

# Package ‘distfromq’

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**Title** Reconstruct a Distribution from a Collection of Quantiles

**Version** 1.0.4

**Description** Given a set of predictive quantiles from a distribution, estimate the distribution and create ``d``, ``p``, ``q``, and ``r`` functions to evaluate its density function, distribution function, and quantile function, and generate random samples. On the interior of the provided quantiles, an interpolation method such as a monotonic cubic spline is used; the tails are approximated by a location-scale family.

**License** GPL (>= 3)

**URL** <http://reichlab.io/distfromq/>

**Imports** checkmate, purrr, splines, stats, utils, zeallot

**Suggests** dplyr, ggplot2, knitr, rmarkdown, testthat (>= 3.0.0)

**VignetteBuilder** knitr

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duplicated_tol	<i>Identify duplicated values in a sorted numeric vector, where comparison is up to a specified numeric tolerance. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.</i>
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**Description**

Identify duplicated values in a sorted numeric vector, where comparison is up to a specified numeric tolerance. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.

**Usage**

```
duplicated_tol(x, tol = 1e-06, incl_first = FALSE)
```

**Arguments**

- x                    a numeric vector in which to identify duplicates
- tol                  numeric tolerance for identifying duplicates
- incl\_first          boolean indicator of whether or not the first entry in a run of duplicates should be indicated as a duplicate. FALSE mirrors the behavior of the base R function duplicated.

**Value**

a boolean vector of the same length as x

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get_dup_run_inds	<i>Get indices of starts and ends of runs of duplicate values</i>
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**Description**

Get indices of starts and ends of runs of duplicate values

**Usage**

```
get_dup_run_inds(dups)
```

**Arguments**

dups	a boolean vector that would result from calling duplicated_tol(..., incl_first = FALSE)
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**Value**

named list with entries starts giving indices of the first element in each sequence of runs of duplicate values and ends giving indices of the last element in each sequence of runs of duplicate values.

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make_d_fn	<i>Creates a function that evaluates the probability density function of an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.</i>
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**Description**

Creates a function that evaluates the probability density function of an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.

**Usage**

```
make_d_fn(
  ps,
  qs,
  interior_method = "spline_cdf",
  interior_args = list(),
  tail_dist = "norm",
  dup_tol = 1e-06,
  zero_tol = 1e-12
)
```

**Arguments**

ps	vector of probability levels
qs	vector of quantile values corresponding to ps
interior_method	method for interpolating the distribution on the interior of the provided qs. This package provides one method for this, "spline_cdf". The user may also provide a custom function; see the details for more.
interior_args	an optional named list of arguments that are passed on to the interior_method
tail_dist	name of parametric distribution for the tails
dup_tol	numeric tolerance for identifying duplicated values indicating a discrete component of the distribution. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.
zero_tol	numeric tolerance for identifying values in qs that are (approximately) zero.

**Details**

The default interior\_method, "spline\_cdf", represents the distribution as a sum of a discrete component at any points where there are duplicated qs for multiple different ps and a continuous component that is estimated by using a monotonic cubic spline that interpolates the provided (q, p) pairs as an estimate of the CDF. The density function is then obtained by differentiating this estimate of the CDF.

Optionally, the user may provide another function that accepts arguments ps, qs, tail\_dist, and fn\_type (which will be either "d", "p", or "q"), and optionally additional named arguments to be specified via interior\_args. This function should return a function with arguments x, log that evaluates the pdf or its logarithm.

**Value**

a function with arguments x and log that can be used to evaluate the approximate density function (or its log) at the points x.

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make_p_fn	<i>Creates a function that evaluates the cumulative distribution function of an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.</i>
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**Description**

Creates a function that evaluates the cumulative distribution function of an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.

