Package 'hmi'

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```
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Description Runs single level and multilevel imputation mod-
     els. The user just has to pass the data to the main function and, optionally, his analysis model. Ba-
     sically the package then translates this analysis model into commands to impute the data accord-
     ing to it with functions from 'mice', 'MCMCglmm' or routines build for this package.
BugReports http://github.com/matthiasspeidel/hmi/issues
Imports boot (>= 1.3-20), broom.mixed (>= 0.2.6), coda (>= 0.19-1),
     graphics (>= 3.0.0), linLIR (>= 1.1), lme4 (>= 1.1-15), MASS
     (>= 7.3-49), Matrix (>= 1.2-12), MCMCglmm (>= 2.25), mice (>=
     3.5.0), msm (>= 1.6.6), mvtnorm (>= 1.0-7), nlme (>=
     3.1-131.1), nnet (>= 7.3-12), ordinal (>= 2015.6-28), pbivnorm
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R topics documented:

*.interval	3
+.interval	4
interval	4
/.interval	5
as.data.frame.interval	5
as.interval	6
ceiling.interval	6
center_interval	7
chaincheck	7
cleanup	8
contributions4intervals	9
decompose_interval	9
	10
	11
extract_varnames	11
factors	12
	12
•	13
	13
	14
·	15
	16
	16
hmi_pool	18
•	20
	20
	22
	23
	23
	24
1 = = 0	25
	26
1 6	27
	28
1 6	29
	29
1 — — —	30
1 0	31
•	32
1 — — —	33
•	33
	34
	34
	35
	35
	36

*.interval

* in	terval Multiplication function	
Index		53
	^.interval	52
	[<interval< td=""><td>52</td></interval<>	52
	[.interval	
		51
	table	
	6-16	50
	stand	
	-1	49
	split_interval	48
	sna_interval	
	sample_imp	
	sampler	47
	round.interval	
	random_intercept_check	46
	plot.interval	45
	pbivnormX	44
	nhanes_sub	43
	nhanes_mod	41
	nhanes_imp	40
	• •	39
	negloglik	38
	Mode	
	log.interval	
	list_of_types_maker	36

Description

Function to multiply single elements or vectors (of correct dimension) to the interval object

Usage

```
## S3 method for class 'interval' interval \star x
```

Arguments

interval an object from class interval x an single element or vector for multiplication

Value

an interval object

4 -.interval

+.interval

Adding function

Description

Function to add single elements or vectors (of correct dimension) to the interval object

Usage

```
## S3 method for class 'interval'
interval + x
```

Arguments

interval an object from class interval

x an single element or vector to add to the interval object

Value

an interval object

-.interval

Subtraction function

Description

Function to subtract single elements or vectors (of correct dimension) from the interval object

Usage

```
## S3 method for class 'interval'
interval - x
```

Arguments

interval an object from class interval

x an single element or vector to subtract to the interval object

Value

an interval object

/.interval 5

/.interval

Dividing function

Description

Function to divide single elements or vectors (of correct dimension) to the interval object

Usage

```
## S3 method for class 'interval' interval / x
```

Arguments

interval an object from class interval

x an single element or vector for division

Value

an interval object

```
as.data.frame.interval
```

Transform interval objects into data.frames

Description

This function transforms interval objects into data.frames. This is not only relevant on its own, it is also needed whenever a function need objects as a data.frame (e.g. View or cbind).

Usage

```
## S3 method for class 'interval'
as.data.frame(x, ...)
```

Arguments

```
x an object of class interval.
```

... arguments to be passed to as.data.frame.

Value

a data.frame containing x as a character

6 ceiling.interval

as.interval

Function to transform objects into an interval object

Description

Function to transform numeric (or character) vectors or n times 2 matrices into an interval object

Usage

```
as.interval(x, sna = FALSE)
```

Arguments

x An object to transform. Currently the function can transform numeric vectors

and characters

sna Boolean: if TRUE, NAs are kept as standard NAs. Otherwise they are turned into

"-Inf; Inf".

Value

A vector of class interval.

See Also

```
generate_interval
```

Examples

```
as.interval(c("1000;2000", "700;700", NA))
```

ceiling.interval

Ceiling funtion for intervals

Description

Ceiling funtion for intervals

Usage

```
## S3 method for class 'interval' ceiling(x, ...)
```

Arguments

x numeric vector or interval object

... further arguments passed to ceiling.

center_interval 7

contar	interval
center	Tiller var

Function to give the center of the interval

Description

Function to give the center of the interval object

Usage

```
center_interval(interval, inf2NA = FALSE)
```

Arguments

interval an object from class interval

inf2NA logical. If TRUE, entries containing -Inf or Inf, will return NA.

Value

A numeric vector

chaincheck

Checking the chains on convergence

Description

Formally tests the Gibbs-sampling chains on convergence. After the burn in is discarded, the remaining iterations of each chain are tested following Geweke (1992). In this test, the arithmetic means and their standard errors of the first 10% and last 50% of the chain (from now on always after discarding the burn in) are compared. In case of a stationary distribution, both means have the same expected value. The difference between both arithmetic means is divided the standard error. This is the Z-score, the test statistic. Chains not passing the test will be plotted. Each plot will flag which (fixed effect or variance) parameter was tested; and what variable was to be imputed and the cycle and imputation run. To see the next plot, the user has to hit <Return> (or "Enter").

Usage

```
chaincheck(mids, alpha = 0.01, thin = 1, plot)
```

Arguments

mids A mids object generated by hmi (alternatively a list), having an element called

"gibbs" with the chains of the Gibbs-sampler runs.

alpha A numeric value between 0 and 1 for the desired significance level of the test on

convergence.

8 cleanup

thin	An integer to set the thinning in	aterval range. If thin = 1	every iteration of the
CITATI	The integer to set the timining in	ner var range. It tilli	, every neer amon or time

Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000), the geweke.diag might fail to detect convergence. In such cases it is essential to look at a chain free from autocorrelation. When setting thin = NULL, the function will use internally a thinning of max(1,round((nitt-burnin)/1000)) to get approximately 1000

iterations to be tested.

plot Logical. Shall the chains be plotted in a traceplot or not. If the number of

iterations and cycles is large, click through all traceplots can be interminable.

References

J Geweke (1992): Evaluating the accuracy of sampling based approaches to calculating posterior moments. In Bayesian Statistics 4 (ed. JB Bernando, JO Berger, AP Dawid and Adrian FM Smith) (pp. 169-193). Clarendon Press, Oxford, UK.

Description

Function to exclude (factor or interval) variables that have too many levels (as they may cause numerical problems), to change binary factors to 0-1 coding (as such factors might generate linear dependent variables) and to remove multiple intercepts.

Usage

```
cleanup(X, k = Inf)
```

Arguments

X A n times p data.frame with p fixed (or random) effects variables.

k An integer defining the allowed maximum of levels in a factor covariate.

Value

A n times (p-r) data.frame, with r being the number of variables with too many factors.

contributions4intervals 9

contributions4intervals

get the likelihood contributions of interval data

Description

This function calculates the likelihood contributions of interval data

Usage

```
contributions4intervals(lower_bounds, upper_bounds, mymean, mysd)
```

Arguments

lower_bounds a vector with the lower bounds of an interval covariate.

upper_bounds a vector with the upper bounds of an interval covariate.

mymean a numeric for the expected value of the normal distribution (which is one of the

parameters trying to be optimized so that the likelihood becomes maximized)

mysd a numeric for the standard deviation of the normal distribution (which is one of

the parameters trying to be optimized so that the likelihood becomes maximized)

Value

a vector giving the likelihood contributions of the interval data.

