## Package 'bbw'

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Type Package

Title Blocked Weighted Bootstrap

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Description The blocked weighted bootstrap (BBW) is an estimation technique for use with data from two-stage cluster sampled surveys in which either prior weighting (e.g. population-proportional sampling or PPS as used in Standardized Monitoring and Assessment of Relief and Transitions or SMART surveys) or posterior weighting (e.g. as used in rapid assessment method or RAM and simple spatial sampling method or S3M surveys). The method was developed by Accion Contra la Faim, Brixton Health, Concern Worldwide, Global Alliance for Improved Nutrition, UNICEF Sierra Leone, UNICEF Sudan and Valid International. It has been tested by the Centers for Disease Control (CDC) using infant and young child feeding (IYCF) data. See Cameron et al (2008) <doi:10.1162/rest.90.3.414> for application of bootstrap to cluster samples. See Aaron et al (2016) <doi:10.1371/journal.pone.0163176> and Aaron et al (2016) <doi:10.1371/journal.pone.0162462> for application of the blocked weighted bootstrap to estimate indicators from two-stage cluster sampled surveys.

Imports car

**Depends** R (>= 3.0.1)

Suggests knitr, rmarkdown, testthat

**License** AGPL-3 **Encoding** UTF-8 **LazyData** true

RoxygenNote 6.0.1

URL https://github.com/validmeasures/bbw

BugReports https://github.com/validmeasures/bbw/issues

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#### **Description**

The blocked weighted bootstrap (BBW) is an estimation technique for use with data from two-stage cluster sampled surveys in which either prior weighting (e.g. population proportional sampling or PPS as used in Standardized Monitoring and Assessment of Relief and Transitions or SMART surveys) or posterior weighting (e.g. as used in Rapid Assessment Method or RAM and Simple Spatial Sampling Method or S3M surveys). The method was developed by Accion contra la Faim (ACF), Brixton Health, Concern Worldwide, Global Alliance for Improved Nutrition (GAIN), UNICEF Sierra Leone, UNICEF Sudan and Valid International. It has been tested by the Centers for Disease Control (CDC) using infant and young child feeding (IYCF) data.

#### Details

The bootstrap technique is summarised in this article. The BBW used in RAM and S3M is a modification to the percentile bootstrap to include blocking and weighting to account for a complex sample design.

With RAM and S3M surveys, the sample is complex in the sense that it is an unweighted cluster sample. Data analysis procedures need to account for the sample design. A blocked weighted bootstrap (BBW) can be used:

Blocked The block corresponds to the primary sampling unit (PSU = cluster). PSUs are resampled with replacement. Observations within the resampled PSUs are also sampled with replacement.

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Weighted RAM and S3M samples do not use population proportional sampling (PPS) to weight the sample prior to data collection (e.g. as is done with SMART surveys). This means that a posterior weighting procedure is required. BBW uses a "roulette wheel" algorithm to weight (i.e. by population) the selection probability of PSUs in bootstrap replicates.

In the case of prior weighting by PPS all clusters are given the same weight. With posterior weighting (as in RAM or S3M) the weight is the population of each PSU. This procedure is very similar to the fitness proportionate selection technique used in evolutionary computing.

A total of m PSUs are sampled with replacement for each bootstrap replicate (where m is the number of PSUs in the survey sample).

The required statistic is applied to each replicate. The reported estimate consists of the 0.025th (95% LCL), 0.5th (point estimate), and 0.975th (95% UCL) quantiles of the distribution of the statistic across all survey replicates.

Early versions of the BBW did not resample observations within PSUs following:

Cameron AC, Gelbach JB, Miller DL, Bootstrap-based improvements for inference with clustered errors, Review of Economics and Statistics, 2008:90;414–427 doi.org/10.1162/rest.90.3.414

and used a large number (e.g. 3999) survey replicates. Current versions of the BBW resample observations within PSUs and use a smaller number of survey replicates (e.g. n=400). This is a more computationally efficient approach

bootBW : Blocked Weighted Bootstrap

#### **Description**

The blocked weighted bootstrap (BBW) is an estimation technique for use with data from two-stage cluster sampled surveys in which either prior weighting (e.g. population proportional sampling or PPS as used in SMART surveys) or posterior weighting (e.g. as used in RAM and S3M surveys).