**Usage**

```
make_p_fn(
  ps,
  qs,
  interior_method = "spline_cdf",
  interior_args = list(),
  tail_dist = "norm",
  dup_tol = 1e-06,
  zero_tol = 1e-12
)
```

**Arguments**

<code>ps</code>	vector of probability levels
<code>qs</code>	vector of quantile values corresponding to <code>ps</code>
<code>interior_method</code>	method for interpolating the distribution on the interior of the provided <code>qs</code> . This package provides one method for this, <code>"spline_cdf"</code> . The user may also provide a custom function; see the details for more.
<code>interior_args</code>	an optional named list of arguments that are passed on to the <code>interior_method</code>
<code>tail_dist</code>	name of parametric distribution for the tails
<code>dup_tol</code>	numeric tolerance for identifying duplicated values indicating a discrete component of the distribution. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.
<code>zero_tol</code>	numeric tolerance for identifying values in <code>qs</code> that are (approximately) zero.

**Details**

The default `interior_method`, `"spline_cdf"`, represents the distribution as a sum of a discrete component at any points where there are duplicated `qs` for multiple different `ps` and a continuous component that is estimated by using a monotonic cubic spline that interpolates the provided (`q`, `p`) pairs as an estimate of the CDF.

Optionally, the user may provide another function that accepts arguments `ps`, `qs`, `tail_dist`, and `fn_type` (which will be either `"d"`, `"p"`, or `"q"`), and optionally additional named arguments to be specified via `interior_args`. This function should return a function with arguments `x`, `log` that evaluates the pdf or its logarithm.

**Value**

a function with arguments `q` and `log.p` that can be used to evaluate the approximate cumulative distribution function (or its log) at the points `q`.

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make_q_fn	<i>Creates a function that evaluates the quantile function of an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.</i>
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## Description

Creates a function that evaluates the quantile function of an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.

## Usage

```
make_q_fn(
  ps,
  qs,
  interior_method = "spline_cdf",
  interior_args = list(),
  tail_dist = "norm",
  dup_tol = 1e-06,
  zero_tol = 1e-12
)
```

## Arguments

ps	vector of probability levels
qs	vector of quantile values corresponding to ps
interior_method	method for interpolating the distribution on the interior of the provided qs. This package provides one method for this, "spline_cdf". The user may also provide a custom function; see the details for more.
interior_args	an optional named list of arguments that are passed on to the interior_method
tail_dist	name of parametric distribution for the tails
dup_tol	numeric tolerance for identifying duplicated values indicating a discrete component of the distribution. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.
zero_tol	numeric tolerance for identifying values in qs that are (approximately) zero.

## Details

The default interior\_method, "spline\_cdf", represents the distribution as a sum of a discrete component at any points where there are duplicated qs for multiple different ps and a continuous component that is estimated by using a monotonic cubic spline that interpolates the provided (q, p) pairs as an estimate of the CDF. The quantile function is then obtained by inverting this estimate of the CDF.

Optionally, the user may provide another function that accepts arguments `ps`, `qs`, `tail_dist`, and `fn_type` (which will be either "d", "p", or "q"), and optionally additional named arguments to be specified via `interior_args`. This function should return a function with argument `p` that evaluates the quantile function.

### Value

a function with argument `p` that can be used to calculate quantiles of the approximated distribution at the probability levels `p`.

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<code>make_r_fn</code>	<i>Creates a function that generates random deviates from an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.</i>
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### Description

Creates a function that generates random deviates from an approximation to a distribution obtained by interpolating and extrapolating from a set of quantiles of the distribution.

### Usage

```
make_r_fn(
  ps,
  qs,
  interior_method = "spline_cdf",
  interior_args = list(),
  tail_dist = "norm",
  dup_tol = 1e-06,
  zero_tol = 1e-12
)
```

### Arguments

<code>ps</code>	vector of probability levels
<code>qs</code>	vector of quantile values corresponding to <code>ps</code>
<code>interior_method</code>	method for interpolating the distribution on the interior of the provided <code>qs</code> . This package provides one method for this, "spline_cdf". The user may also provide a custom function; see the details for more.
<code>interior_args</code>	an optional named list of arguments that are passed on to the <code>interior_method</code>
<code>tail_dist</code>	name of parametric distribution for the tails
<code>dup_tol</code>	numeric tolerance for identifying duplicated values indicating a discrete component of the distribution. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.
<code>zero_tol</code>	numeric tolerance for identifying values in <code>qs</code> that are (approximately) zero.