Description

This function decomposes an interval object up into precise observations (e.g. "1850.23;1850.23" into 1850.23), imprecise observations (e.g. "1800;1900") and missing observations ("-Inf;Inf" into NA)

Usage

```
decompose_interval(interval)
```

Arguments

interval A vector, factor or optimally an interval object of length n (if it is something

else, it is returned unchanged)

10 doubleintegral

Value

A matrix with 5 columns. 1. A column "precise" for the precise observations (length of interval = 0, e.g. "3000;3000"). If observation i is not precise, the i-th entry in this columns will be NA. c("2500;2500", "3000;4000", "-Inf;0", NA) will lead to c(2500, NA, NA, NA) 2. A column "lower" for the values of the lower bounds of the imprecise observations (length of interval > 0, e.g. "3000;4000" or "-Inf;0"), precise observations will get NAs here. c("2500;2500", "3000;4000", "-Inf;0", NA) will lead to c(NA, 3000, -Inf, NA) 3. A column "upper" for the values of the upper bounds of the imprecise observations. c("2500;2500", "3000;4000", "-Inf;0", NA) will lead to c(NA, 4000, 0, NA) 4. A column "lower_general" with the lower bound values of all observations, without distinction between precise, imprecise or missing observations. c("2500;2500", "3000;4000", "-Inf;0", NA) will lead to c(2500, 3000, -Inf, -Inf) c("2500;2500", "3000;4000", "-Inf;0", NA) will lead to c(2500, 4000, 0, Inf)

doubleintegral

Function to calculate double integrals

Description

This function is primarily build to make the function components neater.

Usage

```
doubleintegral(lower_inner, upper_inner, lower_outer, upper_outer, cdf, ...)
```

Arguments

lower_inner	The vector for the lower bound for the inner integral
upper_inner	The vector for the upper bound for the inner integral
lower_outer	The vector for the lower bound for the outer integral
upper_outer	The vector for the upper bound for the outer integral
cdf	the cumulative density function (from the class "function")
	Further arguments passed to the cdf.

Value

a vector with the value of the double integral for each observation (with an observed target variable)

exp.interval 11

exp.interval

Exp function for interval objects

Description

Exp function for interval objects

Usage

```
## S3 method for class 'interval' exp(x, ...)
```

Arguments

x numeric vector or interval object
... further arguments passed to exp.

extract_varnames

Function to extract the different elements of a formula

Description

The function searches for the target variable, fixed effects variables, if there is a cluster ID: this and the random effects variables.

The names of the fixed and random intercepts variable (if existent) are explicitly labeled In imputation models, the target variable can act as covariate for other covariates - so we treat the target variable as fix effect variable.

Usage

```
extract_varnames(
  model_formula = NULL,
  constant_variables,
  variable_names_in_data = colnames(data),
  data
)
```

Arguments

A Boolean-vector of length equal to the number of columns in the data set specifying whether a variable is a constant variable (eg. an intercept variable) or not.

variable_names_in_data

A character-vector with the column names of the data set.

data The data.frame the formula belongs to.

Value

A list with the names of the target variable, the intercept variable, the fixed and random effects covariates (which includes the name of the target variable), the variables with interactions and the cluster id variable.

If some of them don't exist, they get the value "".

factors

Function to get all factors

Description

Function to get all factors (not limited to prime factors) of an integer.

Usage

factors(x)

Arguments

Χ

A single integer; no vector.

Value

A numeric vector with the factors

References

based on stackoverflow.com/questions/6424856 "R Function for returning ALL factors" answer by Chase

fixed_intercept_check Function to check multilevel models on the existence of fixed intercepts

Description

Function to check multilevel models on the existence of fixed intercepts. The specification of an intercept by calling a 1-column (e.g. "int") is not counted towards the existence of an intercept. Contradictory inputs like " $\sim 1 + 0 + X1 + ...$ " or " $\sim -1 + 1 + X1 + ...$ " will throw an error.

Usage

```
fixed_intercept_check(model_formula)
```

Arguments

floor.interval

Value

A boolean value indicating whether there is a fixed intercept in the model or not

floor.interval

Floor function for interval objects Floor function for interval objects

Description

Floor function for interval objects Floor function for interval objects

Usage

```
## S3 method for class 'interval'
floor(x, ...)
```

Arguments

x numeric vector or interval object

... further arguments passed to floor.

Gcsemv

Exam results on the GCSE

Description

A dataset containing results on the General Certificate of Secondary Education (GCSE) exams in Great Britain for 1905 students in 73 Schools.

Usage

Gcsemv

Format

A data frame with 1905 rows and 5 variables:

school The ID of the student's school.

student The ID of the student within its school. They are not unique, different schools may have identical IDs for not identical students.

gender The gender of the student: 0 for boys and 1 for girls.

written The score in a written questionnaire.

coursework The score in a coursework.

14 generate_interval

Source

Website of the Centre for Multilevel Modelling at the University of Bristol: http://www.bristol.ac.uk/cmm/media/team/hg/msm-3rd-ed/gcsemv.xls

References

Creswell M. (1991). A Multilevel bivariate model. In R. Prosser, J. Rasbash, H. Goldstein (eds.), Data Analysis with ML3. Institute of Education, London.

Goldstein H. (2011) Multilevel Statistical Models. 4 edition. Wiley, Chichseter (UK), ISBN 978-0-470-74865-7.

generate_interval

Function to generate an interval object

Description

Function to generate transform into an interval object from numeric (or character) vectors.

Usage

```
generate_interval(lower, upper, sna = FALSE)
```

Arguments

lower a vector with the lower values of a variable upper a vector with the upper values of a variable

sna Boolean: if TRUE, NAs are kept as standard NAs. Otherwise they are turned into

"-Inf; Inf".

Value

a character vector with the lower and upper bound values.

get_type 15

get_type

Get the type of variables.

Description

Function checks of which type a variable is. The types are listed below (together with a rough summary of the classification mechanism).

- continuous (numeric values, or integers with more than 20 different values),
- semicontinuous (numeric values with more than 10% of them share the same value),
- rounded continuous (if more than 50% of the observations of a continuous variable are divisible by some rounding degrees)
- count data (integers).
- an intercept (the same value for all observations),
- binary (two different values like 0s and 1s or "m" and "f"),
- categorical (the variable is a factor or has more than 3 different values)
- ordered categorical (the categorical variable is ordered.)

Usage

```
get_type(variable, spike = NULL, rounding_degrees = c(1, 10, 100, 1000))
```

Arguments

variable A variable (vector) from your data set.

spike A numeric value, denoting the presumed spike of semi-continuous variables.

rounding_degrees

A numeric vector with the presumed rounding degrees. If the rounding_degrees are set to be NULL, the proposed rounding degrees from the function suggest_rounding_degrees are used.

Value

A character denoting the type of variable.

Examples

```
get_type(iris$Sepal.Length); get_type(iris$Species)
```

16 hmi

head.interval

Head for intervals

Description

Head function for intervals returning the first elements of an interval object

Usage

```
## S3 method for class 'interval' head(x, ...)
```

Arguments

x vector, matrix, table, data.frame or interval object

... further arguments passed to head.

hmi

hmi: Hierarchical Multilevel Imputation.

Description

The user has to pass his data to the function. Optionally he passes his analysis model formula so that hmi runs the imputation model in line with his analysis model formula.

And of course he can specify some parameters for the imputation routine (like the number of imputations and iterations and the number of iterations within the Gibbs sampling).

