emp=F.
<code>gpd</code>	Include GPD quantile estimation via <code>q_gpd</code> ? Note that the 'GPD_LMO_lmomco' result differs slightly from 'gpa', especially if <code>truncate=0</code> . This comes from using <code>x&gt;threshold</code> (all 'GPD_*' distributions) or <code>x&gt;=threshold</code> ('gpa' and all other distributions in <code>extremeStat</code> ). DEFAULT: empirical
<code>speed</code>	Compute <code>q_gpd</code> only for fast methods? Currently, only the Bayesian method is excluded. DEFAULT: TRUE
<code>quiet</code>	Suppress notes? If it is actually set to FALSE (not missing), <code>gpquiet</code> is set to FALSE to print all the warnings including stacks. DEFAULT: FALSE
<code>ssquiet</code>	Suppress sample size notes? DEFAULT: quiet
<code>ttquiet</code>	Suppress truncation!=threshold note? DEFAULT: quiet
<code>gpquiet</code>	Suppress warnings in <code>q_gpd</code> ? DEFAULT: TRUE if quiet is not specified, else quiet
<code>...</code>	Arguments passed to <code>distLfit</code> and <code>distWeights</code> like <code>weightc, ks=TRUE</code>

## Details

Very high quantiles (99% and higher) need large sample sizes for `quantile` to yield a robust estimate. Theoretically, at least  $1/(1-\text{probs})$  values must be present, e.g. 10'000 for Q99.99%. With smaller sample sizes (eg n=35), they underestimate the actual (but unknown) quantile. Parametric quantiles need only small sample sizes. They don't have a systematical underestimation bias, but have higher variability.

**Value**

if list=FALSE (default): invisible matrix with distribution quantile values . if list=TRUE: invisible dlf object, see [printL](#)

**Note**

NAs are always removed from x in [distLfit](#)

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, March + July 2015, Feb 2016

**References**

On GPD: <http://stats.stackexchange.com/questions/69438>

**See Also**

[q\\_gpd](#), [distLfit](#), require("truncdist") Xian Zhou, Liuquan Sun and Haobo Ren (2000): Quantile estimation for left truncated and right censored data, Statistica Sinica 10 <http://www3.stat.sinica.edu.tw/statistica/oldpdf/A10n411.pdf>

**Examples**

```
data(annMax) # Annual Discharge Maxima (streamflow)

distLquantile(annMax, emp=FALSE)[,] # several distribution functions in lmomco
distLquantile(annMax, truncate=0.8, probs=0.95)[,] # POT (annMax already block maxima)
dlf <- distLquantile(annMax, probs=0.95, list=TRUE)
plotLquantile(dlf, linargs=list(lwd=3), nbest=5, breaks=10)
dlf$quant
# Parametric 95% quantile estimates range from 92 to 111!
# But the best fitting distributions all lie around 103.

# compare General Pareto Fitting methods
# Theoretically, the tails of distributions converge to GPD (General Pareto)
# q_gpd compares several R packages for fitting and quantile estimation:
dlq <- distLquantile(annMax, weighted=FALSE, quiet=TRUE, probs=0.97, list=TRUE)
dlq$quant
plotLquantile(dlq) # per default best fitting distribution functions
plotLquantile(dlq, row=c("wak","GPD*"), nbest=14)
#pdf("dummy.pdf", width=9)
plotLquantile(dlq, row="GPD*", nbest=13, xlim=c(102,110),
              linargs=list(lwd=3), heights=seq(0.02, 0.005, len=14))
#dev.off()

## Not run:
## Taken out from CRAN package check because it's slow
```

```

# Sanity checks: important for very small samples:
x1 <- c(2.6, 2.5, 2.9, 3, 5, 2.7, 2.7, 5.7, 2.8, 3.1, 3.6, 2.6, 5.8, 5.6, 5.7, 5.3)
q1 <- distLquantile(x1, sanerange=c(0,500), sanevals=c(NA,500))
x2 <- c(6.1, 2.4, 4.1, 2.4, 6, 6.3, 2.9, 6.8, 3.5)
q2 <- distLquantile(x2, sanerange=c(0,500), sanevals=c(NA,500), quiet=FALSE)
x3 <- c(4.4, 3, 1.8, 7.3, 2.1, 2.1, 1.8, 1.8)
q3 <- distLquantile(x3, sanerange=c(0,500), sanevals=c(NA,500))

# weighted distribution quantiles are calculated by different weighting schemes:
plotLweights(dlf)

# If speed is important and parameters are already available, pass them via dlf:
distLquantile(dlf=dlf, probs=0:5/5, selection=c("wak","gev","kap"))
distLquantile(dlf=dlf, truncate=0.3, list=TRUE)$truncate

# censored (truncated, trimmed) quantile, Peak Over Threshold (POT) method:
qwak <- distLquantile(annMax, sel="wak", prob=0.95, emp=FALSE, list=TRUE)
plotLquantile(qwak, ylim=c(0,0.06) ); qwak$quant
qwak2 <- distLquantile(annMax, sel="wak", prob=0.95, emp=FALSE, list=TRUE, truncate=0.6)
plotLquantile(qwak2, add=TRUE, distcols="blue")

# Simulation of truncation effect
library(lmomco)
#set.seed(42)
rnum <- rlmomco(n=1e3, para=dlf$parameter$gev)
myprobs <- c(0.9, 0.95, 0.99, 0.999)
mytrunc <- seq(0, 0.9, length.out=20)
trunceffect <- sapply(mytrunc, function(mt) distLquantile(rnum, selection="gev",
               probs=myprobs, truncate=mt, quiet=TRUE,
               pempirical=FALSE)[["gev",]])
# If more values are truncated, the function runs faster

op <- par(mfrow=c(2,1), mar=c(2,4.5,2,0.5), cex.main=1)
dlf1 <- distLquantile(rnum, sel="gev", probs=myprobs, emp=FALSE, list=TRUE)
dlf2 <- distLquantile(rnum, sel="gev", probs=myprobs, emp=FALSE, list=TRUE, truncate=0.3)
plotLquantile(dlf1, ylab="", xlab="")
plotLquantile(dlf2, add=TRUE, distcols=4)
legend("right", c("fitted GEV", "fitted with truncate=0.3"), lty=1, col=c(2,4), bg="white")
par(mar=c(3,4.5,3,0.5))
plot(mytrunc, trunceffect[1,], ylim=range(trunceffect), las=1, type="l",
      main=c("High quantiles of 1000 random numbers from gev distribution",
             "Estimation based on proportion of lower values truncated"),
      xlab="", ylab="parametric quantile")
title(xlab="Proportion censored", mgp=c(1.8,1,0))
for(i in 2:4) lines(mytrunc, trunceffect[i,])
library("berryFunctions")
textField(rep(0.5,4), trunceffect[,11], paste0("Q",myprobs*100,"%"))
par(op)

trunc <- seq(0,0.1,len=200)
dd <- pbsapply(trunc, function(t) distLquantile(annMax,