**Details**

The default `interior_method`, "spline\_cdf", represents the distribution as a sum of a discrete component at any points where there are duplicated `qs` for multiple different `ps` and a continuous component that is estimated by using a monotonic cubic spline that interpolates the provided (`q`, `p`) pairs as an estimate of the CDF. The quantile function is then obtained by inverting this estimate of the CDF.

Optionally, the user may provide another function that accepts arguments `ps`, `qs`, `tail_dist`, and `fn_type` (which will be either "d", "p", or "q"), and optionally additional named arguments to be specified via `interior_args`. This function should return a function with argument `p` that evaluates the quantile function.

**Value**

a function with argument `n` that can be used to generate a sample of size `n` from the approximated distribution.

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<code>mono_Hermite_spline</code>	<i>Create a <code>polySpline</code> object representing a monotonic Hermite spline interpolating a given set of points.</i>
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**Description**

Create a `polySpline` object representing a monotonic Hermite spline interpolating a given set of points.

**Usage**

```
mono_Hermite_spline(x, y, m)
```

**Arguments**

<code>x</code>	vector giving the <code>x</code> coordinates of the points to be interpolated.
<code>y</code>	vector giving the <code>y</code> coordinates of the points to be interpolated. Must be increasing or decreasing for <code>'method = "hyman"</code> .
<code>m</code>	(for <code>'splinefunH()</code> ) vector of <i>slopes</i> $m_i$ at the points $(x_i, y_i)$ ; these together determine the Hermite "spline" which is piecewise cubic, (only) <i>once</i> differentiable continuously.

**Details**

This function essentially reproduces `stats::splinefunH`, but it returns a polynomial spline object as used in the `splines` package rather than a function that evaluates the spline, and potentially makes adjustments to the input slopes `m` to enforce monotonicity.

**Value**

An object of class `polySpline` with the spline object, suitable for use with other functionality from the `splines` package.



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spline_cdf	<i>Approximate density function, CDF, or quantile function on the interior of provided quantiles by representing the distribution as a sum of a discrete part at any duplicated qs and a continuous part for which the CDF is estimated using a monotonic Hermite spline. See details for more.</i>
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## Description

Approximate density function, CDF, or quantile function on the interior of provided quantiles by representing the distribution as a sum of a discrete part at any duplicated qs and a continuous part for which the CDF is estimated using a monotonic Hermite spline. See details for more.

## Usage

```
spline_cdf(ps, qs, tail_dist, fn_type = c("d", "p", "q"), n_grid = 20)
```

## Arguments

ps	vector of probability levels
qs	vector of quantile values corresponding to ps
tail_dist	name of parametric distribution for the tails
fn_type	the type of function that is requested: "d" for a PDF, "p" for a CDF, or "q" for a quantile function.
n_grid	grid size to use when augmenting the input qs to obtain a finer grid of points along which we form a piecewise linear approximation to the spline. n_grid evenly-spaced points are inserted between each pair of consecutive values in qs. The default value is 20. This can be set to NULL, in which case the piecewise linear approximation is not used. This is not recommended if the fn_type is "q".

## Details

The CDF of the continuous part of the distribution is estimated using a monotonic degree 3 Hermite spline that interpolates the quantiles after subtracting the discrete distribution and renormalizing. In theory, an estimate of the quantile function could be obtained by directly inverting this spline. However, in practice, we have observed that this can suffer from numerical problems. Therefore, the default behavior of this function is to evaluate the "stage 1" CDF estimate corresponding to discrete point masses plus monotonic spline at a fine grid of points, and use the "stage 2" CDF estimate that linearly interpolates these points with steps at any duplicated q values. The quantile function estimate is obtained by inverting this "stage 2" CDF estimate. When the distribution is continuous, we can obtain an estimate of the PDF by differentiating the CDF estimate, resulting in a discontinuous "histogram density". The size of the grid can be specified with the n\_grid argument. In settings where it is desirable to obtain a continuous density function, the "stage 1" CDF estimate can be used by setting n\_grid = NULL.