Usage

```
hmi(
  data,
  model_formula,
  family,
  additional_variables,
  list_of_types,
  m = 5,
  maxit,
  nitt = 22000,
  burnin = 2000,
  pvalue = 1,
  mn = 1,
  k,
  spike,
  heap,
```

hmi 17

```
rounding_degrees,
rounding_formula = ~.,
pool_with_mice = TRUE
)
```

Arguments

data A data.frame with all variables appearing in model_formula.

model_formula A formula used for the analysis model. Currently the package is designed to

handle formula used in 1m, glm, 1mer and glmer. The formula is also used for

the default pooling.

family To improve the default pooling, a family object supported by glm (resp. glmer)

an be given. See family for details.

additional_variables

A character with names of variables (separated by "+", like "x8+x9") that should be included in the imputation model as fixed effects variables, but not in the analysis model. An alternative would be to include such variable names into the model_formula and run a reduced analysis model with hmi_pool or the

functions provide by mice.

list_of_types a list where each list element has the name of a variable in the data.frame.

The elements have to contain a single character denoting the type of the variable. See get_type for details about the variable types. With the function list_of_types_maker, the user can get the framework for this object. In most scenarios this is should not be necessary. One example where it might be necessary is when only two observations of a continuous variable are left - because in this case get_type interpret is variable to be binary. Wrong is it in no case.

An integer defining the number of imputations that should be made.

maxit An integer defining the number of times the imputation cycle (imputing $x_1|x_{-1}$

then $x_2|x_{-2}$, ... and finally $x_p|x_{-p}$) shall be repeated. The task of checking convergence is left to the user, by evaluating the chainMean and chainVar!

nitt An integer defining number of MCMC iterations (see MCMCglmm).

burnin An integer for the desired number of Gibbs samples that shall be regarded as

burnin.

pvalue A numeric between 0 and 1 denoting the threshold of p-values a variable in the

imputation model should not exceed. If they do, they are excluded from the

imputation model.

mn An integer defining the minimum number of individuals per cluster.

An integer defining the allowed maximum of levels in a factor covariate.

spike A numeric value saying which value in the semi-continuous data might be the

spike. Or a list with with such values and names identical to the variables with spikes (see list_of_spikes_maker for details.) In versions earlier to 0.9.0 it

was called heap.

heap Use spike instead. heap is only included due to backwards compatibility and

will be removed with version 1.0.0

18 hmi_pool

rounding_degrees

A numeric vector with the presumed rounding degrees of rounded variables. Or a list with rounding degrees, where each list element has the name of a rounded continuous variable. Such a list can be generated using list_of_rounding_degrees_maker(data). Note: it is presupposed that the rounding degrees include 1 meaning that there is a positive probability that e.g. 3500 was only rounded to the nearest integer (and not rounded to the nearest multiple of 100 or 500).

rounding_formula

A formula with the model formula for the latent rounding tendency G. Or a list with model formulas for G, where each list element has the name of a rounded continuous variable. Such a list can be generated using list_of_rounding_formulas_maker(data)

pool_with_mice A Boolean indicating whether the user wants to pool the m data sets by mice using his model_formula. The default value is FALSE because this tampers the mids object as it adds an argument pooling not found in "normal" mids objects generated by mice.

Value

The function returns a mids object. See mice for further information.

Examples

```
## Not run:
data(Gcsemv, package = "hmi")
model_formula <- written ~ 1 + gender + coursework + (1 + gender|school)</pre>
set.seed(123)
dat_imputed <- hmi(data = Gcsemv, model_formula = model_formula, m = 2, maxit = 2)</pre>
#See ?hmi_pool for how to pool results.
## End(Not run)
```

hmi_pool

Averages the results of the imputation function hmi.

Description

This function applies the analysis the user wants to run on every imputed dataset. The results from every dataset are pooled by simply averaging. So the user has to make sure that averaging the analysis produces results is meaningful. Currently variance estimates for the averaged results are not implemented.

Usage

```
hmi_pool(mids, analysis_function)
```

hmi_pool 19

Arguments

mids

A mids (multiply imputed data set) object. Either from the hmi imputation function or mice.

analysis_function

A user generated function that gets a completed data set, runs the model and returns all model parameters he or she is interested in in a vector. See examples below.

Value

A vector with all averaged results.

Examples

```
## Not run:
data(Gcsemv, package = "hmi")
 model_formula <- written ~ 1 + gender + coursework + (1 + gender|school)</pre>
 set.seed(123)
 dat_imputed <- hmi(data = Gcsemv, model_formula = model_formula, M = 2, maxit = 2)</pre>
 my_analysis <- function(complete_data){</pre>
 # In this list, you can write all the parameters you are interested in.
 # Those will be averaged.
 # So make sure that averaging makes sense and that you only put in single numeric values.
 parameters_of_interest <- list()</pre>
 # ---- write in the following lines, what you are interetest in to do with your complete_data
 # the following lines are an example where the analyst is interested in the fixed intercept
 # and fixed slope and the random intercepts variance.
 # the random slopes variance and their covariance
 my_model <- lmer(model_formula, data = complete_data)</pre>
 parameters_of_interest[[1]] <- fixef(my_model)</pre>
 parameters_of_interest[[2]] <- lme4::VarCorr(my_model)[[1]][,]</pre>
 ret <- unlist(parameters_of_interest)# This line is essential if the elements of interest
 #should be labeled in the following line.
 names(ret) <-
  c("beta_intercept", "beta_gender", "beta_coursework", "sigma0", "sigma01", "sigma10", "sigma1")
 return(ret)
hmi_pool(mids = dat_imputed, analysis_function = my_analysis)
#if you are interested in fixed effects only, consider pool from mice:
pool(with(data = dat_imputed, expr = lmer(written ~ 1 + gender + coursework + (1 + gender|school))))
## End(Not run)
```

20 imputationcycle

idf2interval

Transform interval data frames into data.frames with interval variables

Description

This function is the path from the linLIR package (Wiencierz, 2012) to this hmi package.

Usage

```
idf2interval(idf)
```

Arguments

idf

an interval data frame (idf-object).

Value

A data. frame where the interval variables are stored as interval objects.

imputationcycle

Cycling

Description

Function to do one imputation cycle on the given data. The function cycles through every variable sequentially imputing the values, that are NA in the original data set in that current variable. The function determines the type of the variable and calls the suitable imputation function.

Usage

```
imputationcycle(
  data_before,
  original_data,
 NA_locator,
  fe,
  interaction_names,
  list_of_types,
  nitt,
  burnin,
  thin,
  pvalue = 0.2,
 mn,
  k = Inf,
  spike = NULL,
  rounding_degrees = NULL,
  rounding_covariates
)
```

imputationcycle 21

Arguments

data_before The n x p data.frame with the variables to impute. It was prepared for imputa-

variables or interactions or the joining of small clusters.

original_data The original data.frame the user passed to hmi.

NA_locator A n x p matrix localizing the missing values in the original dataset. The elements

are TRUE if the original data are missing and FALSE if the are observed.

fe A list with the decomposed elements of the model_formula.

interaction_names

A list with the names of the variables that have been generated as interaction

variables

list_of_types a list where each list element has the name of a variable in the data.frame.

