Package 'noflins'

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Description A package for running analysis for N of 1 studies. Runs Bayesian linear regression, ordinal/logistic regression, and poisson regression. Includes different plots to visualize the results.
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nof1-package

mcnet: A package for N of 1 study analysis using Bayesian methods

Description

A package for running N of 1 study trials

Details

An N of 1 trial is a clinical trial in which a single patient is the entire trial, a single case study. The main purpose of this package was to serve as an analysis tool for one of the PCORI grants we were working with. It is designed for N of 1 trials and can fit bayesian versions of linear regression, logistic/ordinal regression, and poisson regression. Package includes number of different plotting tools for visualization.

frequency_plot

Frequency plot for raw data

Description

Frequency plot for raw data

Usage

```
frequency_plot(nof1, ...)
```

Arguments

```
nof1 nof1 object created using nof1.data
```

... parameters to pass to geom_bar or geom_histogram.

Examples

```
Y <- laughter$Y
Treat <- laughter$Treat
nof1 <- nof1.data(Y, Treat, ncat = 11, baseline = "Usual Routine", response = "ordinal")
frequency_plot(nof1)</pre>
```

kernel_plot 3

kernel_plot

Kernel density estimation plot

Description

Creates a kernel density estimation plot for a specific outcome

Usage

```
kernel_plot(result, comp = T, ...)
```

Arguments

result Modeling result of class nof1.result produced by nof1.run.
... parameters to pass to geom_histogram.

nof1.data

Make an N of 1 object containing data, priors, and a jags model file for individual analysis

Description

Make an N of 1 object containing data, priors, and a jags model file for individual analysis

```
nof1.data(
  Υ,
  Treat,
  ord.baseline.Treat = NULL,
  ord.model = NULL,
  response = NULL,
  ncat = NULL,
  bs.trend = F,
  y.time = NULL,
  knots.bt.block = NULL,
  block.no = NULL,
  bs.df = NULL,
  corr.y = F,
  alpha.prior = NULL,
  beta.prior = NULL,
  eta.prior = NULL,
  dc.prior = NULL,
  c1.prior = NULL,
  rho.prior = NULL,
  hy.prior = NULL,
)
```

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Arguments

Y Outcome of the study. This should be a vector with NA's included in time order.

Treat

Treatment indicator vector with same length as the outcome. Can be character

or numeric.

ord.baseline.Treat

Used for ordinal outcome to define a reference treatment level.

ord.model Used for ordinal outcome to pick the model. Can be "cumulative" for propor-

tional odds model or "acat" for restricted adjacent category model.

response Type of outcome. Can be "normal" for continuous outcome, "binomial" for bi-

nary outcome, "poisson" for count outcome, or "ordinal" for ordinal or nominal

outcome.

ncat Number of categories. Used in ordinal models.

bs.trend Indicator for whether the model should adjust for trend using splines. The de-

fault is F.

y. time Parameter used for modeling splines. Time when the outcome is measured.

knots.bt.block parameter used for modeling splines. Indicator for whether or not knots should

be set at the end of each block except for the last block. If TRUE, user should

then specify block.no; if FALSE, user should then specify bs.df.

block.no Block number used for modeling splines for the setting where the knots are set

at the end of each block. Block number with the same length as the outcome.

bs.df Degrees of freedom for modeling splines when knots are not set at the end of

each block.

corr.y Indicator for whether the correlation among measurements shoule be modeled.

The default is F.

alpha.prior Prior for the intercept of the model. Not needed now since we are using treatment-

specific intercept model.

beta.prior Prior for the treatment-specific intercept.

eta.prior Prior for modelling spline terms.

dc.prior Prior for the length between cutpoints. Used only for ordinal logistic models.

c1.prior Prior for the first cutpoint. Used only for ordinal logistic models.

rho.prior Prior for the correlated error model.

hy.prior Prior for the heterogeneity parameter. Supports uniform, gamma, and half nor-

mal for normal and binomial response and wishart for multinomial response. It should be a list of length 3, where first element should be the distribution (one of dunif, dgamma, dhnorm, dwish) and the next two are the parameters associated with the distribution. For example, list("dunif", 0, 5) give uniform prior with lower bound 0 and upper bound 5 for the heterogeneity parameter. For wishart distribution, the last two parameter would be the scale matrix and the degrees of

freedom.

... Arguments to be passed to bs().