```

```

selection="gpa", weight=FALSE, truncate=t, prob=0.99, quiet=T)[c(1,3),])
plot(trunc, dd[1,], type="o", las=1)
lines(trunc, dd[2,], type="o", col=2)

set.seed(3); rnum <- rlmomco(n=1e3, para=dlf$parameter$gpa)
qd99 <- evir::quant(rnum, p=0.99, start=15, end=1000, ci=0.5, models=30)
axis(3, at=seq(-1000,0, length=6), labels=0:5/5, pos=par("usr")[3])
title(xlab="Proportion truncated", line=-3)
mytrunc <- seq(0, 0.9, length.out=30)
trunceffect <- sapply(mytrunc, function(mt) distLquantile(rnum, selection="gpa",
               probs=0.99, truncate=mt, plot=FALSE, quiet=TRUE,
               empirical=FALSE, gpd=TRUE))
lines(-1000*(1-mytrunc), trunceffect[,], col=4)
lines(-1000*(1-mytrunc), trunceffect[,], col=3) # interesting...
for(i in 3:13) lines(-1000*(1-mytrunc), trunceffect[,], col=3) # interesting...

# If you want the estimates only for one single truncation, use
q_gpd(rnum, probs=myprobs, truncate=0.5)

## End(Not run) # end dontrun

```

**distLweights***Compute distribution weights from GOF***Description**

Determine distribution function weights from RMSE for weighted averages. The weights are inverse to RMSE: weight1 for all dists, weight2 places zero weight on the worst fitting function, weight3 on the worst half of functions.

**Usage**

```
distLweights(RMSE, order = TRUE, onlydn = TRUE, weightc = NA,
             quiet = FALSE, ...)
```

**Arguments**

<b>RMSE</b>	Numeric: Named vector with goodness of fit values (RMSE). Can also be a data.frame, in which case the column rmse or RMSE is used.
<b>order</b>	Logical: should result be ordered by RMSE? If order=FALSE, the order of appearance in RMSE is kept (alphabetic or selection in <a href="#">distLfit</a> ). DEFAULT: TRUE
<b>onlydn</b>	Logical: weight only distributions from <a href="#">lmomco::dist.list</a> ? DEFAULT: TRUE (all other RMSEs are set to 0)

weightc	Optional: a named vector with custom weights for each distribution. Are internally normalized to sum=1 after removing nonfitted dists. Names match the parameter names from RMSE. DEFAULT: NA
quiet	Logical: Suppress messages. DEFAULT: FALSE
...	Ignored arguments (so a set of arguments can be passed to distLfit and distLquantile and arguments used only in the latter will not throw errors)

