

# Package ‘robsurvey’

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**Type** Package

**Title** Robust Survey Statistics Estimation

**Version** 0.1.1

**Description** Multiple functions to compute robust survey statistics. The package supports the computations of robust means, totals, and ratios. Available methods are Huber M-estimators, trimming, and winsorization. The package ‘robsurvey’ complements the ‘survey’ package. The package additionally includes a weighted version of the resistant line function of base R (line()), as well as two median based simple regression estimators. The methods are described in Hulliger (1995)

<<https://www150.statcan.gc.ca/n1/en/catalogue/12-001-X199500114407/>>.

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**URL** <https://github.com/martinSter/robsurvey>

**BugReports** <https://github.com/martinSter/robsurvey/issues>

**Encoding** UTF-8

**LazyData** true

**Depends** R (>= 3.5.0)

**Imports** grDevices, stats, survey (>= 3.35-1)

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**VignetteBuilder** knitr

**NeedsCompilation** yes

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huberwgt	<i>Huber M-estimators of the weighted mean and weighted total</i>
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### Description

Weighted Huber M-estimators of the mean and total are available in two forms:

- **bare-bone** functions: `weighted_mean_huber` and `weighted_total_huber`,
- estimation **methods**: `svymean_huber` and `svytotal_huber` (incl. variance estimation based on the functionality of the **survey** package).

### Usage

```
weighted_mean_huber(x, w, k = 1.5, type = "rht", info = FALSE,
  na.rm = FALSE, ...)
```

```
weighted_total_huber(x, w, k = 1.5, type = "rht", info = FALSE,
  na.rm = FALSE, ...)
```

```
svymean_huber(x, design, k = 1.5, type = "rht", ...)
```

```
svytotal_huber(x, design, k = 1.5, ...)
```

### Arguments

- |   |   |
|---|---|
| x | a numeric vector ( <code>weighted.[total/mean].huber</code> or <code>weighted.[total/mean].huber</code> );<br>a formula object or variable name ( <code>svymean_huber</code> or <code>svytotal_huber</code> ) |
| w | a numeric vector of weights   |
| k | a robustness tuning constant, $k$ in $[0, \infty)$  |

type	type of estimator: "rht" (default) or "rwm"
info	logical (default: FALSE); if TRUE further estimation details are returned
na.rm	a logical value indicating whether NA values should be stripped before the computation proceeds.
...	additional arguments passed to the control object (see <a href="#">rht_control</a> )
design	a <code>survey.design</code> object (see <a href="#">svydesign</a> in <code>survey</code> )

## Details

**Overview** Robust M-estimator of the Horvitz–Thompson total or the Hajek mean

- bare-bone functions: return the estimate (no variance estimation)
- estimation methods on the basis of `survey` (incl. variance estimation)

**Type** Two types of estimation methods are available:

rht (robust) Horvitz-Thompson M-estimator of the total/mean

rwm (robust) weighted mean estimator of a Hajek-type estimator of the mean.

If the study variable  $x$  is positively correlated with the inclusion probabilities, type "rht" tends to be superior.

**Scale** M-estimators of location are not scale invariant. The unknown scale is estimated simultaneously with the estimate of location (mean or total) as the weighted median absolute deviation from the weighted median (MAD, see [weighted\\_mad](#)).

**Variance** Variance estimates of the mean or total estimator are computed as first-order linearization using the design-based-estimation capabilities available in package `survey`.

**Tuning** Additional arguments can be passed (via ...) to specify the control parameters (e.g. number of iterations, psi-function, etc.); see [rht\\_control](#) for details.

**Domain estimation** Estimates for domains can be obtained using the `svyby` wrapper in the `survey` package (see examples).

## Value

- An estimate (scalar) for `weighted.[total/mean].huber` (unless `info=TRUE`)
- An object of class `svystat.rob` for functions of the type `msvy[total/mean]`, i.e. a list including the following components: `characteristic`, `estimator`, `estimate`, `variance`, `robust`, `optim`, `residuals`, `model`, `design`, and `call`.

## Utility functions

For the methods `svymean_huber` and `svytotal_huber`, the following utility functions can be used

- `summary` gives a summary of the estimation properties
- [robweights](#) retrieves the robustness weights
- `coef`, `vcov`, `residuals`, and `fitted` retrieve the estimate, variance, residuals and fitted values, respectively

## Note

`huberwgt` is a generic name for the functions documented.