Value

An object of class "nof1.data" that is used to run the model using nof1. run is a list containing

Y Outcome Treat Treatment nof1.nma.data 5

ncat Number of categories for ordinal response nobs Total number of observations in a study

Treat.name Treatment name response Type of outcome

Treat_Treat.name

Vector in the model matrix for Treat.name

bs.trend Indicator for whether the model should adjust for trend using splines

corr.y Indicator for whether the correlation among measurements shoule be modeled priors

Priors that the code will be using. Default priors are used if prior was not speci-

fied

code Rjags model file code that is generated using information provided by the user.

To view model file inside R, use cat(nof1\$code).

Examples

```
###Blocker data example
laughter
Y <- laughter$Y
Treat <- laughter$Treat
nof1 <- nof1.data(Y, Treat, ncat = 11, response = "ordinal")
str(nof1)
cat(nof1$code)</pre>
```

nof1.nma.data

Make an N of 1 object containing data, priors, and a jags model file for (network) meta-analyses

Description

Make an N of 1 object containing data, priors, and a jags model file for (network) meta-analyses

```
nof1.nma.data(
   Y,
   Treat,
   baseline.Treat,
   ID,
   response,
   model.linkfunc = NULL,
   model.slp = "fixed",
   model.slp = "random",
   ord.ncat = NULL,
   ord.model,
   ord.parallel = NULL,
   strata.cov = NULL,
   adjust.strata.cov = NULL,
   lvl2.cov = NULL,
   spline.trend = F,
```

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```
trend.type,
y.time = NULL,
knots = NULL,
trend.df = NULL,
step.trend = F,
y.step = NULL,
corr.y = F,
alpha.prior = NULL,
beta.prior = NULL,
dc.prior = NULL,
c1.prior = NULL,
rho.prior = NULL,
hy.prior = NULL,
na.rm = T,
...
)
```

Arguments

Y Outcome of the study. This should be a vector with NA's included in time order.

Treat Treatment indicator vector with the same length as the outcome. Can be charac-

ter or numeric.

baseline. Treat Name of the reference treatment.

ID Participant ID vector with the same length as the outcome.

response Type of outcome. Can be "normal" for continuous outcome, "binomial" for bi-

nary outcome, "poisson" for count outcome, or "ordinal" for ordinal or nominal

outcome.

model.linkfunc Link function in the model.

model.intcpt Form of intercept.

model.slp Form of slope. For link function and the forms of intercept and slopes, currently

implemented for 1) normal response: "identity"-"fixed/random"-"random", 2) poisson response: "log"-"fixed"-"random", 3) binomial response: "log/logit"-

"fixed"-"random".

ord.ncat Number of categories in ordinal response. The parameters for ordinal outcomes

need to be tested.

ord.model Used for ordinal outcome to pick the model. Can be "cumulative" for cumulative

probability model or "acat" for adjacent category model.

ord.parallel Whether or not the comparisons between categories or cumulative probabilities

are parallel.

strata.cov Only applicable when random intercept model is used. Stratification covariates

used during randomization. Should be a data frame with the columns being the covariates and the number of rows should be equal to the length of the outcome.

Must be of factor type if categorical covariates.

adjust.strata.cov

Only applicable when random intercept model is used. A vector with each element taking on possible values from c("fixed", "random") indicating how the stratification covariate should be adjusted in the model.

nof1.nma.run 7

lvl2.cov	Participant level covariates for heterogeneous treatment effects. Should be a data frame with the columns being the covariates and the number of rows should be equal to the length of the outcome. For fixed-intercept model, participant level covariates will have interaction with treatment (slope) because there are fixed-intercepts adjusting for each participant in the model; for random-intercept model, participant level covariates will have interaction with all treatment-specific intercepts.
spline.trend	Indicator for whether the model should adjust for trend using splines. The default is F.
trend.type	"bs" for basis splines or "ns" for natural splines.
y.time	Time when the outcome is measured. Required when adjusting for trend or correlation (spline.trend/step.trend/corr.y is TRUE). Should be a vector of the same length as the outcome.
knots	Knots in y.time when adjusting for trend using splines. For trend.type = "bs", knots should be set at the end of each block except for the last block; for or trend.type = "ns", knots should be set at the end of each period except for the last period.
trend.df	Degrees of freedom for modeling splines when knots are not set.
step.trend	Indicator for whether to adjust for trend using step functions for each period.
y.step	Period number corresponding to the outcome. Should be a vector of the same length of the outcome.
corr.y	Indicator for whether the correlation among measurements shoule be modeled. The default is F.
alpha.prior	Prior for the fixed-intercepts.
beta.prior	Prior for random intercepts or slopes.
eta.prior	Prior for modelling spline terms or heterogeneous treatment effects.
dc.prior	Prior for the length between cutpoints. Used only for ordinal logistic models.
c1.prior	Prior for the first cutpoint. Used only for ordinal logistic models.
rho.prior	Prior for the correlation between random effects or the correlation among repeated measurements on each participant.
hy.prior	Prior for the variance of the residual errors for normal response, the standard deviation of random slopes for binary outcome, the variance of random effects for other types of outcomes.

nof1.nma.run	Run the model using the nof1 object for (network) meta-analyses
nor i.iiiia.i uii	Kun the model using the hoj1 object for (hetwork) meta-analyses

Description

This is the core function that runs the model in our program. Before running this function, we need to specify data, prior, JAGS code, etc. using nof1.nma.data.

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Usage