**Value**

data.frame

**Author(s)**

Berry Boessenkool, &lt;berry-b@gmx.de&gt;, Dec 2016

**See Also**[distLfit](#), [distLquantile](#)**Examples**

```
# weights from RMSE vector:
RMSE <- c(gum=0.20, wak=0.17, gam=0.21, gev=0.15)
distLweights(RMSE)
distLweights(RMSE, order=FALSE)

# weights from RMSE in data.frame:
df <- data.frame("99.9%"=2:5, RMSE=sample(3:6))
rownames(df) <- letters[1:4]
df ; distLweights(df, onlydn=FALSE)

# custom weights:
set.seed(42); x <- data.frame(A=1:5, RMSE=runif(5)) ; x
distLweights(x) # two warnings
distLweights(x, weightc=c("1"=3, "3"=5), onlydn=FALSE)
distLweights(x, weightc=c("1"=3, "3"=5), order=FALSE, onlydn=FALSE)

# real life example:
data(annMax)
cw <- c("gpa"=7, "gev"=3, "wak"=6, "wei"=4, "kap"=3.5, "gum"=3, "ray"=2.1,
       "ln3"=2, "pe3"=2.5, "gno"=4, "gam"=5)
dlf <- distLfit(annMax, weightc=cw, quiet=TRUE, order=FALSE)
plotLweights(dlf)

# GOF judgement by RMSE, not R2 -----
# Both RMSE and R2 are computed with ECDF and TCDF
# R2 may be very good (see below), but fit needs to be close to 1:1 line,
# which is better measured by RMSE

dlf <- distLfit(annMax, ks=TRUE)
```

```

op <- par(mfrow=c(1,2), mar=c(3,4,0.5,0.5), mgp=c(1.9,0.7,0))
plot(dlf$gof$RMSE, 17:1, yaxt="n", ylab="", type="o"); axis(2, 17:1, rownames(dlf$gof), las=1)
plot(dlf$gof$R2, 17:1, yaxt="n", ylab="", type="o"); axis(2, 17:1, rownames(dlf$gof), las=1)
par(op)
sel <- c("wak","lap","nor","revgum")
plotLfit(dlf, selection=sel, cdf=TRUE)
dlf$gof[sel,-(2:7)]

x <- sort(annMax, decreasing=TRUE)
ECDF <- ecdf(x)(x)
TCDF <- sapply(sel, function(d) lmomco::plmomco(x,dlf$parameter[[d]]))

plot(TCDF[, "lap"], ECDF, col="cyan", asp=1, las=1)
points(TCDF[, "nor"], ECDF, col="green")
#points(TCDF[, "wak"], ECDF, col="blue")
#points(TCDF[, "revgum"], ECDF, col="red")
abline(a=0, b=1, lwd=3, lty=3)
legend("bottomright", c("lap good RMSE bad R2", "nor bad RMSE good R2"),
       col=c("cyan", "green"), lwd=2)
berryFunctions::linReg(TCDF[, "lap"], ECDF, add=TRUE, digits=3, col="cyan", pos1="topleft")
berryFunctions::linReg(TCDF[, "nor"], ECDF, add=TRUE, digits=3, col="green", pos1="left")

# more distinct example (but with fake data)
set.seed(42); x <- runif(30)
y1 <- x+rnorm(30, sd=0.09)
y2 <- 1.5*x+rnorm(30, sd=0.01)-0.3
plot(x,x, asp=1, las=1, main="High cor (R2) does not necessarily mean good fit!")
berryFunctions::linReg(x, y2, add=TRUE, digits=4, pos1="topleft")
points(x,y2, col="red", pch=3)
points(x,y1, col="blue")
berryFunctions::linReg(x, y1, add=TRUE, digits=4, col="blue", pos1="left")
abline(a=0, b=1, lwd=3, lty=3)

```

## Description

Fit (via L moments), plot (on a linear scale) and compare (by goodness of fit) several (extreme value) distributions. Compute high quantiles even in small samples and estimate extrema at given return periods.

Open the [Vignette](#) for an introduction to the package: `vignette("extremeStat")`

This package heavily relies on and thankfully acknowledges the package `lmomco` by WH Asquith.

## Package overview

The main functions in the `extremeStat` package are:

```

distLweights          -> plotLweights
distLfit              -> plotLfit
q_gpd + q_weighted -> distLquantile -> plotLquantile
distLextreme         -> plotLextreme
distLexBoot

```

They create and modify a list object printed by (and documented in) **printL**.

### **Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, 2014-2016

### **See Also**

If you are looking for more detailed (uncertainty) analysis, eg confidence intervals, check out the package **extRemes**, especially the function **fevd**. <https://cran.r-project.org/package=extRemes>  
 Intro slides: <http://sites.lsa.umich.edu/eva2015/wp-content/uploads/sites/44/2015/06/Intro2EVT.pdf>  
 Parameter fitting and distribution functions: <https://cran.r-project.org/package=lmomco>  
 Distributions: <https://www.rmetrics.org/files/Meielisalp2009/Presentations/Scott.pdf>  
 and: <https://cran.r-project.org/view=Distributions>  
 R in Hydrology: <http://abouthydrology.blogspot.de/2012/08/r-resources-for-hydrologists.html>

---

### **Examples**

```

data(annMax) # annual discharge maxima from a stream in Austria
plot(annMax, type="l")
dle <- distLextreme(annMax)
dle$returnlev

```

---

**plotLexBoot**

*Bootstrapping uncertainty intervals for return periods*

---

### **Description**

plot bootstrap uncertainty intervals for **plotLextreme**.

### **Usage**

```
plotLexBoot(dlf, selection = NULL, add = FALSE, log = TRUE, ...)
```

**Arguments**

<code>dlf</code>	dlf object, as returned by <a href="#">distLexBoot</a>
<code>selection</code>	Character vector with distribution function names to be used. Suggested to keep this low. DEFAULT: NULL
<code>add</code>	Add to existing plot? DEFAULT: FALSE
<code>log</code>	Plot on a logarithmic axis. DEFAULT: TRUE
<code>...</code>	Further arguments passed to <a href="#">plotLextreme</a> . If add=TRUE, they are instead passed to <code>berryFunctions::ciBand</code>

**Value**

invisible dlf object, see [printL](#)

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, Dec 2016

**See Also**

[distLexBoot](#)

**Examples**

```
# see distLexBoot
```

`plotLextreme`

*Plot extreme value statistics*

**Description**

Plots distributions fitted by L-moments and adds plotting positions by Weibull and Gringorton. This is an auxiliary graphing function to [distLextreme](#)

**Usage**

```
plotLextreme(dlf, selection = NULL, order = FALSE, add = FALSE,
             nbest = 5, log = FALSE, xlim = NULL, ylim = NULL, las = 1,
             main = dlf$datname, xlab = "Return Period RP [a]",
             ylab = "Discharge HQ [m\u00b3/s]", PPcol = "black", PPpch = c(16, 3),
             PPcex = 1, distcols = berryFunctions::rainbow2(nbest), lty = 1,
             lwd = 1, pch = NA, cex = 1, n_pch = 15, legend = TRUE, rmse = 4,
             legargs = NULL, quiet = FALSE, ...)
```

