# Package 'bayesnec'

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Concentration (NEC) package. R package version 1. https://github.com/AIMS/bayesnec
Version 1.0
<b>Description</b> bayesnec is a No-Effect-Concentration estimation package that uses brms to fit concentration(dose)-response data using bayesiam methods for the purpose of estimating both ecx values, but more particularly nec. Please see ?bayesnec for more details.
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check_data define_model dispersion extract_ecx extract_ecx.bayesmanecfit extract_ecx.bayesnecfit extract_modstats extract_simdat

2 check\_data

	fit_bayesmanec	
	fit_bayesnec	
	$modify \ . \ . \ . \ . \ . \ . \ . \ . \ . \ $	
	plot.bayesmanecfit	
	plot.bayesnecfit	
	predict.bayesnecfit	
	set_distribution	
Index		16

## Description

Check data input for a bayesian nec model fit

## Usage

```
check_data(
  data,
  x_var,
  y_var,
  trials_var,
  x_type = NA,
  y_type = NA,
  over_disp,
  model
)
```

## Arguments

data	a data.frame containing the data to use for the model
x_var	the column heading indicating the concentration (x) variable
y_var	the column heading indicating the response (y) variable
trials_var	the column heading indicating the column for the number of "trials" for binomial response data. If not supplied, the model may run but will not be the model you intended!
x_type	the statistical distribution to use for the x (concentration) data. This will be guess based on the characteristic of the input data if not supplied.
y_type	the statistical distribution to use for the y (response) data. This may currently be one of 'binomial', 'poisson',' 'gaussian', or 'gamma'. Others can be added as required, please contact the package maintainer. If not supplied, the appropriate distribution will be guessed based on the distribution of the input data.
over_disp	If an overdispersed model should be used. Only changes the model fit for poisson and binomial y_type data. For poisson, a negative binomial model will be fit. For binomial a beta model will be fit.
model	The type of model to be fit. Currently takes values of "nec3param", "nec4param", "necsigmoidal", "nechorme", "ecx4param", "ecxwb1", or "ecxwb2".

define\_model 3

#### **Details**

This is a wrapper function to test input data criteria and write the brms model file for use in a bayesnec model fit

#### Value

Modified elements of the bayesnec input data.

|--|--|

## Description

Writes an NEC model file for a three parameter model (top, beta and NEC) and generates a function for initial values to pass to jags

## Usage

```
define_model(model, x_type, y_type, mod_dat)
```

## Arguments

model	a character string indicating the model to fit
x_type	the statistical distribution to use for the x (concentration) data. This may currently be one of 'beta', 'gaussian', or 'gamma'. Others can be added as required, please contact the package maintainer.
y_type	the statistical distribution to use for the y (response) data. This may currently be one of 'binomial', 'beta', 'poisson', 'gaussian', 'negbin' or 'gamma'. Others can be added as required, please contact the package maintainer.
mod_dat	the model data to use for the NEC model fit

#### Value

a model formula, priors and the family to use

|--|

## Description

Calculates posterior dispersion metric

```
dispersion(model, summary = FALSE)
```

4 extract\_ecx

#### **Arguments**

model An object of class brmsfit whose distribution family is either gaussian, poisson

or binomial.

summary Logical. Should summary stats be returned instead of full vector? Defaults to

FALSE.

#### **Details**

This function calculates a dispersion metric which takes the ratio between the observed relative to simulated Pearson residuals sums of squares.

#### Value

If summary is FALSE, an n-long numeric vector containing the dispersion metric, where n is the number of post warm-up posterior draws from the brmsfit object. If TRUE, then a data.frame containing the summary stats (mean, median, 95% highest density intervals). of the dispersion metric.

#### **Examples**

```
## Not run:
library(brms)
set.seed(10)
dt <- data.frame(predictor = rpois(60, lambda = 15))</pre>
dt$response <- dt$predictor + round(rnorm(nrow(dt), 0, 1))</pre>
# mimic overdispersion
dt$response_od <- abs(dt$predictor + round(rnorm(nrow(dt), 0, 10)))</pre>
mod_pois <- brm(response ~ predictor, dt, family = poisson())</pre>
mod_pois_od <- brm(response_od~predictor, dt, family = poisson())</pre>
dispersion(mod_pois)
dispersion(mod_pois_od)
# compare with regular dispersion parameter
# from quasipoisson glm
dispersion(mod_pois, summary = TRUE)
\verb|summary(glm(response ~ predictor, data = dt, family = quasipoisson)||
dispersion(mod_pois_od, summary = TRUE)
summary(glm(response_od ~ predictor, data = dt, family = quasipoisson))
## End(Not run)
```

extract\_ecx

extract\_ecx

#### **Description**

Extracts the predicted ecx value as desired from a bayesnec or a bayesmanec model fit.