```
nof1.nma.run(
  nof1,
  inits = NULL,
  n.chains = 3,
  max.run = 1e+05,
  setsize = 10000,
  n.run = 50000,
  conv.limit = 1.05,
  extra.pars.save = NULL
)
```

Arguments

nof1 nof1 object created from nof1.nma.data function

inits Initial values for the parameters being sampled. If left unspecified, program will

generate reasonable initial values.

n. chains Number of chains to run

max.run Maximum number of iterations that user is willing to run. If the algorithm is not

converging, it will run up to max. run iterations before printing a message that it

did not converge

setsize Number of iterations that are run between convergence checks. If the algorithm

converges fast, user wouldn't need a big setsize. The number that is printed between each convergence checks is the gelman-rubin diagnostics and we would

want that to be below the conv.limit the user specifies.

n.run Final number of iterations that the user wants to store. If after the algorithm

converges, user wants less number of iterations, we thin the sequence. If the user wants more iterations, we run extra iterations to reach the specified number

of runs

conv.limit Convergence limit for Gelman and Rubin's convergence diagnostic.

extra.pars.save

Parameters that user wants to save besides the default parameters saved. See code using cat(nof1\$code) to see which parameters can be saved.

nof1.normal.simulation

Normal data simulation

Description

Simulating sample normal data

```
nof1.normal.simulation(
  Base.size = 2,
  Treat.size = 8,
  prec = 0.5,
  alpha = 50,
```

nof1.run

```
beta_A = -3,
  beta_B = -1
)
```

nof1.run

Run the model using the nof1 object for individual analysis

Description

This is the core function that runs the model in our program. Before running this function, we need to specify data, prior, JAGS code, etc. using nof1.data.

Usage

```
nof1.run(
  nof1,
  inits = NULL,
  n.chains = 3,
  max.run = 1e+05,
  setsize = 10000,
  n.run = 50000,
  conv.limit = 1.05,
  extra.pars.save = NULL
)
```

Arguments

nof1	nof1 object created from nof1.data function	
inits	Initial values for the parameters being sampled. If left unspecified, program will generate reasonable initial values.	
n.chains	Number of chains to run	
max.run	Maximum number of iterations that user is willing to run. If the algorithm is not converging, it will run up to max. run iterations before printing a message that it did not converge	
setsize	Number of iterations that are run between convergence checks. If the algorithm converges fast, user wouldn't need a big setsize. The number that is printed between each convergence checks is the gelman-rubin diagnostics and we would want that to be below the conv.limit the user specifies.	
n.run	Final number of iterations that the user wants to store. If after the algorithm converges, user wants less number of iterations, we thin the sequence. If the user wants more iterations, we run extra iterations to reach the specified number of runs	
conv.limit	Convergence limit for Gelman and Rubin's convergence diagnostic.	
extra.pars.save		

Parameters that user wants to save besides the default parameters saved. See code using cat(nof1\$code) to see which parameters can be saved.

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Value

nof1	nof1 object
inits	Initial values that are either specified by the user or generated as a default
pars.save	Parameters that are saved. Add more parameters in extra.pars.save if other variables are desired
data_rjags	Data that is put into rjags function jags.model
burnin	Half of the converged sequence is thrown out as a burnin
n.thin	If the number of iterations user wants (n.run) is less than the number of converged sequence after burnin, we thin the sequence and store the thinning interval
samples	MCMC samples stored using jags. The returned samples have the form of mcmc.list and can be directly applied to coda functions
max.gelman	Maximum Gelman and Rubin's convergence diagnostic calculated for the final sample

Examples

```
laughter
Y <- laughter$Y
Treat <- laughter$Treat
nof1 <- nof1.data(Y, Treat, ncat = 11, baseline = "Usual Routine", response = "ordinal")
result <- nof1.run(nof1)
summary(result$samples)</pre>
```

Description

Creates a posterior probability barplot for treatments

Usage