### Arguments

<code>dlf</code>	List as returned by <code>distLextrme</code> or <code>distLexBoot</code>
<code>selection</code>	Selection of distributions. Character vector with type as in <code>lmom2par</code> . DEFAULT: NULL
<code>order</code>	If selection is given, should legend and colors be ordered by gof anyways? DEFAULT: FALSE
<code>add</code>	If TRUE, plot is not called before adding lines. This lets you add lines to an existing plot. DEFAULT: FALSE
<code>nbest</code>	Number of distributions plotted, in order of goodness of fit. Overwritten internally if selection is given. DEFAULT: 5
<code>log</code>	Logarithmic x-axis? DEFAULT: FALSE
<code>xlim</code>	X-axis limits. DEFAULT: xlim of plotting positions
<code>ylim</code>	Y-lim. DEFAULT: from min to extended max
<code>las</code>	LabelAxisStyle to orient labels, see <code>par</code> . DEFAULT: 1
<code>main</code>	Title of plot. DEFAULT: dlf\$datname
<code>xlab</code>	X axis label. DEFAULT: "Return Period RP [a]"
<code>ylab</code>	Y axis label. Please note that the ubuntu pdf viewer might be unable to display unicode superscript. DEFAULT: "Discharge HQ [m <sup>3</sup> /s]"
<code>PPcol</code>	Plotting Position point colors, vector of length two for Weibull and Gringorton, recycled. PP are not used for fitting distributions, but for plotting only. DEFAULT: "black"
<code>PPpch</code>	point characters for plotting positions after Weibull and Gringorton, respectively. NA to suppress in plot and legend. DEFAULT: c(16,3)
<code>PPcex</code>	Character EXPansion of plotting points. DEFAULT: 1
<code>distcols</code>	Color for each distribution added with <code>lines</code> . Recycled, if necessary. DEFAULT: <code>rainbow2</code>
<code>lty</code>	Line TYpe for plotted distributions. Is recycled to from a vector of length nbest, i.e. a value for each dist. DEFAULT: 1
<code>lwd</code>	Line WiDth of distribution lines. Recycled vector of length nbest. DEFAULT: 1
<code>pch</code>	Point CHaracter of points added at regular intervals. This makes lines more distinguishable from each other. NA to suppress. Recycled vector of length nbest. DEFAULT: NA
<code>cex</code>	if pch != NA, size of points. Recycled vector of length nbest. DEFAULT: 1
<code>n_pch</code>	Number of points spread evenly along the line. Recycled vector of length nbest. DEFAULT: 15
<code>legend</code>	Logical. Add a legend? DEFAULT: TRUE
<code>rmse</code>	Integer. If rmse > 0, RMSE values are added to legend. They are rounded to rmse digits. DEFAULT: 4
<code>legargs</code>	list of arguments passed to <code>legend</code> except for legend, col, pch, lwd, lty. DEFAULT: NULL
<code>quiet</code>	Suppress notes? DEFAULT: FALSE
<code>...</code>	Further arguments passed to <code>plot</code> like <code>yaxt="n"</code> , ...

**Value**

invisible dlf object, see [printL](#)

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, March 2015, updated heavily Aug 2015

**See Also**

[distExtreme](#), [plotLfit](#)

**Examples**

```
#see
?distExtreme
```

**plotLfit**

*Plot distributions fitted with L-moments*

**Description**

Plot histogram and distribution densities *or* ecdf with cumulated probability

**Usage**

```
plotLfit(dlf, nbest = 5, selection = NULL, order = TRUE, rmse = 4,
         cdf = FALSE, log = FALSE, supportends = TRUE, breaks = 20,
         xlim = extendrange(dlf$dat, f = 0.15), ylim = NULL, col = "grey",
         main = paste(if (cdf) "Cumulated", "density distributions of", dlf$datname),
         xlab = dlf$datname, ylab = if (cdf) "(Empirical) Cumulated Density (CDF)"
         else "Probability Density Function (PDF)", las = 1,
         distcols = berryFunctions::rainbow2(nbest), lty = 1, add = FALSE,
         logargs = NULL, legend = TRUE, legargs = NULL, histargs = NULL, ...)
```

**Arguments**

<b>dlf</b>	List as returned by <a href="#">distLfit</a> , containing the elements <code>dat</code> , <code>parameter</code> , <code>gof</code> , <code>datname</code>
<b>nbest</b>	Number of distributions plotted, in order of goodness of fit. DEFAULT: 5
<b>selection</b>	Names of distributions in <code>dlf\$parameter</code> that will be drawn. Overrides <code>nbest</code> . DEFAULT: NULL
<b>order</b>	Logical: order legend and colors by RMSE, even if <code>dlf\$gof</code> is unordered or selection is given? DEFAULT: TRUE
<b>rmse</b>	Integers. If <code>rmse != 0</code> , RMSE values are added to legend. They are rounded to <code>rmse</code> digits. DEFAULT: 4
<b>cdf</b>	If TRUE, plot cumulated DF instead of probability density. DEFAULT: FALSE