## Usage

bootBW(x, w, statistic, params, outputColumns, replicates = 400)

Number of bootstrap replicates

## **Arguments**

replicates

X	A data frame with primary sampling unit (PSU) in column named psu
W	A data frame with primary sampling unit (PSU) in column named psu and survey weight (i.e. PSU population) in column named pop
statistic	A function operating on data in x (see Example)
params	Parameters (named columns in x) passed to the function specified in statistic
outputColumns	Names of columns in output data frame

4 bootClassic

#### Value

```
A data frame with:

ncol = length(outputColumns)

nrow = replicates

names = outputColumns
```

## **Examples**

```
# Example function - estimate a proportion for a binary (0/1) variable):
oneP <- function(x, params) {</pre>
  v1 <- params[1]</pre>
  v1Data <- x[[v1]]
  oneP <- mean(v1Data, na.rm = TRUE)</pre>
  return(oneP)
}
# Example call to bootBW function using RAM-OP test data:
bootP <- bootBW(x = indicatorsHH,</pre>
                 w = villageData,
                 statistic = oneP,
                 params = "anc1",
                 outputColumns = "anc1",
                 replicates = 9)
# Example estimate with 95% CI:
quantile(bootP, probs = c(0.500, 0.025, 0.975), na.rm = TRUE)
```

bootClassic

bootClassic

### **Description**

Simple proportion statistics function for bootstrap estimation

#### Usage

```
bootClassic(x, params)
```

## **Arguments**

..

A data frame with primary sampling unit (PSU) in column named psu and with data column/s containing the binary variable/s (0/1) of interest with column names corresponding to params values

params

A vector of column names corresponding to the binary variables of interest contained in x

bootPROBIT 5

## Value

A numeric vector of the mean of each binary variable of interest with length equal to length(params)

## **Examples**

bootPROBIT

bootPROBIT

## Description

PROBIT statistics function for bootstrap estimation

## Usage

```
bootPROBIT(x, params, threshold = THRESHOLD)
```

## Arguments

х	A data frame with primary sampling unit (PSU) in column named psu and with data column/s containing the continuous variable/s of interest with column names corresponding to params values
params	A vector of column names corresponding to the continuous variables of interest contained in $\boldsymbol{\boldsymbol{x}}$
threshold	cut-off value for continuous variable to differentiate case and non-case

## Value

A numeric vector of the PROBIT estimate of each continuous variable of interest with length equal to length(params)

## **Examples**

6 indicatorsCH1

indicatorsCH1

Child Morbidity, Health Service Coverage, Anthropometry

## **Description**

Child indicators on morbidity, health service coverage and anthropometry calculated from survey data collected in survey conducted in 4 districts from 3 regions in Somalia.

#### Usage

indicatorsCH1

#### **Format**

A data frame with 14 columns and 3090 rows.

psu The PSU identifier. This must use the same coding system used to identify the PSUs that is used in the indicators dataset

mID The mother identifier

cID The child identifier

ch1 Diarrhoea in the past 2 weeks (0/1)

ch2 Fever in the past 2 weeks (0/1)

ch3 Cough in the past 2 weeks (0/1)

ch4 Immunisation card (0/1)

ch5 BCG immunisation (0/1)

ch6 Vitamin A coverage in the past month (0/1)

ch7 Anti-helminth coverage in the past month (0/1)

sex Sex of child

muac1 Mid-upper arm circumference in mm

muac2 Mid-upper arm circumference in mm

oedema (0/1)

#### Source

Mother and child health and nutrition survey in 3 regions of Somalia

indicatorsCH2 7

indicatorsCH2

Infant and Child Feeding Index

#### **Description**

Infant and young child feeding indicators using the infant and child feeding index (ICFI) by Arimond and Ruel. Calculated from survey data collected in survey conducted in 4 districts from 3 regions in Somalia.

## Usage

indicatorsCH2

#### **Format**

A data frame with 13 columns and 2083 rows.

psu The PSU identifier. This must use the same coding system used to identify the PSUs that is used in the indicators dataset

mID The mother identifier

cID The child identifier

ebf Exclusive breastfeeding (0/1)

cbf Continued breastfeeding (0/1)

ddd Dietary diversity (0/1)

mfd Meal frequency (0/1)

icfi Infant and child feeding index (from 0 to 6)

iycf Good IYCF

icfiProp Good ICFI

age Child's age

bf Child is breastfeeding (0/1)

bfStop Age in months child stopped breastfeeding

#### Source

Mother and child health and nutrition survey in 3 regions of Somalia

8 indicatorsHH

indicatorsHH

Mother Indicators Dataset

#### **Description**

Mother indicators for health and nutrition calculated from survey data collected in survey conducted in 4 districts from 3 regions in Somalia.