#### Usage

```
extract_ecx(
   X,
   ecx_val = 10,
   precision = 1000,
   posterior = FALSE,
   type = "absolute",
   hormesis_def = "control",
   xform = NA,
   x_range = NA,
   prob_vals = c(0.5, 0.025, 0.975),
   link = "identity"
)
```

#### **Arguments**

X a jag model fit as returned by a call to bayes from fit\_bayesnec

ecx\_val the desired percentage effect value. This must be a value between 1 and 99 (for

type = "relative" and "absolute"), defaults to 10.

precision The number of unique x values over which to find ecx - large values will make

the ecx estimate more precise.

posterior A logical value indicating if the full posterior sample of calculated ecx values

should be returned instead of just the median and 95 credible intervals

type a character vector, taking values of "relative", "absolute" (the default) or "direct".

Type "relative" is calculated as the percentage decrease from the maximum predicted value of the response (top) to the minimum predicted value of the response. Type "absolute" (the default) is calculated as the percentage decrease from the maximum value of the response (top) to 0 (or bot for a 4 parameter model fit). Type "direct" provides a direct estimate of the x value for a given y. Note that for the current version, ecx for an necHormesis model is estimated at

a percent decline from the control

xform A function to apply to the returned estimated concentration values

x\_range A range of x values over which to consider extracting ecx

prob\_vals A vector indicating the probability values over which to return the estimated

ecx value. Defaults to 0.5 (median) and 0.025 and 0.975 (95 percent credible

intervals).

#### Value

A vector containing the estimated ecx value, including upper and lower 95 percent Credible Interval bounds

#### **Description**

Extracts the predicted ecx value as desired from a bayesnec model fit obeject

#### Usage

```
extract_ecx.bayesmanecfit(
   X,
   ecx_val = 10,
   precision = 1000,
   posterior = FALSE,
   type = "absolute",
   hormesis_def = "control",
   xform = NA,
   x_range = NA,
   prob_vals = c(0.5, 0.025, 0.975)
)
```

## **Arguments**

X	a fitted bayesmanec model object, containing a list of jag model fit as returned by a call to bayes from fit_bayesnec
ecx_val	the desired percentage effect value.
precision	The number of unique x values over which to find ecx.
posterior	A logical value indicating if the full posterior sample of calculated ecx values should be returned instead of just the median and 95 credible intervals.
type	a character vector indicating if relative or absolute values for the ecx should be calculated.
xform	A function to apply to the returned estimated concentration values
prob_vals	A vector indicating the probability values over which to return the estimated ecx value.

## Value

A vector containing the estimated ecx value, including upper and lower 95 percent Credible Interval bounds

## Description

Extracts the predicted ecx value as desired from a bayesnec model fit obeject

```
extract_ecx.bayesnecfit(
   X,
   ecx_val = 10,
   precision = 1000,
   posterior = FALSE,
   type = "absolute",
   hormesis_def = "control",
```

extract\_modstats 7

```
x_range = NA,
xform = NA,
prob_vals = c(0.5, 0.025, 0.975)
)
```

#### **Arguments**

X a jag model fit as returned by a call to bayes from fit\_bayesnec

ecx\_val the desired percentage effect value.

precision The number of unique x values over which to find ecx.

posterior A logical value indicating if the full posterior sample of calculated ecx values

should be returned instead of just the median and 95 credible intervals.

type a character vector indicating if relative or absolute values for the ecx should be

calculated.

xform A function to apply to the returned estimated concentration values

prob\_vals A vector indicating the probability values over which to return the estimated ecx

value.

#### Value

A vector containing the estimated ecx value, including upper and lower 95 percent Credible Interval bounds

## Description

Extracts a range of statistics from a list of bayesnecfit model fits.