<code>log</code>	If TRUE, logAxis is called. Only makes sense if dlf\$dat is already logarithmic and ranges eg. from -2 to 3. DEFAULT: FALSE
<code>supportends</code>	If TRUE, dots are placed at the support bounds. DEFAULT: TRUE
<code>breaks</code>	<code>hist</code> breaks. DEFAULT: 20
<code>xlim, ylim</code>	<code>hist</code> or <code>ecdf</code> axis limits.
<code>col</code>	<code>hist</code> bar color or <code>ecdf</code> point color. DEFAULT: "grey"
<code>main, xlab, ylab</code>	<code>hist</code> or <code>ecdf</code> main, xlab, ylab. DEFAULT: abstractions from dlf\$datname
<code>las</code>	Label Axis Style for orientation of numbers along axes. DEFAULT: 1
<code>distcols</code>	Color for each distribution added with <code>lines</code> . DEFAULT: <code>rainbow2</code>
<code>lty</code>	Line TYpe for plotted distributions. Recycled vector of length nbest. DEFAULT: 1
<code>add</code>	If TRUE, hist/ecdf is not called before adding lines. This lets you add lines highly customized one by one. DEFAULT: FALSE
<code>logargs</code>	List of arguments passed to <code>logAxis</code> if log=TRUE. DEFAULT: NULL
<code>legend</code>	Should <code>legend</code> be called? DEFAULT: TRUE
<code>legargs</code>	List of arguments passed to <code>legend</code> except for legend and col. DEFAULT: NULL
<code>histargs</code>	List of arguments passed to <code>hist</code> or <code>ecdf</code> except for x, freq. DEFAULT: NULL
<code>...</code>	Further arguments passed to <code>lines</code> , like type, pch, ...

## Details

By default, this plots density instead of CDF, because the distributions are easier to discern and tail behavior is easier to judge visually. See also [http://www.vosesoftware.com/ModelRiskHelp/index.htm#Presenting\\_results/Cumulative\\_plots/Relationship\\_between\\_cdf\\_and\\_density\\_\(histogram\)\\_plots.htm](http://www.vosesoftware.com/ModelRiskHelp/index.htm#Presenting_results/Cumulative_plots/Relationship_between_cdf_and_density_(histogram)_plots.htm)

## Value

invisible dlf object, see `printL`

## Author(s)

Berry Boessenkool, <berry-b@gmx.de>, Sept 2014

## See Also

`distLfit`, `plotLquantile`

## Examples

```
# See distLfit
```

---

<code>plotLquantile</code>	<i>Plot quantiles of distributions fitted with L-moments</i>
----------------------------	--------------------------------------------------------------

---

## Description

Plot quantiles of distributions fitted with L-moments

## Usage

```
plotLquantile(dlf, nbest = 5, selection = NULL, order = FALSE,
  rows = NULL, heights = stats::quantile(par("usr")[3:4], 0.2),
  distcols = dlfplot$distcols, linargs = NULL, ...)
```

## Arguments

<code>dlf</code>	List as returned by <a href="#">distLquantile</a> , containing the elements <code>dat</code> , <code>parameter</code> , <code>gof</code> , <code>datname</code> , <code>quant</code>
<code>nbest</code> , <code>selection</code> , <code>order</code>	Distributions to be plotted, see <a href="#">plotLfit</a>
<code>rows</code>	Rowname(s) of <code>dlf\$quant</code> that should be drawn instead of the selection / <code>nbest</code> highest ranking distribution functions. 'GPD*' will select all the gpd fits. <code>heights</code> and <code>distcols</code> must then accordingly have at least 13 elements (or will be recycled). DEFAULT: NULL
<code>heights</code>	Coordinates of quantile line ends, recycled if necessary. DEFAULT: 20% of plot height.
<code>distcols</code>	Color for each distribution added with <a href="#">lines</a> . DEFAULT: <code>dlfplot\$distcols</code>
<code>linargs</code>	Arguments passed to <a href="#">lines</a> . DEFAULT: NULL
...	Further arguments passed to <a href="#">plotLfit</a>

## Value

invisible `dlf` object, see [printL](#)

## Author(s)

Berry Boessenkool, <berry-b@gmx.de>, Dec 2016

## See Also

[distLquantile](#), [plotLfit](#)

## Examples

```
# See distLquantile
```

**plotLweights** *Distribution rank comparison*

## Description

Plot rank comparison of fitted distributions calculated by [distLfit](#).

## Usage

```
plotLweights(dlf, type = "o", col = RColorBrewer::brewer.pal(5, "Set2"),
  pch = c(1:4, NA), lty = 1, lwd = 1, legargs = NULL,
  main = "Distribution function GOF and weights", xlab = "Weight / RMSE",
  ylab = "", xlim = range(gof[, grep("weight", colnames(gof))]), na.rm =
  TRUE), ...)
```

## Arguments

<code>dlf</code>	List as returned by <a href="#">distLfit</a> , containing the element <code>gof</code>
<code>type, col, pch, lty, lwd</code>	Vectors with 5 values for line customization. Recycled if necessary.
<code>legargs</code>	List of arguments passed to <a href="#">legend</a> , like <code>cex</code> , <code>bg</code> , etc.
<code>main, xlab, ylab</code>	plot title and axis labels
<code>xlim</code>	Range of x axis. DEFAULT: <code>range(gof\$weight*)</code>
<code>...</code>	Further arguments passed to <a href="#">plot</a> .

## Value

None.

## Author(s)

Berry Boessenkool, <berry-b@gmx.de>, Sept 2014

## See Also

[distLweights](#), [distLfit](#)

## Examples

```
# see distLweights and distLfit
```

<code>printL</code>	<i>print dlf objects</i>
---------------------	--------------------------

## Description

print list objects created in this package

## Usage

```
printL(dlf, digits = 1)
```

## Arguments

<code>dlf</code>	List as explained in section Details
<code>digits</code>	number of digits rounded to. DEFAULT: 1

## Details

The common object to share between functions (see overview in [extremeStat](#)) is a list with the following elements:

<code>dat</code>	numeric vector with (extreme) values, with all NAs and values below threshold removed
<code>dat_full</code>	original input data complete with NAs
<code>datname</code>	character string for main, xlab etc
<code>parameter</code>	list (usually of length 17 if speed=TRUE in <a href="#">distLfit</a> ) with parameters of each distribution
<code>gof</code>	dataframe with 'Goodness of Fit' measures, sorted by RMSE of theoretical and empirical cumulated
<code>distnames</code>	character vector with selected distribution names
<code>distfailed</code>	Names of nonfitted distributions or ""
<code>distcols</code>	colors for distnames (for plotting). If not given manually, determined by <code>berryFunctions::rainbow</code>
<code>distselector</code>	character string with function name creating the selection
<code>truncate, threshold</code>	Truncation percentage and threshold value, relevant for <a href="#">distLquantile</a>

optionally, it can also contain:

<code>returnlev, npy</code>	dataframe with values of distributions for given return periods (RPs), number
<code>RPweibull, RPgringorton</code>	Return periods according to plotting positions, added in <a href="#">plotLextreme</a>
<code>quant</code>	Quantile estimates from <a href="#">distLquantile</a>
<code>exBootRPs, qexBootSim, exBootCI, exBootCL</code>	objects from <a href="#">distLexBoot</a>

## Value

none, prints via [message](#).

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, Sept 2014, March + July 2015, Dec 2016

**See Also**

[extremeStat](#)

**Examples**

```
# see
?distExtreme
```

quantGPD

*Fast GPD quantile estimate*

**Description**

Fast GPD quantile estimate through L-moments

**Usage**

```
quantGPD(x, probs = c(0.8, 0.9, 0.99), truncate = 0,
          threshold = berryFunctions::quantileMean(x, truncate), addn = TRUE,
          quiet = FALSE, ...)
```

**Arguments**

x	Vector with numeric values. NAs are silently ignored.
probs	Probabilities. DEFAULT: c(0.8,0.9,0.99)
truncate, threshold	Truncation proportion or threshold. DEFAULT: 0, computed See <a href="#">q_gpd</a> .
addn	Logical: add element with sample size (after truncation). DEFAULT: TRUE
quiet	Should messages from this function be suppressed? DEFAULT: FALSE
...	Further arguments passed to <code>lmomco::pargpa</code>

**Value**

Vector with quantiles

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, Jun 2017

## See Also

[q\\_gpd](#) for a comparison across R packages and methods, [distLquantile](#) to compare distributions

## Examples

```

data(annMax)
quantile(annMax, 0.99)
quantGPD(annMax, 0.99)

## Not run: # Excluded from CRAN checks to reduce checking time
data(rain, package="ismev"); rain <- rain[rain>0]
hist(rain, breaks=50, col=7)
tr <- seq(0,0.999, len=50)
qu <- pbapply:::pbsapply(tr, quantGPD, x=rain, probs=c(0.9,0.99,0.999) ) # 30 s
plot(tr, qu[3,], ylim=range(rain), las=1, type="l")
lines(tr, qu[2,], col=2); lines(tr, qu[1,], col=4)

tr <- seq(0.88,0.999, len=50)
qu <- pbapply:::pbsapply(tr, quantGPD, x=rain, probs=c(0.9,0.99,0.999) ) # 5 s
plot(tr, qu[3,], ylim=range(rain), las=1, type="l")
lines(tr, qu[2,], col=2); lines(tr, qu[1,], col=4);
tail(qu["n",])

library(microbenchmark)
data(rain, package="ismev"); rain <- rain[rain>0]
mb <- microbenchmark(quantGPD(rain[1:200], truncate=0.8, probs=0.99, addn=F),
distLquantile(rain[1:200], sel="gpa", emp=F, truncate=0.8, quiet=T, probs=0.99)[1,1]
)
boxplot(mb)
# since computing the lmoments takes most of the computational time,
# there's not much to optimize in large samples like n=2000

## End(Not run)

```

**q\_gpd**

*GPD quantile of sample*

## Description

Compute quantile of General Pareto Distribution fitted to sample by peak over threshold (POT) method using threshold from truncation proportion, comparing several R packages doing this

## Usage

```

q_gpd(x, probs = c(0.8, 0.9, 0.99), truncate = 0,
      threshold = berryFunctions:::quantileMean(x, truncate),
      package = "extRemes", method = NULL, list = FALSE,

```

```
undertruncNA = TRUE, quiet = FALSE, ttquiet = quiet, efquiet = quiet,
...)
```

## Arguments

<code>x</code>	Vector with numeric values. NAs are silently ignored.
<code>probs</code>	Probabilities of truncated (Peak over threshold) quantile. DEFAULT: c(0.8,0.9,0.99)
<code>truncate</code>	Truncation percentage (proportion of sample discarded). DEFAULT: 0
<code>threshold</code>	POT cutoff value. If you want correct percentiles, set this only via truncate, see Details. DEFAULT: <code>quantileMean(x, truncate)</code>
<code>package</code>	Character string naming package to be used. One of c("lmomco","evir","evd","extRemes","fExtremes","ismev"). DEFAULT: "extRemes"
<code>method</code>	method passed to the fitting function, if applicable. Defaults are internally specified (See Details), depending on package, if left to the DEFAULT: NULL.
<code>list</code>	Return result from the fitting function with the quantiles added to the list as element <code>quant</code> and some information in elements starting with <code>q_gpd_</code> . DEFAULT: FALSE
<code>undertruncNA</code>	Return NAs for probs below truncate? Highly recommended to leave this at the DEFAULT: TRUE
<code>quiet</code>	Should messages from this function be suppressed? DEFAULT: FALSE
<code>ttquiet</code>	Should truncation!=threshold messages from this function be suppressed? DEFAULT: quiet
<code>efquiet</code>	Should warnings in function calls to the external packages be suppressed via <code>options(warn=-1)</code> ? The usual type of warning is: NAs produced in log(...). DEFAULT: quiet
<code>...</code>	Further arguments passed to the fitting function listed in section Details.