## Usage

indicatorsHH

#### **Format**

```
A data frame with 24 columns and 2136 rows:
```

psu The PSU identifier. This must use the same coding system used to identify the PSUs that is used in the indicators dataset

mID The mother identifier

mMUAC Mothers with mid-upper arm circumference < 230 mm (0/1)

anc1 At least 1 antenatal care visit with a trained health professional (0/1)

anc2 At least 4 antenatal care visits with any service provider (0/1)

anc3 FeFol coverage (0/1)

anc4 Vitamin A coverage (0/1)

wash1 Improved sources of drinking water (0/1)

wash2 Improved sources of other water (0/1)

wash3 Probable safe drinking water (0/1)

wash4 Number of litres of water collected in a day

wash5 Improved toilet facilities (0/1)

wash6 Human waste disposal practices / behaviour (0/1)

wash7a Handwashing score (from 0 to 5)

wash7b Handwashing score of 5 (0/1)

hhs1 Household hunger score (from 0 to 6)

hhs2 Little or no hunger (0/1)

hhs3 Moderate hunger (0/1)

hhs4 Severe hunger (0/1)

mfg Mother's dietary diversity score

pVitA Plant-based vitamin A-rich foods (0/1)

aVitA Animal-based vitamin A-rich foods (0/1)

xVitA Any vitamin A-rich foods (0/1)

iron Iron-rich foods (0/1)

recode 9

#### **Source**

Mother and child health and nutrition survey in 3 regions of Somalia

#### **Description**

Utility function that recodes variables based on user recode specifications. Handles both numeric or factor variables.

#### Usage

```
recode(var, recodes, afr, anr = TRUE, levels)
```

#### **Arguments**

var Variable to recode
recodes Character string of recode specifications:

- Recode specifications in a character string separated by semicolons of the form input=output as in: "1=1;2=1;3:6=2;else=NA"
- If an input value satisfies more than one specification, then the first (reading from left to right) is applied
- If no specification is satisfied, then the input value is carried over to the result unchanged
- NA is allowed on both input and output
- The following recode specifications are supported:

Specification	Example	Notes
Single values	9=NA	
Set of values	c(1,2,5)=1	The left-hand-side is any R function call that returns a vector
	seq(1,9,2)='odd'	
	1:10=1	
Range of values	7:9=3	Special values 10 and hi may be used
	lo:115=1	
Other values	else=NA	

- Character values are quoted as in:
   recodes = "c(1,2,5)='sanitary' else='unsanitary'"
- The output may be the (scalar) result of a function call as in: recodes = "999=median(var, na.rm = TRUE)"
- Users are advised to carefully check the results of recode() calls with any outputs that are the results of a function call.
- The output may be the (scalar) value of a variable as in: recodes = "999=scalarVariable"

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• If all of the output values are numeric, and if 'afr' is FALSE, then a numeric result is returned; if var is a factor then (by default) so is the result.

afr Return a factor. Default is TRUE if var is a factor and is FALSE otherwise

anr Coerce result to numeric (default is TRUE)

levels Order of the levels in the returned factor; the default is to use the sort order of

the level names.

#### Value

Recoded variable

## **Examples**

```
# Recode values from 1 to 9 to varios specifications
var <- sample(x = 1:9, size = 100, replace = TRUE)

# Recode single values
recode(var = var, recodes = "9=NA")

# Recode set of values
recode(var = var, recodes = "c(1,2,5)=1")

# Recode range of values
recode(var = var, recodes = "1:3=1;4:6=2;7:9=3")

# Recode other values
recode(var = var, recodes = "c(1,2,5)=1;else=NA")</pre>
```

villageData

Cluster Population Weights Dataset

## Description

Dataset containing cluster population weights for use in performing posterior weighting with the blocked weighted bootstrap approach. This dataset is from a mother and child health and nutrition survey conducted in 4 districts from 3 regions in Somalia.

## Usage

villageData

#### **Format**

A data frame with 6 columns and 117 rows:

region Region in Somalia from which the cluster belongs to district District in Somalia from which the cluster belongs to

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- psu The PSU identifier. This must use the same coding system used to identify the PSUs that is used in the indicators dataset
- 1on Longitude coordinate of the cluster
- lat Latitude coordinate of the cluster
- pop Population size of the cluster

## Source

Mother and child health and nutrition survey in 3 regions of Somalia

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