**References**

Hulliger, B. (1995). Outlier Robust Horvitz-Thompson Estimators, *Survey Methodology* 21(1): 79-87.

**See Also**

[svymean\\_trimmed](#), [svytotal\\_trimmed](#), [svymean\\_winsorized](#), [svytotal\\_winsorized](#), [weighted\\_mean\\_trimmed](#), [weighted\\_total\\_trimmed](#), [weighted\\_mean\\_winsorized](#), [weighted\\_total\\_winsorized](#)

**Examples**

```
library(survey)
data(api)
dstrat <- svydesign(id=~1, strata=~stype, weights=~pw, data=apistrat, fpc=~fpc)
svymean_huber(~api00, dstrat, k = 2)
# Domain estimates
svyby(~api00, by = ~stype, design = dstrat, svymean_huber, k = 1.34)
```

---

rht\_control

*Control function for M-estimation (tuning parameters etc.)*


---

**Description**

This function is called internally.

**Usage**

```
rht_control(acc = 1e-05, maxit = 100, psi = "Huber", ...)
```

**Arguments**

acc	numeric tolerance, stoping rule in the iterative updating scheme (default: 1e-5)
maxit	maximum number of updating iterations
psi	psi-function (Huber or asymHuber)
...	additional arguments

**Details**

Tuning parameters for [weighted\\_mean\\_huber](#), [weighted\\_total\\_huber](#), [svymean\\_huber](#), [svytotal\\_huber](#).

**Value**

List

---

robsurvey

*robsurvey: Robust survey statistics.*

---

## Description

The package robsurvey is a collection of functions for robust survey statistics.

## robsurvey functions

robust Horvitz-Thompson M-estimator of mean and total in `svymean_huber()` and `svytotal_huber()`,  
robust trimmed Horvitz-Thompson estimator of mean and total in `svymean_trimmed()` and `svytotal_trimmed()`,  
robust winsorized Horvitz-Thompson estimator of mean and total in `svymean_winsorized()` and  
`svytotal_winsorized()`, weighted median estimator in `weighted_median()`, weighted quan-  
tile estimator in `weighted_quantile()`, weighted median absolute deviation in `weighted_mad()`,  
weighted mean and total estimators in `weighted_mean()` and `weighted_total()`.

## References

Hulliger, B. (1995). Outlier Robust Horvitz-Thompson Estimators. *Survey Methodology*, 21, 79 - 87.

Hulliger, B. (2011). Main Results of the AMELI Simulation Study on Advanced Methods for Laeken Indicators. In *Proceedings of NTTS2011*, Brussels.

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robweights

*Extraction of robustness weights (M-estimators)*

---

## Description

`robweights` retrieves the robustness weights from an M-estimator of class `svyestat.rob`.

## Usage

```
robweights(object)
```

## Arguments

`object` class of type `svyestat.rob`

## Details

Extracts the robustness weights.

## Value

Vector of robustness weights

---

 trimwgt

*Weighted trimmed mean and trimmed total*


---

## Description

Weighted trimmed estimators of the mean and total are available in two forms:

- **bare-bone** functions: `weighted_mean_trimmed` and `weighted_total_trimmed`,
- estimation **methods**: `svymean_trimmed` and `svytotal_trimmed` (incl. variance estimation based on the functionality of the **survey** package).

## Usage

```
weighted_mean_trimmed(x, w, LB = 0.05, UB = 1 - LB, na.rm = FALSE)
```

```
weighted_total_trimmed(x, w, LB = 0.05, UB = 1 - LB, na.rm = FALSE)
```

```
svymean_trimmed(x, design, LB = 0.05, UB = 1 - LB, ...)
```

```
svytotal_trimmed(x, design, LB = 0.05, UB = 1 - LB, ...)
```

## Arguments

<code>x</code>	numeric vector ( <code>weighted_mean_trimmed</code> or <code>weighted_total_trimmed</code> ); a formula object or variable name ( <code>svymean_trimmed</code> or <code>svytotal_trimmed</code> )
<code>w</code>	numeric vector of weights
<code>LB</code>	lower bound of trimming, such that $0 \leq LB < UB \leq 1$
<code>UB</code>	upper bound of trimming, such that $0 \leq LB < UB \leq 1$
<code>na.rm</code>	a logical value indicating whether NA values should be stripped before the computation proceeds.
<code>design</code>	a <code>survey.design</code> object (see <a href="#">svydesign</a> in <b>survey</b> )
<code>...</code>	additional arguments (not used)

## Details

**Overview** Robust trimmed Horvitz–Thompson total or Hajek mean

- bare-bone functions: return the estimate (no variance estimation)
- estimation methods on the basis of **survey** (incl. variance estimation)

**Variance** Variance estimates of the mean or total estimator are computed as first-order linearization using the design-based-estimation capabilities available in package **survey**.