The elements have to contain a single character denoting the type of the variable. See get_type for details about the variable types. With the function list_of_types_maker, the user can get the framework for this object. In most scenarios this is should not be necessary. One example where it might be necessary is when only two observations of a continuous variable are left - because in this case get_type interpret is variable to be binary. Wrong is it in no case.

nitt An integer defining number of MCMC iterations (see MCMCglmm).

burnin A numeric value between 0 and 1 for the desired percentage of Gibbs

samples that shall be regarded as burnin.

thin An integer to set the thinning interval range. If thin = 1, every iteration of the

Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000), the geweke.diag might fail to detect convergence. In such cases it is essential to look a chain free from

autocorrelation.

pvalue A numeric between 0 and 1 denoting the threshold of p-values a variable in the

imputation model should not exceed. If they do, they are excluded from the

imputation model.

mn An integer defining the minimum number of individuals per cluster.

k An integer defining the allowed maximum of levels in a factor covariate.

spike A numeric value saying which value in the semi-continuous data might be the

spike. Or a list with with such values and names identical to the variables with

spikes (see list_of_spikes_maker for details).

rounding_degrees

A numeric vector with the presumed rounding degrees. Or a list with rounding degrees, where each list element has the name of a rounded continuous variable. Such a list can be generated using list_of_rounding_degrees_maker(data).

rounding_covariates

A list for each rounded continuous variable with a character vector containing the covariate names from the original rounding formula. The transformation takes place in the wrapper function. 22 imp_binary_multi

Value

A data.frame where the values, that have a missing value in the original dataset, are imputed.

imp_binary_multi

The function for hierarchical imputation of binary variables.

Description

The function is called by the wrapper.

Usage

```
imp_binary_multi(
   y_imp,
   X_imp,
   Z_imp,
   clID,
   nitt = 22000,
   burnin = 2000,
   thin = 20,
   pvalue = 0.2,
   k = Inf
)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
Z_imp	A data.frame with the random effects variables.
clID	A vector with the cluster ID.
nitt	An integer defining number of MCMC iterations (see MCMCglmm).
burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1, every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000),
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A list with 1. 'y_ret' the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

imp_binary_single 23

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The function for imputation of binary variables.

Description

The function is called by the wrapper.

Usage

```
imp_binary_single(y_imp, X_imp, pvalue = 0.2, k = Inf)
```

Arguments

y_imp A Vector with the variable to impute.

X_imp A data.frame with the fixed effects variables.

pvalue A numeric between 0 and 1 denoting the threshold of p-values a variable in the

imputation model should not exceed. If they do, they are excluded from the

imputation model.

k An integer defining the allowed maximum of levels in a factor covariate.

Value

A n x 1 data.frame with the original and imputed values.

imn	cat	mu	lti

The function for hierarchical imputation of categorical variables.

Description

The function is called by the wrapper and relies on MCMCglmm.

While in the single level function (imp_cat_single) we used regression trees to impute data, here we run a multilevel multinomial model. The basic idea is that for each category of the target variable (expect the reference category) an own formula is set up, saying for example that the chances to end up in category j increase with increasing X5. So there is an own regression coefficient $beta_{5,j}$ present. In a multilevel setting, this regression coefficient $beta_{5,j}$ might be different for different clusters: for cluster 27 it would be $beta_{5,j,27} = beta_{5,j} + u_{5,27}$. This also leads to own random effect covariance matrices for each category. All those random effect variance parameters can be collected in one (quite large) covariance matrix where (for example) not only the random intercepts variance and random slopes variance and their covariance is present. Instead, there is even a covariance between the random slopes in category s and the random intercepts in category p. Beside the difficulties in interpretation, these covariances have shown to be numerically instable so they are set to be 0.

24 imp_cat_single

Usage

```
imp_cat_multi(
   y_imp,
   X_imp,
   Z_imp,
   clID,
   nitt = 22000,
   burnin = 2000,
   thin = 20,
   pvalue = 0.2,
   k = Inf
)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data.frame with the fixed effects variables.
Z_imp	A data.frame with the random effects variables.
clID	A vector with the cluster ID.
nitt	An integer defining number of MCMC iterations (see MCMCglmm).
burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1, every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000).
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A list with 1. 'y_ret' the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

<pre>imp_cat_single</pre>	The function to impute unordered categorical variables	

Description

The function uses regression trees for imputation implemented in mice. The principle is the following: For each observation it is calculated at which leave it would end. Then one (randomly selected) observation of the other observations found on this leave functions as a donor.

imp_cont_multi 25

Usage

```
imp_cat_single(y_imp, X_imp, pvalue = 0.2, k = Inf)
```

Arguments

y_imp A Vector with the variable to impute.

X_imp A data.frame with the fixed effects variables.

pvalue A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.

k An integer defining the allowed maximum of levels in a factor covariate.

Value

A n x 1 data.frame with the original and imputed values.

imp_cont_multi The function for hierarchical imputation of continuous variables.

Description

The function is called by the wrapper.

Usage

```
imp_cont_multi(
   y_imp,
   X_imp,
   Z_imp,
   clID,
   nitt = 22000,
   burnin = 2000,
   thin = 20,
   pvalue = 0.2,
   k = Inf
)
```

Arguments

y_imp	A vector with the variable to impute.
X_imp	A data.frame with the fixed effects variables.
Z_imp	A data.frame with the random effects variables.
clID	A vector with the cluster ID.
nitt	An integer defining number of MCMC iterations (see MCMCgImm).

26 imp_cont_single

burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1, every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000).
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A list with 1. 'y_ret' the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

imp_cont_single	The function for imputation of continuous variables.

Description

The function is called by the wrapper (hmi). It uses mice with the method "norm".

Usage

```
imp_cont_single(y_imp, X_imp, pvalue = 0.2, k = Inf)
```

Arguments

y_imp	A vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A n x 1 data.frame with the original and imputed values.

imp_count_multi 27

imp	count	multi

The function for hierarchical imputation of variables with count data.

Description

The function is called by the wrapper.

Usage

```
imp_count_multi(
   y_imp,
   X_imp,
   Z_imp,
   clID,
   nitt = 22000,
   burnin = 2000,
   thin = 20,
   pvalue = 0.2,
   k = Inf
)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
Z_imp	A data frame with the random effects variables.
clID	A vector with the cluster ID.
nitt	An integer defining number of MCMC iterations (see MCMCglmm).
burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1, every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000).
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A list with 1. $'y_ret'$ the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

28 imp_count_single

imp_count_single

The function for imputation of binary variables.

Description

The function is called by the wrapper.

Usage

```
imp_count_single(
  y_imp,
  X_imp,
  nitt = 22000,
  burnin = 2000,
  thin = 20,
  pvalue = 0.2,
  k = Inf
)
```

Arguments

y_imp	A vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
nitt	An integer defining number of MCMC iterations (see MCMCglmm).
burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1, every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000).
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A list with 1. 'y_ret' the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

imp_interval 29

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The function to impute interval data variables

Description

This functions imputes interval data variables. Those are variables, that consists of a lower and upper (numeric) boundary. Technically those boundaries are contained in a string, separated by a semi colon. E.g. if a person reports there income to be something between 3000 and 4000 dollars, its value in the interval covariate would be "3000;4000". Left (resp. right) censored data can be denoted by "-Inf;x" (resp. "x;Inf"), with x being the (numeric) observed value.

Usage

```
imp_interval(y_imp, X_imp, pvalue = 0.2, k = Inf)
```

Arguments

y_imp	A Vector from the class interval with the variable to impute.
X_imp	A data.frame with the fixed effects variables.
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.

An integer defining the allowed maximum of levels in a factor covariate.

Value

k

A n x 1 data.frame with the original and imputed values. Note that this function won't return interval data as its purpose is to "break" the interval answers into precise answers.

imp_orderedcat_multi The function for hierarchical imputation of categorical variables.

Description

The function is called by the wrapper.

Usage

```
imp_orderedcat_multi(
  y_imp,
  X_imp,
  Z_imp,
  clID,
  nitt = 25000,
  burnin = 5000,
```

```
thin = 20,
pvalue = 0.2,
k = Inf
)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
Z_imp	A data frame with the random effects variables.
clID	A vector with the cluster ID.
nitt	An integer defining number of MCMC iterations (see MCMCglmm).
burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1, every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000).
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A list with 1. 'y_ret' the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

imp_orderedcat_single The function to impute ordered categorical variables

Description

The function uses the proportional odds logistic regression (polr) approach, implemented in mice.