```
probability_barplot(result.list)
```

Arguments

result.list A list of one or more modeling results from nof1.run.

raw_table 11

raw	table
ıaw	_ Labie

Summary data table for nof1

Description

Provides a summary data table for the particular outcome in a particular dataset.

Usage

```
raw_table(nof1)
```

Arguments

nof1

nof1 object created using nof1.data

Value

Gives a comprhensive table with several statistical values. Each column indicates the value given. For a normal or poisson response type the following are given:

Treat	The treatment recieved
mean	The average value of the outcome
sd	The standard deviation for the outcome
2.5%	2.5% of the data are equal to or less than this value
50%	50% of the data are equal to or less than this value
97.5%	97.5% of the data are equal to or less than this value

For a binomial or ordinal response type, returns a table where first row is each treatment and the following rows are the the number of data points taken at each possible value.

Examples

```
Y <- laughter$Y
Treat <- laughter$Treat
nof1 <- nof1.data(Y, Treat, ncat = 11, baseline = "Usual Routine", response = "ordinal")
raw_table(nof1)</pre>
```

```
stacked_percent_barplot
```

Stacked_percent_barplot for raw data (for ordinal or binomial data)

Description

Stacked_percent_barplot for raw data (for ordinal or binomial data)

```
stacked_percent_barplot(nof1)
```

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Arguments

nof1 nof1 object created using nof1.data

Examples

```
Y <- laughter$Y
Treat <- laughter$Treat
nof1 <- nof1.data(Y, Treat, ncat = 11, baseline = "Usual Routine", response = "ordinal")
stacked_percent_barplot(nof1)</pre>
```

summarize_nof1

Function to present a summary of our results

Description

A neat function to summarize the results.

Usage

```
summarize_nof1(result, alpha = 0.05)
```

Arguments

result Modeling result of class nof1.result produced by nof1.run alpha The alpha value for the confidence interval. The default is 0.05.

Value

The function computes and returns a list of summary statistics of the raw data and the fitted model.

```
The raw mean of the outcome for each treatment
raw.y.mean
                  The raw median of the outcome for each treatment
raw.y.median
post.coef.mean The posterior mean of the coefficient for each treatment
post.coef.median
                  The posterior median of the coefficient for each treatment
post.y.mean
                  The posterior mean of the outcome for each treatment
                  The posterior median of the outcome for each treatment
post.y.median
post.coef.ci
                  The credible interval of the coefficient for each treatment
                  The credible interval of the outcome for each treatment
post.y.ci
comp.treat.post.coef
                  The posterior quantiles of one coefficient minus the other when comparing two
                  treatments
p.comp.coef.greater.0
```

The posterior probability of one coefficient minus the other greater than 0

time_series_plot 13

time_series_plot

time series plot across different interventions

Description

time series plot across different interventions

Usage

```
time_series_plot(
  result,
  baseline.treat.name = NULL,
  plot.by.treat = T,
  overlay.with.model = F,
  predict.model = F,
  trial.start = NULL,
  trial.end = NULL,
  timestamp.format = NULL,
  ...
)
```

Arguments

```
Modeling result of class nof1.result produced by nof1.run.
result
baseline.treat.name
                  Name for reference treatment. Default is NULL.
                  Whether or not the measurements should be plotted in different panels by treat-
plot.by.treat
                  ment. The default is T.
overlay.with.model
                  Whether or not the model prediction should be plotted. The default is F.
predict.model
                  Indicator for whether or not a prediction line should be plotted over the study
                  period. Option when overlay.with.model = TRUE.
trial.start
                  Start time of the trial specified with timestamp. format.
trial.end
                  End time of the trial specified with timestamp.format.
timestamp.format
```

Examples

Format of the trial.start and trial.end.

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trt_eff_plot

Errorbars for the credible interval of the treatment effect

Description

Creates errorbars for the credible interval of estimated treatment effect

Usage

```
trt_eff_plot(result.list, level = 0.95, ...)
```

Arguments

 $\begin{tabular}{ll} result.1 ist & A list of one or more modeling results from nof1.run. \\ level & The level of the credible intervals. The default is 0.95. \\ \end{tabular}$

... parameters to pass to geom_errorbar.

wrap

For PCORI purposes

Description

For PCORI purposes

Usage

```
wrap(data, metadata)
```

wrap2

For PCORI purposes

Description

For PCORI purposes

```
wrap2(data, metadata)
```

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