## Details

Depending on the value of "package", this fits the GPD using

```
lmomco::pargpa
evir::gpd
evd::fpot
extRemes::fevd
fExtremes::gpdFit
ismeav::gpd.fit
Renext::Renouv or Renext::FGPD
```

The method defaults (and other possibilities) are

lmomco: none, only L-moments

evir: "pwm" (probability-weighted moments), or "ml" (maximum likelihood)

evd: none, only Maximum-likelihood fitting implemented

extRemes: "MLE", or "GMLE", "Bayesian", "Lmoments"

fExtremes: "pwm", or "mle"

ismev: none, only Maximum-likelihood fitting implemented  
 Renext: "r" for [Renouv](#) (since distname.y = "gpd", evd::fpot is used), or 'f' for [fGPD](#) (with minimum POTs added)

The Quantiles are always given with probs in regard to the full (uncensored) sample. If e.g. truncate is 0.90, the distribution function is fitted to the top 10% of the sample. The 95th percentile of the full sample is equivalent to the 50% quantile of the subsample actually used for fitting. For computation, the probabilities are internally updated with  $p2=(p-t)/(1-t)$  but labeled with the original p. If you truncate 90% of the sample, you cannot compute the 70th percentile anymore, thus under truncNA should be left to TRUE.

If not exported by the packages, the quantile functions are extracted from their source code (Nov 2016).

## Value

Named vector of quantile estimates for each value of probs,  
 or if(list): list with element q\_gpd\_quant and info-elements added. q\_gpd\_n\_geq is number of values greater than or equal to q\_gpd\_threshold. gt is only greater than.

## Author(s)

Berry Boessenkool, <berry-b@gmx.de>, Feb 2016

## References

<http://stackoverflow.com/q/27524131>, <http://stats.stackexchange.com/q/129438>

## See Also

[distLquantile](#) which compares results for all packages  
 Other related packages (not implemented):  
<https://cran.r-project.org/package=gPdtest>  
<https://cran.r-project.org/package=actuar>  
<https://cran.r-project.org/package=fitdistrplus>  
<https://cran.r-project.org/package=lmom>

## Examples

```
data(annMax)
q_gpd(annMax)
q_gpd(annMax, truncate=0.6)
q_gpd(annMax, truncate=0.85)
q_gpd(annMax, truncate=0.91)

q_gpd(annMax, package="evir")
q_gpd(annMax, package="evir", method="ml")
q_gpd(annMax, package="evd")
q_gpd(annMax, package="extRemes")
```

```

q_gpd(annMax, package="extRemes", method="GMLE")
#q_gpd(annMax, package="extRemes", method="Bayesian") # computes a while
q_gpd(annMax, package="extRemes", method="Lmoments")
q_gpd(annMax, package="extRemes", method="nonsense") # NAs
q_gpd(annMax, package="fExtremes") # log warnings
q_gpd(annMax, package="fExtremes", efquiet=TRUE) # silenced warnings
q_gpd(annMax, package="fExtremes", method= "mle")
q_gpd(annMax, package="ismev")
q_gpd(annMax, package="Renext")
q_gpd(annMax, package="Renext", method="f")
berryFunctions::is.error(q_gpd(annMax, package="nonsense"), force=TRUE)

# compare all at once with
d <- distLquantile(annMax); d
# d <- distLquantile(annMax, speed=FALSE); d # for Bayesian also

q_gpd(annMax, truncate=0.85, package="evd") # Note about quantiles
q_gpd(annMax, truncate=0.85, package="evir")
q_gpd(annMax, truncate=0.85, package="evir", quiet=TRUE) # No note
q_gpd(annMax, truncate=0.85, package="evir", undertruncNA=FALSE)

q_gpd(annMax, truncate=0.85, package="evir", list=TRUE)
str( q_gpd(annMax, truncate=0.85, probs=0.6, package="evir", list=TRUE) )# NAs
str( q_gpd(annMax, package="evir", list=TRUE) )
str( q_gpd(annMax, package="evd", list=TRUE) )
str( q_gpd(annMax, package="extRemes", list=TRUE) )
str( q_gpd(annMax, package="fExtremes", list=TRUE) )
str( q_gpd(annMax, package="ismev", list=TRUE) )
str( q_gpd(annMax, package="Renext", list=TRUE) )

q_gpd(annMax, package="evir", truncate=0.9, method="ml") # NAs (MLE fails often)

trunc <- seq(0,0.9,len=500)
library("pbapply")
quant <- pbsapply(trunc, function(tr) q_gpd(annMax, pack="evir", method = "pwm",
                                         truncate=tr, quiet=TRUE))
quant <- pbsapply(trunc, function(tr) q_gpd(annMax, pack="lmomco", truncate=tr, quiet=TRUE))
plot(trunc, quant["99%",], type="l", ylim=c(80,130), las=1)
lines(trunc, quant["90%",])
lines(trunc, quant["80%",])
plot(trunc, quant["RMSE"], type="l", las=1)

## Not run:
## Not run in checks because simulation takes too long

trunc <- seq(0,0.9,len=200)
dlfs <- pblapply(trunc, function(tr) distLfit(annMax, truncate=tr, quiet=TRUE, order=FALSE))
rmses <- sapply(dlfs, function(x) x$gof$RMSE)
plot(trunc, trunc, type="n", ylim=range(rmses,na.rm=TRUE), las=1, ylab="rmse")
cols <- rainbow2(17)[rank(rmses[,1])]
for(i in 1:17) lines(trunc, rmses[i,], col=cols[i])

dlfs2 <- lapply(0:8/10, function(tr) distLfit(annMax, truncate=tr, quiet=TRUE))