Usage

```
imp_orderedcat_single(y_imp, X_imp, pvalue = 0.2, k = Inf)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data.frame with the fixed effects variables.
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

imp_roundedcont 31

Value

A n x 1 data.frame with the original and imputed values as a factor.

imp_roundedcont	The function to impute rounded continuous variables	

Description

For example the income in surveys is often reported rounded by the respondents. See Drechsler, Kiesl and Speidel (2015) for more details.

Usage

```
imp_roundedcont(
  y_df,
  X_imp,
  PSI,
  pvalue = 0.2,
  k = Inf,
  rounding_degrees = NULL
)
```

Arguments

y_df A data.frame with the variable to impute.

X_imp A data.frame with the fixed effects variables explaining y_df.

PSI A data.frame with the variables explaining the latent rounding tendency G.

pvalue A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.

k An integer defining the allowed maximum of levels in a factor covariate. rounding_degrees

A numeric vector with the presumed rounding degrees for Y.

Value

A n x 1 data.frame with the original and imputed values.

References

Joerg Drechsler, Hans Kiesl, Matthias Speidel (2015): "MI Double Feature: Multiple Imputation to Address Nonresponse and Rounding Errors in Income Questions". Austrian Journal of Statistics Vol. 44, No. 2, http://dx.doi.org/10.17713/ajs.v44i2.77

32 imp_semicont_multi

imp_semicont_multi

The function for hierarchical imputation of semicontinuous variables.

Description

The function is called by the wrapper. We consider data to be "semicontinuous" when more than 5% of the (non categorical) observations.

For example in surveys a certain portion of people, when asked for their income, report "0", which clearly violates the assumption of income to be (log-) normally distributed.

Usage

```
imp_semicont_multi(
  y_imp,
  X_imp,
  Z_imp,
  clID,
  spike = NULL,
  nitt = 22000,
  burnin = 2000,
  thin = 20,
  pvalue = 0.2,
  k = Inf
)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
Z_imp	A data frame with the random effects variables.
clID	A vector with the cluster ID.
spike	A numeric value saying to which values Y might be spiked
nitt	An integer defining number of MCMC iterations (see MCMCglmm).
burnin	burnin A numeric value between 0 and 1 for the desired percentage of Gibbs samples that shall be regarded as burnin.
thin	An integer to set the thinning interval range. If thin = 1 , every iteration of the Gibbs-sampling chain will be kept. For highly autocorrelated chains, that are only examined by few iterations (say less than 1000).
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

imp_semicont_single 33

Value

A list with 1. 'y_ret' the n x 1 data.frame with the original and imputed values. 2. 'Sol' the Gibbs-samples for the fixed effects parameters. 3. 'VCV' the Gibbs-samples for variance parameters.

 $\verb|imp_semicont_single| The function for hierarchical imputation of semicontinuous variables.$

Description

The function is called by the wrapper. We consider data to be "semicontinuous" when more than 5% of the (non categorical) observations.

For example in surveys a certain portion of people, when asked for their income, report "0", which clearly violates the assumption of income to be (log-) normally distributed.

Usage

```
imp_semicont_single(y_imp, X_imp, spike = NULL, pvalue = 0.2, k = Inf)
```

Arguments

y_imp	A Vector with the variable to impute.
X_imp	A data frame with the fixed effects variables.
spike	A numeric value saying to which value Y might be spiked.
pvalue	A numeric between 0 and 1 denoting the threshold of p-values a variable in the imputation model should not exceed. If they do, they are excluded from the imputation model.
k	An integer defining the allowed maximum of levels in a factor covariate.

Value

A n x 1 data.frame with the original and imputed values.

interval2idf Transform interval variables to an interval data frame

Description

This function is the path from this hmi package to the linLIR package (Wiencierz, 2012).

Usage

```
interval2idf(interval)
```

is_interval

Arguments

interval an interval

Value

an interval data frame (idf-object) with one variable (having a lower and an upper bound).

is.na.interval

is.na for interval objects

Description

This functions checks whether elements from an interval object are NA

Usage

```
## S3 method for class 'interval'
is.na(interval)
```

Arguments

interval

An interval object of length n

Value

A boolean vector of length n indicating whether the entries in interval are NA or not. Cf. is.na.

is_interval

Function to check whether an object is an interval

Description

If there are numerics separated by semicolons (;), this is considered to be an interval. intervals with 2.4e5 are not considered to be an interval.

Usage

```
is_interval(x)
```

Arguments

Х

an object

Value

a boolean value indicting whether x is an interval or not

list_of_rounding_degrees_maker

Helps the user to make a list of rounding degrees

Description

In hmi the user can add a list of rounding degrees. This function gives him a framework with suggestions. Of course the user can make changes by herself/himself afterwards. For example, the function might wrongly classify a variable to be heaped or selects unwanted rounding degrees.

Usage

```
list_of_rounding_degrees_maker(data)
```

Arguments

data

the data.frame also passed to hmi.

Value

a list with suggested rounding degrees. Each list element has the name of a rounded continuous variable in the data frame. The elements contain a numeric vector with the rounding degrees found for that variable.

```
list_of_rounding_formulas_maker
```

Helps the user to make a list of rounding formulas for the rounding degrees

Description

In hmi the user can add a list of rounding formulas for each variable suffering rounding. This function gives him/her a framework with suggestions. Of course the user can make changes by herself/himself afterwards. For example, the function might wrongly classify a variable to be heaped.

Usage

```
list_of_rounding_formulas_maker(data, default = ~.)
```

Arguments

data the data.frame also passed to hmi.

default A default formula used for every rounded variable.

36 list_of_types_maker

Value

a list with suggested rounding degree formulas. Each list element has the name of a rounded continuous variable in the data.frame. The elements contain a very general rounding degree formula.

Description

In hmi the user can add a list of spikes. This function gives her/him a framework with suggestions. Of course the user can make changes by herself/himself afterwards. For example, the function might wrongly classify a variable to have a spike.

Usage

```
list_of_spikes_maker(data)
```

Arguments

data the data.frame also passed to hmi.

Value

a list with suggested spikes. Each list element has the name of a spiked variable in the data.frame. The elements contain a single numeric denoting the spike found for that variable.

Description

In hmi the user can add a list of types. This function gives him a framework with suggestions. Of course the user can make changes by herself/himself afterwards. For example, if a continuous variable has only two observations left, then get_type interpret this as a binary variable and not a continuous.

Usage

```
list_of_types_maker(data, spike = NULL, rounding_degrees = NULL)
```

Arguments

data the data.frame also passed to hmi.

spike A numeric value or list saying which value in the semi-continuous data might

be the spike.

rounding_degrees

A numeric vector with the presumed rounding degrees.

log.interval 37

Value

a list with suggested types. Each list element has the name of a variable in the data.frame. The elements contain a single character denoting the type of the variable. See get_type for details about the variable types.

log.interval

Log function for interval objects

Description

Log function for interval objects

Usage

```
## S3 method for class 'interval' log(x, ...)
```

Arguments

x numeric vector or interval object
... further arguments passed to log

Mode

Get the mode

Description

This function calculates the mode (most frequent observation) of a vector.

Usage

Mode(x)

Arguments

Χ

A vector

Value

The mode of x as a numeric value.

References

Adopted from stackoverflow.com/questions/2547402: "is there a built in function for finding the mode" from user "Ken Williams".

38 negloglik

negloglik

calculate the likelihood contribution of the data

Description

This function based on Drechsler, Kiesl & Speidel (2015) is needed in the imputation routine for rounded income. It calculates the likelihood contribution of the data (regardless whether they are observed precisely or presumably rounded).