**Domain estimation** Estimates for domains can be obtained using the [svyby](#) wrapper in the **survey** package (see examples).

**Value**

Estimate (scalar) or object of class `svyestat.rob`

**Utility functions**

For the methods `svymean_trimmed` and `svytotal_trimmed`, the following utility functions can be used

- `summary` gives a summary of the estimation properties
- `robweights` retrieves the robustness weights
- `coef`, `vcov`, `residuals`, and `fitted` retrieve, respectively, the estimate, variance, residuals and fitted values

**Note**

`trimwgt` is a generic name for the functions documented.

**See Also**

[svymean\\_huber](#), [svytotal\\_huber](#), [svymean\\_winsorized](#), [svytotal\\_winsorized](#), [weighted\\_mean\\_huber](#), [weighted\\_total\\_huber](#), [weighted\\_mean\\_winsorized](#), [weighted\\_total\\_winsorized](#)

**Examples**

```
library(survey)
data(api)
dstrat <- svydesign(id=~1, strata=~stype, weights=~pw, data=apistat, fpc=~fpc)
svymean_trimmed(~api00, dstrat, LB = 0.05)
# Domain estimates
svyby(~api00, by = ~stype, design = dstrat, svymean_trimmed, LB = 0.1)
```

---

weighted\_line

*Weighted robust line fitting*

---

**Description**

`weighted_line` fits a robust line and allows weights.

**Usage**

```
weighted_line(x, y = NULL, w, na.rm = FALSE, iter = 1)
```

**Arguments**

x	a numeric vector (explanatory variable)
y	a numeric vector (response variable)
w	a numeric vector of weights
na.rm	a logical value indicating whether rows with NA values should be stripped before the computation proceeds
iter	number of iterations for enhancing the slope

**Details**

Uses different quantiles for splitting the sample than `line()`. Is based on `weighted_median()`.

**Value**

intercept and slope of the fitted line

**See Also**

[line](#)

**Examples**

```
data(cars)
weighted_line(cars$speed, cars$dist, w=rep(1, length(cars$speed)))
weighted_line(cars$speed, cars$dist, w=rep(1:10, each=5))
```

---

weighted\_mad

*Weighted median absolute deviation from the median (MAD)*

---

**Description**

`weighted_mad` computes weighted median absolute deviation from the weighted median

**Usage**

```
weighted_mad(x, w, na.rm = FALSE, constant = 1.4826)
```

**Arguments**

x	a numeric vector
w	a numeric vector of weights
na.rm	a logical value indicating whether NA values should be stripped before the computation proceeds.
constant	(scale factor, default: 1.4826)



**Details**

The weighted MAD is computed as the (normalized) weighted median of the absolute deviation from the weighted median; the median is computed as the weighted lower sample median (see [weighted\\_median](#)); the MAD is normalized to be an unbiased estimate of scale at the Gaussian core model.

**Value**

Weighted median absolute deviation from the (weighted) median

**See Also**

[weighted\\_median](#)

**Examples**

```
x <- c(0.1, 0.35, 0.05, 0.1, 0.15, 0.05, 0.2)
weighted_mad(x, x)
```

---

weighted_median	<i>Weighted median with weighted interpolation</i>
-----------------	--

---

**Description**

`weighted_median` computes a weighted median where the exact location corresponds exactly to a cumulative weight of 0.5. This yields a symmetric median.

**Usage**

```
weighted_median(x, w, na.rm = FALSE)
```

**Arguments**

<code>x</code>	a numeric vector whose weighted sample median is wanted
<code>w</code>	a numeric vector of weights
<code>na.rm</code>	a logical value indicating whether NA values should be stripped before the computation proceeds.

**Details**

Note that the `weighted_median` function delivers a symmetric median while the `weighted_quantile` function with probability 0.5 delivers the lower median. Hence, the results of these two functions will generally differ.