```

```

pdf("dummy.pdf")
dummy <- sapply(dlfs2, function(x)
{plotLfit(x, cdf=TRUE, main=x$truncate, ylim=0:1, xlim=c(20,135), nbest=1)
title(sub=round(x$gof$RMSE[1],4))
})
dev.off()

# truncation effect
mytruncs <- seq(0, 0.9, len=150)
oo <- options(show.error.messages=FALSE, warn=-1)
myquants <- sapply(mytruncs, function(t) q_gpd(annMax, truncate=t, quiet=TRUE))
options(oo)
plot(1, type="n", ylim=range(myquants, na.rm=TRUE), xlim=c(0,0.9), las=1,
     xlab="truncated proportion", ylab="estimated quantiles")
abline(h=quantileMean(annMax, probs=c(0.8,0.9,0.99)))
for(i in 1:3) lines(mytruncs, myquants[i,], col=i)
text(0.3, c(87,97,116), rownames(myquants), col=1:3)

# Underestimation in small samples
# create known population:
dat <- extRemes::revd(1e5, scale=50, shape=-0.02, threshold=30, type="GP")
op <- par(mfrow=c(1,2), mar=c(2,2,1,1))
hist(dat, breaks=50, col="tan")
berryFunctions::logHist(dat, breaks=50, col="tan")
par(op)

# function to estimate empirical and GPD quantiles from subsamples
samsizeeffect <- function(n, nrep=30, probs=0.999, trunc=0.5, Q=c(0.4,0.5,0.6))
{
res <- replicate(nrep, {
subsample <- sample(dat, n)
qGPD <- q_gpd(subsample, probs=probs, truncate=trunc)
qEMP <- berryFunctions::quantileMean(subsample, probs=probs, truncate=trunc)
c(qGPD=qGPD, qEMP=qEMP)})
apply(res, MARGIN=1, berryFunctions::quantileMean, probs=Q)
}

# Run and plot simulations
samplesize <- c(seq(20, 150, 10), seq(200,800, 100))
results <- pbapply::pbapply(samplesize, samsizeeffect)
res <- function(row, col) sapply(results, function(x) x[row,col])
berryFunctions::ciBand(yu=res(3,1),yl=res(1,1),ym=res(2,1),x=samplesize,
  main="99.9% Quantile underestimation", xlab="subsample size", ylim=c(200,400), colm=4)
berryFunctions::ciBand(yu=res(3,2),yl=res(1,2),ym=res(2,2),x=samplesize, add=TRUE)
abline(h=berryFunctions::quantileMean(dat, probs=0.999))
text(300, 360, "empirical quantile of full sample")
text(300, 340, "GPD parametric estimate", col=4)
text(300, 300, "empirical quantile estimate", col="green3")

## End(Not run) # end of dontrun

```

**q\_weighted***Compute weighted averages of quantile estimates***Description**

Compute weighted averages of quantile estimates

**Usage**

```
q_weighted(quant, weights = distLweights(quant, ...), onlyc = FALSE, ...)
```

**Arguments**

quant	Data.frame as in <a href="#">distLquantile</a> output.
weights	Data.frame as in <a href="#">distLweights</a> output.
onlyc	Logical: only return custom weighted quantile estimates as a vector? Useful to add those to existing results. See examples. DEFAULT: FALSE
...	Arguments passed to <a href="#">distLweights</a> like weightc, onlydn=FALSE. order will be ignored, as q_weighted only adds/changes the rows weighted*.

**Value**

data.frame with rows "weighted\*" added.

**Author(s)**

Berry Boessenkool, <berry-b@gmx.de>, Dec 2016

**See Also**

[distLquantile](#)

**Examples**

```
x <- data.frame(A=1:5, RMSE=runif(5))
distLweights(x, onlydn=FALSE)

q_weighted(x, onlydn=FALSE)
q_weighted(x, distLweights(x, weightc=c("1"=3, "3"=5), order=FALSE, onlydn=FALSE) )

x <- rexp(190)
d <- distLquantile(x)
d2 <- q_weighted(d)
stopifnot(all(d==d2, na.rm=TRUE))

# fast option for adding custom weighted estimates:
cw <- runif(17)
names(cw) <- c("exp", "gam", "gev", "glo", "gno", "gpa", "gum", "kap", "lap",
```

```

    "ln3", "nor", "pe3", "ray", "revgum", "rice", "wak", "wei")
dw <- distLweights(d, weightc=cw)
qw1 <- q_weighted(d, weightc=cw); qw1
qw2 <- q_weighted(d, weights=dw); qw2
stopifnot(all(qw1==qw2, na.rm=TRUE))
q_weighted(d, weights=dw, onlyc=TRUE)
q_weighted(d, weights=data.frame(weightc=cw), onlyc=TRUE)

## Not run: # time consuming
system.time(pbreplicate(5000, q_weighted(d, weightc=cw)))           # 8.5 secs
system.time(pbreplicate(5000, q_weighted(d, weights=dw, onlyc=TRUE))) # 0.8 secs

## End(Not run)

```

weightp

*distribution weights***Description**

Weights for weighted average as in the submission of revisions for the paper <http://www.nat-hazards-earth-syst-sci-net/nhess-2016-183/>

**Format**

named num [1:17]

**Source**

See paper revisions (not yet online at moment of extremeStat update) (<berry-b@gmx.de>)

**Examples**

```

data(weightp)
data.frame(weightp)
barplot(weightp, horiz=TRUE, las=1)
stopifnot( all.equal(sum(weightp), 1) )

data(annMax) ; data(weightp)
dlf <- distLfit(annMax, weightc=weightp)
dlf$gof
quant <- distLquantile(annMax, weightc=weightp)
quant

```

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