**Value**

a function to evaluate the PDF, CDF, or quantile function.

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split_disc_cont_ps_qs	<i>Split ps and qs into those corresponding to discrete and continuous parts of a distribution.</i>
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**Description**

Split ps and qs into those corresponding to discrete and continuous parts of a distribution.

**Usage**

```
split_disc_cont_ps_qs(
  ps,
  qs,
  dup_tol = 1e-06,
  zero_tol = 1e-12,
  is_hurdle = FALSE
)
```

**Arguments**

ps	vector of probability levels
qs	vector of quantile values corresponding to ps
dup_tol	numeric tolerance for identifying duplicated values indicating a discrete component of the distribution. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as duplicates even if not all values in the run are within the tolerance.
zero_tol	numeric tolerance for identifying values in qs that are (approximately) zero.
is_hurdle	boolean indicating whether or not this is a hurdle model. If so, qs of zero always indicate the presence of a point mass at 0. In this case, 0 is not included among the returned cont_qs. Setting this argument to TRUE is primarily appropriate when we are working with a distributional family that is bounded above 0 (and may have density 0 at 0) such as a lognormal.

**Value**

named list with the following entries:

- `disc_weight`: estimated numeric weight of the discrete part of the distribution.
- `disc_ps`: estimated probabilities of discrete components. May be `numeric(0)` if there are no estimated discrete components.
- `disc_qs`: locations of discrete components, corresponding to duplicated values in the input qs. May be `numeric(0)` if there are no discrete components.

- `cont_ps`: probability levels for the continuous part of the distribution
- `cont_qs`: quantile values for the continuous part of the distribution
- `disc_ps_range`: a list of length equal to the number of point masses in the discrete distribution. Each entry is a numeric vector of length two with the value of the CDF approaching the point mass from the left and from the right.

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<code>step_interp_factory</code>	<i>A factory that returns a function that performs linear interpolation, allowing for "steps" or discontinuities.</i>
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### Description

A factory that returns a function that performs linear interpolation, allowing for "steps" or discontinuities.

### Usage

```
step_interp_factory(x, y, cont_dir = c("right", "left"), increasing = TRUE)
```

### Arguments

<code>x</code>	numeric vector with the "horizontal axis" coordinates of the points to interpolate.
<code>y</code>	numeric vector with the "vertical axis" coordinates of the points to interpolate.
<code>cont_dir</code>	at steps or discontinuities, the direction from which the function is continuous. This will be "right" for a CDF or "left" for a QF.
<code>increasing</code>	boolean indicating whether the function is increasing or decreasing. Only used in the degenerate case where there is only one unique value of <code>x</code> .

### Value

a function with argument `x` that performs linear approximation of the input data points.

---

<code>unique_tol</code>	<i>Get unique values in a sorted numeric vector, where comparison is up to a specified numeric tolerance. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as corresponding to a single unique value even if not all values in the run are within the tolerance.</i>
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---

### Description

Get unique values in a sorted numeric vector, where comparison is up to a specified numeric tolerance. If there is a run of values where each consecutive pair is closer together than the tolerance, all are labeled as corresponding to a single unique value even if not all values in the run are within the tolerance.

**Usage**

```
unique_tol(x, tol = 1e-06, ties = mean)
```

**Arguments**

x	a numeric vector in which to identify duplicates
tol	numeric tolerance for identifying duplicates
ties	a function that is used to summarize groups of values that fall within the tolerance

**Value**

a numeric vector of the unique values in x

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