**Value**

weighted sample median

**See Also**[weighted\\_quantile](#)**Examples**

```
x <- c(0.1, 0.35, 0.05, 0.1, 0.15, 0.05, 0.2)
weighted_median(x, x)
```

---

weighted\_median\_line *Robust simple linear regression based on medians*

---

**Description**

For type med slopes the median individual ratios response/explanatory is used as estimator of the slope. For version ratiomed the ratio of the median crossproduct to the median of squares of the explanatory variable is used as the estimator of the slope. Survey weights may be used. Missing values are neglected.

**Usage**

```
weighted_median_line(x, y = NULL, w, type = "slopes", na.rm = FALSE)
```

**Arguments**

x	a numeric vector (explanatory variable)
y	a numeric vector (response variable)
w	a numeric vector of weights
type	either "slopes" (default) or "products"
na.rm	a logical value indicating whether rows with NA values should be stripped before the computation proceeds

**Details**

Uses `weighted_median()`. The median of slopes (`type="slopes"`) uses  $b1 = M((y - M(y, w)) / (x - M(x, w)), w)$ . The median of crossproducts by median of squares (`type="products"`) uses  $b1 = M((y - M(y, w))(x - M(x, w)), w) / M((x - M(x, w))^2, w)$ , where  $M(x, w)$  is shorthand for the function `weighted_median(x, w)`. The function allows weights and missing values.

**Value**

a vector with two components: intercept and slope

**See Also**[line](#), [weighted\\_line](#), [weighted\\_median\\_ratio](#)

**Examples**

```

x <- c(1, 2, 4, 5)
y <- c(3, 2, 7, 4)
weighted_line(y~x, w=rep(1, length(x)))
weighted_median_line(y~x, w=rep(1, length(x)))
weighted_median_line(y~x, w=rep(1, length(x)), type="prod")

data(cars)
with(cars, weighted_median_line(dist ~ speed, w=rep(1, length(dist))))
with(cars, weighted_median_line(dist ~ speed, w=rep(1, length(dist)), type="prod"))

# weighted
w <- c(rep(1,20), rep(2,20), rep(5, 10))
with(cars, weighted_median_line(dist ~ speed, w=w))
with(cars, weighted_median_line(dist ~ speed, w=w, type="prod"))

# outlier in y
cars$dist[49] <- 360
with(cars, weighted_median_line(dist ~ speed, w=w))
with(cars, weighted_median_line(dist ~ speed, w=w, type="prod"))

# outlier in x
data(cars)
cars$speed[49] <- 72
with(cars, weighted_median_line(dist ~ speed, w=w))
with(cars, weighted_median_line(dist ~ speed, w=w, type="prod"))

```

---

weighted\_median\_ratio *Weighted robust ratio based on median*

---

**Description**

A weighted median of the ratios  $y/x$  determines the slope of a regression through the origin.

**Usage**

```
weighted_median_ratio(x, y = NULL, w, na.rm = FALSE)
```

**Arguments**

x	a numeric vector (explanatory variable)
y	a numeric vector (response variable)
w	a numeric vector of (optional) weights
na.rm	a logical value indicating whether rows with NA values should be stripped before the computation proceeds

**Value**

a vector with two components: intercept and slope

**See Also**

[line](#), [weighted\\_line](#), [weighted\\_median\\_line](#)

**Examples**

```
x <- c(1,2,4,5)
y <- c(1,0,5,2)
weighted_median_ratio(y~x, w = rep(1, length(y)))
```

---

weighted_quantile	<i>Weighted lower sample quantiles</i>
-------------------	--

---

**Description**

weighted\_quantile computes the weighted lower sample quantile

**Usage**

```
weighted_quantile(x, w, probs, na.rm = FALSE)
```

**Arguments**

x	a numeric vector whose weighted sample quantiles are wanted
w	a numeric vector of weights
probs	a numeric vector of probabilities with values in [0,1]
na.rm	a logical value indicating whether NA values should be stripped before the computation proceeds.

**Details**

Weighted lower quantiles are computed using an algorithm with  $O(n * \log(n))$  in worst-case time. There exist superior algorithms; see Cormen et al. (2009, Problem 9.2).

**Value**

Weighted sample quantiles

**References**

Cormen, T.H., Leiserson, C.E., Rivest, R.L., and Stein, C. (2009): Introduction to Algorithms, 3rd ed., Cambridge: MIT Press.