Usage

```
negloglik(
  para,
  parnames = names(para),
  X_in_negloglik,
 PSI_in_negloglik,
  y_precise_stand,
  lower_bounds = NA,
  upper_bounds = NA,
 my_g,
  sd_of_y_precise,
  indicator_precise,
  indicator_imprecise,
  indicator_outliers,
  rounding_degrees = c(1, 10, 100, 1000)
)
```

Arguments

para

This is the vector Psi of parameters (see p. 62 in Drechsler, Kiesl & Speidel, 2015). With respect to them, the value returned by negloglik shall be maximized.

The starting values are c(kstart, betastart, gamma1start, sigmastart) (the thresholds (or "cutting points") for the latent variable behind the rounding degree, the regression parameters explaining the logged income, the regression parameters explaining the rounding degree and the variance parameter).

parnames

A character vector with the names of the elements in para.

X_in_negloglik The data.frame of covariates explaining Y, the observed target variable. It has to has n rows (with n being the number of precise, imprecise and missing observations).

PSI_in_negloglik

The data frame of covariates explaining G, the latent rounding tendency. Without the target variable.

y_precise_stand

A vector of the precise (and standardized) observations from the target variable.

lower_bounds

The lower bounds of an interval variable.

upper_bounds The upper bounds of an interval variable.

my_g This vector is the indicator of the (highest possible) rounding degree for an observation. This parameter comes directly from the data.

sd_of_y_precise

The scalar with the value equal to the standard deviation of the target variable.

indicator_precise

A boolean Vector indicating whether the value in the original target variable is precise (e.g. 5123 or 5123.643634) or not.

indicator_imprecise

A boolean Vector indicating whether the value in the original target variable is imprecise (e.g. "5120;5130) or not.

indicator_outliers

A boolean Vector indicating whether the value in the precise observations of the original target are outliers (smaller than 0.5% or larger than 99.5% of the other precise observations).

rounding_degrees

A numeric vector with the presumed rounding degrees for Y.

Value

An integer equal to the (sum of the) negative log-likelihood contributions (of the observations)

References

Joerg Drechsler, Hans Kiesl, Matthias Speidel (2015): "MI Double Feature: Multiple Imputation to Address Nonresponse and Rounding Errors in Income Questions", Austrian Journal of Statistics, Vol. 44, No. 2, http://dx.doi.org/10.17713/ajs.v44i2.77

negloglik2_intervalsonly

calculate the likelihood contribution of interval data only

Description

calculate the likelihood contribution of interval data only

Usage

```
negloglik2_intervalsonly(
  para,
  parnames = names(para),
  X,
  lower_bounds,
  upper_bounds
)
```

40 nhanes_imp

Arguments

para This is the vector Psi of parameters defining model (see p. 62 in Drechsler,

Kiesl & Speidel, 2015). With respect to them, the value returned by this func-

tion shall be maximized.

The starting values are c(betastart2, sigmastart2) (the regression parameters ex-

plaining the logged income, and the variance parameter).

parnames A character vector with the names of the elements in para.

X the data.frame of covariates.

lower_bounds the lower bound of an interval variable.

upper_bounds the upper bound of an interval variable.

Value

An integer equal to the (sum of the) negative log-likelihood contributions (of the observations)

References

Joerg Drechsler, Hans Kiesl, Matthias Speidel (2015): "MI Double Feature: Multiple Imputation to Address Nonresponse and Rounding Errors in Income Questions", Austrian Journal of Statistics, Vol. 44, No. 2, http://dx.doi.org/10.17713/ajs.v44i2.77

nhanes_imp	National Health and Nutrition Examination Survey (2015 - 2016) -
	imputed

Description

A mids object with the imputed income data set from the US American National Health and Nutrition Examination Survey (NHANES) collected by the Centers for Disease Control and Prevention (CDC) and the National Center for Health Statistics (NCHS) for 2015-2016. The NHANES data are included into the package for illustration. The modified data set nhanes_mod was imputed by running hmi (nhanes_mod,maxit = 50). The Website (https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.htm) gives the following Analytic notes: "The income questions were asked as part of household interview, the interview sample weights may be used in the analysis for data in this section. However, if the data is joined with other data from the Mobile Examination Center (MEC), the MEC exam weights should be used. Please refer to the NHANES Analytic Guidelines and the on-line NHANES Tutorial for further details on the use of sample weights and other analytic issues. Both of these are available on the NHANES website."

Usage

nhanes_imp

nhanes_mod 41

Format

A mids object. Each of the 3 completed data sets has 9971 rows and 12 variables:

inq020 Income from wages/salaries? 1 = Yes, 2 = No

inq012 Income from self employment? 1 = Yes, 2 = No

inq030 Income from Social Security or Railroad Retirement? 1 = Yes, 2 = No

inq060 Income from other disability pension? 1 = Yes, 2 = No

inq080 Income from retirement/survivor pension? 1 = Yes, 2 = No

inq090 Income from Supplemental Security Income? 1 = Yes, 2 = No

inq132 Income from state/county cash assistance? 1 = Yes, 2 = No

inq140 Income from interest/dividends or rental? 1 = Yes, 2 = No

inq150 Income from other sources? 1 = Yes, 2 = No

ind235 Monthly family income?

ind310 Total savings/cash assets for the family?

inq320 How do you get to the grocery store?, 1 = In my car, 2 = In a car that belongs to someone I live with, 3 = In a car that belongs to someone who lives elsewhere, 4 = Walk, 5 = Ride bicycle, 6 = Bus, subway or other public transit, 7 = Taxi or other paid driver, 8 = Someone else delivers groceries, 9 = Other, 66 = No usual mode of traveling to store, 77 = Refused, 99 = Don't know

Source

Website of the Centers for Disease Control and Prevention: https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.XPT

References

Centers for Disease Control and Prevention (CDC). National Center for Health Statistics (NCHS). National Health and Nutrition Examination Survey Data. Hyattsville, MD: U.S. Department of Health and Human Services, Centers for Disease Control and Prevention. Variables descriptions at https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.htm

nhanes_mod National Health and Nutrition Examination Survey (2015 - 2016) - modified

Description

The Income data set from the US American National Health and Nutrition Examination Survey (NHANES) collected by the Centers for Disease Control and Prevention (CDC) and the National Center for Health Statistics (NCHS) for 2015-2016 - modified. The NHANES data are included into the package for illustration. The following modifications compared to nhanes_sub were made:

ind235 Monthly family income? Was made an interval object

42 nhanes_mod

ind310 Total savings/cash assets for the family? Was made an interval object

The Website (https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.htm) gives the following Analytic notes: "The income questions were asked as part of household interview, the interview sample weights may be used in the analysis for data in this section. However, if the data is joined with other data from the Mobile Examination Center (MEC), the MEC exam weights should be used. Please refer to the NHANES Analytic Guidelines and the on-line NHANES Tutorial for further details on the use of sample weights and other analytic issues. Both of these are available on the NHANES website."