**See Also**

[weighted\\_median](#)

**Examples**

```
x <- c(0.1, 0.35, 0.05, 0.1, 0.15, 0.05, 0.2)
weighted_quantile(x, x, probs = c(0.25, 0.5, 0.75))
```

---

**wgtmeantotal***Weighted total and mean (Horvitz-Thompson and Hajek estimators)*

---

**Description**

Weighted total and mean (Horvitz-Thompson and Hajek estimators)

**Usage**

```
weighted_total(x, w, na.rm = FALSE)
weighted_mean(x, w, na.rm = FALSE)
```

**Arguments**

x	a numeric vector
w	a numeric vector of weights
na.rm	a logical value indicating whether NA values should be stripped before the computation proceeds.

**Details**

-

**Value**

Estimate (scalar)

**Note**

wgtmeantotal is a generic name for the functions documented.

**Examples**

```
x <- c(0.1, 0.35, 0.05, 0.1, 0.15, 0.05, 0.2)
weighted_total(x, x)
x <- c(0.1, 0.35, 0.05, 0.1, 0.15, 0.05, 0.2)
weighted_mean(x, x)
```

winswgt

*Weighted winsorized mean and trimmed total***Description**

Weighted winsorized estimators of the mean and total are available in two forms:

- **bare-bone** functions: `weighted_mean_winsorized` and `weighted_total_winsorized`,
- estimation **methods**: `svymean_winsorized` and `svytotal_winsorized` (incl. variance estimation based on the functionality of the **survey** package).

**Usage**

```
weighted_mean_winsorized(x, w, LB = 0.05, UB = 1 - LB, na.rm = FALSE)
```

```
weighted_total_winsorized(x, w, LB = 0.05, UB = 1 - LB,
  na.rm = FALSE)
```

```
svymean_winsorized(x, design, LB = 0.05, UB = 1 - LB, ...)
```

```
svytotal_winsorized(x, design, LB = 0.05, UB = 1 - LB, ...)
```

**Arguments**

<code>x</code>	numeric vector ( <code>weighted_mean_winsorized</code> or <code>weighted_total_winsorized</code> ); a formula object or variable name ( <code>svymean_winsorized</code> or <code>svytotal_winsorized</code> )
<code>w</code>	numeric vector of weights
<code>LB</code>	lower bound of winsorizing, such that $0 \leq LB < UB \leq 1$
<code>UB</code>	upper bound of winsorizing, such that $0 \leq LB < UB \leq 1$
<code>na.rm</code>	a logical value indicating whether NA values should be stripped before the computation proceeds.
<code>design</code>	a <code>survey.design</code> object (see <a href="#">svydesign</a> in <b>survey</b> )
<code>...</code>	additional arguments (not used)

**Details**

**Overview** Robust winsorized Horvitz–Thompson total or Hajek mean

- bare-bone functions: return the estimate (no variance estimation)
- estimation methods on the basis of **survey** (incl. variance estimation)

**Variance** Variance estimates of the mean or total estimator are computed as first-order linearization using the design-based-estimation capabilities available in package **survey**.

**Domain estimation** Estimates for domains can be obtained using the `svyby` wrapper in the **survey** package (see examples).

**Value**

Estimate (scalar) or object of class `svyestat.rob`

**Utility functions**

For the methods `svymean_winsorized` and `svytotal_winsorized`, the following utility functions can be used

- `summary` gives a summary of the estimation properties
- `robweights` retrieves the robustness weights
- `coef`, `vcov`, `residuals`, and `fitted` retrieve, respectively, the estimate, variance, residuals and fitted values

**Note**

`winswgt` is a generic name for the functions documented.

**See Also**

[svymean\\_huber](#), [svytotal\\_huber](#), [svymean\\_trimmed](#), [svytotal\\_trimmed](#), [weighted\\_mean\\_huber](#), [weighted\\_total\\_huber](#), [weighted\\_mean\\_trimmed](#), [weighted\\_total\\_trimmed](#)

**Examples**

```
library(survey)
data(api)
dstrat <- svydesign(id=~1, strata=~stype, weights=~pw, data=apistat, fpc=~fpc)
svymean_winsorized(~api00, dstrat, LB = 0.05)
# Domain estimates
svyby(~api00, by = ~stype, design = dstrat, svymean_winsorized, LB = 0.1)
```

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