Usage

nhanes_mod

Format

A data frame with 9971 rows and 12 variables:

inq020 Income from wages/salaries? 1 = Yes, 2 = No

inq012 Income from self employment? 1 = Yes, 2 = No

inq030 Income from Social Security or Railroad Retirement? 1 = Yes, 2 = No

ing060 Income from other disability pension? 1 = Yes, 2 = No

inq080 Income from retirement/survivor pension? 1 = Yes, 2 = No

inq090 Income from Supplemental Security Income? 1 = Yes, 2 = No

inq132 Income from state/county cash assistance? 1 = Yes, 2 = No

inq140 Income from interest/dividends or rental? 1 = Yes, 2 = No

ing150 Income from other sources? 1 = Yes, 2 = No

ind235 Monthly family income?

ind310 Total savings/cash assets for the family?

inq320 How do you get to the grocery store?, 1 = In my car, 2 = In a car that belongs to someone I live with, 3 = In a car that belongs to someone who lives elsewhere, 4 = Walk, 5 = Ride bicycle, 6 = Bus, subway or other public transit, 7 = Taxi or other paid driver, 8 = Someone else delivers groceries, 9 = Other, 66 = No usual mode of traveling to store, 77 = Refused, 99 = Don't know

Source

Website of the Centers for Disease Control and Prevention: https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.XPT

References

Centers for Disease Control and Prevention (CDC). National Center for Health Statistics (NCHS). National Health and Nutrition Examination Survey Data. Hyattsville, MD: U.S. Department of Health and Human Services, Centers for Disease Control and Prevention. Variables descriptions at https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.htm

nhanes_sub 43

nhanes_sub A subset of the National Health and Nutrition Examination Survey (2015 - 2016)

Description

A subset of the Income data set from the US American National Health and Nutrition Examination Survey (NHANES) collected by the Centers for Disease Control and Prevention (CDC) and the National Center for Health Statistics (NCHS) for 2015-2016. Four variables were dropped: seqn, the respondent sequence number, as the information was included into the rownames; indfmmpi and indfmmpc, the Family monthly poverty level index/category as these variables are too overcomplex for the illustrative purpose of the data and ing300, the response to the question whether the family has more than 20000 dollars of savings - this information was merged into the variable ind310, the total savings of the family. This gave several new categories for ind310: individuals reporting savings below 20,000 USD (inq300 == 2), but reporting "refused" or "don't know" to the detailed question of the total savings ind310, get the new category 6 "0 - 20,000 USD". The individuals reported to have more than 20,000 USD savings (inq300 == 1), get the new category 7 "20,001 USD and over". Individuals reporting "refused" or "don't know" to ing300 (more than 20000 USD savings?) get the new category 8 "0 USD and over". In ind235, the monthly family income, missing values are made a new category "0 USD and over". The variable inq320 was transformed into a factor. "Refused" and "Don't know" responses where changed to NA. The Website (https://wwwn. cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.htm) gives the following Analytic notes: "The income questions were asked as part of household interview, the interview sample weights may be used in the analysis for data in this section. However, if the data is joined with other data from the Mobile Examination Center (MEC), the MEC exam weights should be used. Please refer to the NHANES Analytic Guidelines and the on-line NHANES Tutorial for further details on the use of sample weights and other analytic issues. Both of these are available on the NHANES website."

Usage

nhanes_sub

Format

A data frame with 9971 rows and 12 variables:

inq020 Income from wages/salaries? 1 = Yes, 2 = No

inq012 Income from self employment? 1 = Yes, 2 = No

inq030 Income from Social Security or Railroad Retirement? 1 = Yes, 2 = No

inq060 Income from other disability pension? 1 = Yes, 2 = No

ing080 Income from retirement/survivor pension? 1 = Yes, 2 = No

inq090 Income from Supplemental Security Income? 1 = Yes, 2 = No

inq132 Income from state/county cash assistance? 1 = Yes, 2 = No

inq140 Income from interest/dividends or rental? 1 = Yes, 2 = No

inq150 Income from other sources? 1 = Yes, 2 = No

44 pbivnormX

```
ind235 Monthly family income? 1 = 0 - 399 USD, 2 = 400 - 799 USD, 3 = 800 - 1,249 USD, 4 = 1,250 - 1,649 USD, 5 = 1,650 - 2,099 USD, 6 = 2,100 - 2,899 USD, 7 = 2,900 - 3,749 USD, 8 = 3,750 - 4,599 USD, 9 = 4,600 - 5,399 USD, 10 = 5,400 - 6,249 USD, 11 = 6,250 - 8,399 USD, 12 = 8,400 USD and over, 13 = 0 USD and over
```

- **ind310** Total savings/cash assets for the family? 1 = 0 3,000 USD, 2 = 3,001 5,000 USD, 3 = 5,001 10,000, 4 = 10,001 15,000 USD, 5 = 15,001 20,000, 6 = 0 20,000 USD, 7 = 20,001 USD and over, 8 = 0 USD and over
- inq320 How do you get to the grocery store?, 1 = In my car, 2 = In a car that belongs to someone I live with, 3 = In a car that belongs to someone who lives elsewhere, 4 = Walk, 5 = Ride bicycle, 6 = Bus, subway or other public transit, 7 = Taxi or other paid driver, 8 = Someone else delivers groceries, 9 = Other, 66 = No usual mode of traveling to store, 77 = Refused, 99 = Don't know

Source

Website of the Centers for Disease Control and Prevention: https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.XPT

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Centers for Disease Control and Prevention (CDC). National Center for Health Statistics (NCHS). National Health and Nutrition Examination Survey Data. Hyattsville, MD: U.S. Department of Health and Human Services, Centers for Disease Control and Prevention. Variables descriptions at https://wwwn.cdc.gov/Nchs/Nhanes/2015-2016/INQ_I.htm

pbivnormX	calculate probabilities from the cumulative distribution function of a
	standard bivariate normal distribution

Description

A modified version of pbivnorm() from package pbivnorm. It is needed in the imputation routine for rounded income.

Usage

```
pbivnormX(x, y, rho = 0)
```

Arguments

Χ	the vector (or a two columned matrix) with the values of the first random variable
у	the vector with the values of the second random variable
rho	the correlation (a scalar) between the two random variables.

Value

A vector with the values of the density distribution at the points (x, y).

plot.interval 45

plot.interval

Plotting interval variables

Description

Function to plot interval variables by rectangles. The bounds of the rectangles are given by the lower and upper bounds of the interval variables. To avoid precise observations to have a line-width of 0, small values are added to the upper and lower bounds what guarantees the rectangles (or lines or points) to be easily visible in the plot.

Usage

```
## $3 method for class 'interval'
plot(
    x = NULL,
    y = NULL,
    data = NULL,
    col = "black",
    xlab = NULL,
    ylab = NULL,
    xlim = NULL,
    ylim = NULL,
    sort = NULL,
    ...
)
```

Arguments

х	In its most save way, x is an object from class interval and jointly used with a second interval object y. If no y is given, the values of x are just plotted in order of appearance (cf. plot(iris\$Sepal.Length)). x can also be a formula with two variables found in data.
У	If used jointly with x, it has to be a numeric vector or an interval object.
data	If x is a fomula, it has to be a data.frame or matrix with column names fitting to the two variables named in the formula.
col	The color of the rectangles.
xlab	A title for the x axis: see title.
ylab	A title for the y axis: see title.
xlim	Numeric vectors of length 2, giving the x coordinate ranges.
ylim	Numeric vectors of length 2, giving the y coordinate ranges.
sort	A character specifying how the values should be sorted if only one variable is to be plotted. By default they are sorted according to their position in the data set. sort = "lowerbound_increasing" sorts the data primarily by their lower bound, and secondarily (this means for equal lower bounds) by their upper

46 round.interval

bounds. Both in increasing order. For sort = "lowerbound_decreasing", both happens in decreasing order. sort = "mostprecise_increasing" sorts the data by their length of the interval they represent, and within equal lengths by the lower bound. Both in increasing order. For sort = "mostprecise_decreasing", both happens in decreasing order.

... graphical parameters such as main.

 $random_intercept_check$

Function to check multilevel models on the existence of random intercepts

Description

Function to check multilevel models on the existence of random intercepts. The specification of an intercept by calling a 1-column (e.g. "int") is not counted towards the existence of an intercept. Contradictory inputs like " $\sim 1 + 0 + X1 + ...$ " or " $\sim -1 + 1 + X1 + ...$ " will throw an error.

Usage

```
random_intercept_check(model_formula)
```

Arguments

Value

A boolean value indicating whether there is a fixed intercept in the model or not

round.interval

Round function for interval objects

Description

Round function for interval objects

Usage

```
## S3 method for class 'interval' round(x, ...)
```

Arguments

x numeric vector or interval object

... further arguments passed to round.

sampler 47

sampler	Function need to multivariate samples of a truncated multivariate normal distribution

Description

As rtmvnorm only allows one mean vector of one multivariate normal distribution, but we need different mean vectors for different multivariate normal distributions, we implement this function. This function in combination with apply, allows us to sample from a truncated multivariate normal distribution with different mean vectors.

Usage

```
sampler(elements, Sigma)
```

Arguments

elements Originally a matrix, but when passed to samp, it is a vector. The first length_mean

elements are the mean vector of g and y, the next two elements are the lower

bounds for g and y, the last two elements are the upper bounds for g and y.

Sigma The covariance matrix of the multivariate normal distribution to sample from.

Value

A length_mean x 1 matrix with the samples for g and y.

ample_imp Sample imputation.

Description

Function to sample values in a variable from other (observed) values in this variable. So this imputation does not use further covariates.

Usage

```
sample_imp(variable)
```

Arguments

variable A vector of size n with missing values.

Value

A n x 1 data.frame with the observed and imputed data

48 split_interval

Examples

```
set.seed(123)
sample_imp(c(1, NA, 3, NA, 5))
```

sna_interval

Get standard NAs from interval data

Description

This function replaces observations with "-Inf;Inf" in an interval, which basically means "no information available", with the standard NAs (therefore the name 'sna'). Observations with a finite bound (e.g.x = "0;Inf") are not replaced, since they contain information (here: "x is positive").

Usage

```
sna_interval(x)
```

Arguments

Х

can by any object, but the function was designed for interval-objects.

Value

In case of x being an interval-object, it returns a n times 2 matrix. The first column is the lower bound, the second the upper bound. Otherwise it returns just x.

split_interval

Split up intervals

Description

This function splits an interval object up into the lower and upper bound

Usage

```
split_interval(interval)
```

Arguments

interval

an interval object of length n (if it is something else, it is returned unchanged)

Value

a n times 2 matrix. The first column is the lower bound, the second the upper bound.

sqrt.interval 49

sqrt.interval

Sqrt function for interval objects

Description

Sqrt function for interval objects

Usage

```
## S3 method for class 'interval' sqrt(x, ...)
```

Arguments

x numeric vector or interval object

... further arguments passed to sqrt.

stand

Standardizing function

Description

Function to standardize variables that are numeric (continuous and count variables) but no rounded continuous, semicontinuous, intercepts or categorical variables.

Usage

```
stand(X)
```

Arguments

Χ

A n times p data.frame with p fixed (or random) effects variables.

Value

A n times p data.frame with the standardized versions of the numeric variables.

50 table

```
suggest_rounding_degrees
```

suggesting rounding degrees

Description

A function that suggests some rounding degrees of a continuous variable (classically formatted or as interval object). The basic idea is 1. to count which factor is observed in the data more often than expected. 2. to check whether a factor can explain at least three observed piles of observations in the data 3. to check whether a factor explains at least 20 % of observations (additional to previous factors). Factors fulfilling this premises are returned as suggested rounding degrees.

Usage

```
suggest_rounding_degrees(x)
```

Arguments

Х

A vector or interval object.

table

Tabulating interval objects

Description

Function to tabulate interval objects

Usage

```
table(x, ...)
## S3 method for class 'interval'
table(x, sort = "lowerbound_increasing", ...)
## Default S3 method:
table(x, ...)
```

Arguments

x In its most save way, x is an object from class interval.

... Other parameters passed to table.

tail.interval 51

sort

A character specifying how the values should be sorted if only one variable is to be plotted. sort = "lowerbound_increasing" (the default) sorts the data primarily by their lower bound, and secondarily (this means for equal lower bounds) by their upper bounds. Both in increasing order. For sort = "lowerbound_decreasing" both happens in decreasing order. sort = "mostprecise_increasing" sorts the data by their length of the interval they represent, and within equal lengths by the lower bound. Both in increasing order. sort = "mostprecise_decreasing" both happens in decreasing order.

Value

A table.

tail.interval

Tail for intervals

Description

Tail function for intervals returning the last elements of an interval object

Usage

```
## S3 method for class 'interval'
tail(x, ...)
```

Arguments

vector, matrix, table, data.frame or interval object further arguments passed to tail.

Index for interval

[.interval

Description

Function to index elements of an interval object

Usage

```
## S3 method for class 'interval'
obj[index]
```

Arguments

obj the interval object

index the index of the elements to replace 52 ^.interval

[<-.interval

Replace for interval

Description

Function to replace elements of an interval object

Usage

```
## S3 replacement method for class 'interval'
obj[index] <- value</pre>
```

Arguments

obj the interval object

index the index of the elements to replace

value the replaced elements shall take

^.interval

Power function

Description

Taking the power of interval objects

Usage

```
## S3 method for class 'interval' interval ^{\prime} x
```

Arguments

interval an object from class interval x an single numeric to potentiate

Value

an interval object

Index

* datasets	idf2interval, 20
Gcsemv, 13	imp_binary_multi, 22
nhanes_imp, 40	imp_binary_single, 23
nhanes_mod, 41	imp_cat_multi, 23
nhanes_sub, 43	imp_cat_mult1, 23 imp_cat_single, 24
*.interval, 3	imp_cat_single, 24 imp_cont_multi, 25
+.interval, 4	imp_cont_single, 26
interval, 4	imp_count_multi, 27
/.interval, 5	imp_count_single, 28
[.interval, 51	imp_interval, 29
[<interval, 52<="" td=""><td>imp_orderedcat_multi, 29</td></interval,>	imp_orderedcat_multi, 29
^.interval, 52	imp_orderedcat_single, 30
	imp_roundedcont, 31
as.data.frame.interval, 5	<pre>imp_semicont_multi, 32</pre>
as.interval, 6	<pre>imp_semicont_single, 33</pre>
	imputationcycle, 20
ceiling.interval, 6	interval2idf, 33
center_interval, 7	is.na.interval, 34
chaincheck, 7	is_interval, 34
cleanup, 8	1
contributions4intervals, 9	list_of_rounding_degrees_maker, 35
	list_of_rounding_formulas_maker, 35
decompose_interval,9	list_of_spikes_maker, 36
doubleintegral, 10	list_of_types_maker, 36
	log.interval, 37
exp.interval, 11	Mode, 37
extract_varnames, 11	Mode, 37
	negloglik, 38
factors, 12	negloglik2_intervalsonly, 39
<pre>fixed_intercept_check, 12</pre>	nhanes_imp, 40
floor.interval, 13	nhanes_mod, 41
formula, <i>17</i>	nhanes_sub, 43
	manes_sub, 45
Gcsemv, 13	pbivnormX, 44
generate_interval, 6, 14	plot.interval, 45
get_type, 15	p2007200. 702, 10
	random_intercept_check, 46
head.interval, 16	round.interval, 46
hmi, 16	
hmi_pool, 18	<pre>sample_imp, 47</pre>

54 INDEX

```
sampler, 47
sna_interval, 48
split_interval, 48
sqrt.interval, 49
stand, 49
suggest_rounding_degrees, 50
table, 50
tail.interval, 51
```