#### Usage

```
extract_modstats(mod_fits)
```

#### **Arguments**

mod\_fits a bayesMAnecfit mod\_fits output list, as returned by fit.bayesMAnec

#### Value

A list of model statistical output derived from the input model list

8 fit\_bayesmanec

 $extract\_simdat$ 

extract\_simdat

## Description

Extracts a range of statistics from a list of bayesnecfit model fits.

#### Usage

```
extract_simdat(modfit)
```

#### **Arguments**

modfit

a bayesnecfit, as returned by fit\_bayesnec

#### Value

A list of model simulation statistics including iter, thin, warmup and chains

fit\_bayesmanec

fit\_bayesmanec

## Description

Fits a variety of nec models using bayes and provides a model averaged predictions based on DIC model weights

```
fit_bayesmanec(
   data,
   x_var,
   y_var,
   trials_var = NA,
   x_type = NA,
   iter = 20000,
   over_disp = FALSE,
   model_set = "all",
   sig_val = 0.025,
   x_range = NA,
   ...
)
```

fit\_bayesnec 9

## Arguments

data	A data frame containing the data to use for the model
x_var	The column heading indicating the concentration (x) variable
y_var	The column heading indicating the response (y) variable
trials_var	The column heading indicating the column for the number of "trials" for binomial response data. If not supplied, the model may run but will not be the model you intended!
x_type	the statistical distribution to use for the x (concentration) data. This will be guess based on the characteristic of the input data if not supplied. As some concentration-response data will use zero concentration, and there is no distribution on the continuous scale from 0 to in (ie tweedie) available in bayes, a small offset is added $(1/10^3)$ of the next lowest value to zero values of concentration where these are gamma distributed.
y_type	the statistical distribution to use for the y (response) data. This may currently be one of 'binomial', 'poisson',' 'gaussian', or 'gamma'. Others can be added as required, please contact the package maintainer. If not supplied, the appropriate distribution will be guessed based on the distribution of the input data.
iter	the number of interations to for the brms fit. Defaults to 2e4.
over_disp	If an overdispersed model should be used. Only changes the model fit for poisson and binomial y_type data. For poisson, a negative binomial model will be fit. For binomial a beta model will be fit.
model_set	A vector of the names of model types to be fit. Currently defaults to all available model types. If "nec" is supplied, only the nec models will be fit. If "ecx" is supplied, only continuous curve models will be fit.
sig_val	Probability value to use as the lower quantile to test significance of the predictor posterior values against the control, to estimate nec as an interpolated NOec value from smooth ecx curves.

## Value

All successully fitted bayes model fits, mod.stats a data.frame of model fit statistics, nec a model averaged posterior of the estimated nec, and pred.vals a list of model averaged predictions.

fit_bayesnec fit_bayesnec
---------------------------

## Description

Fits a concentration(dose)-response model using brms

```
fit_bayesnec(
  data,
  x_var,
  y_var,
  trials_var = NA,
  x_type = NA,
```

10 fit\_bayesnec

```
y_type = NA,
x_range = NA,
precision = 1000,
over_disp = FALSE,
model = "nec3param",
sig_val = 0.025,
iter = 20000,
warmup = floor(iter/5) * 4,
...
)
```

## **Arguments**

data	a data.frame containing the data to use for the model fit
x_var	the column heading indicating the concentration (x) variable
y_var	the column heading indicating the response (y) variable
trials_var	the column heading indicating the column for the number of "trials" for binomial response data. If not supplied, the model may run but will not be the model you intended! #' @param x_type the statistical distribution to use for the x (concentration) data. This will be guess based on the characteristic of the input data if not supplied.
y_type	the statistical distribution to use for the y (response) data. This may currently be one of 'binomial', 'poisson',' 'gaussian', or 'gamma'. Others can be added as required, please contact the package maintainer. If not supplied, the appropriate distribution will be guessed based on the distribution of the input data.
x_range	The range of x values over which to obtain posterior predictions. Used for plot.bayesnecfit and to calculate nec for ecx models.
precision	The length of the x_seq to pass to posterior_predict as new data. Used for plot.bayesnecfit and to calculate nec for ecx models.
over_disp	If an overdispersed model should be used. Only changes the model fit for poisson and binomial y_type data. For poisson, a negative binomial model is used. For binomial a beta model is used.
model	The type of model to be fit. Currently takes values of "nec3param", "nec4param", "necsigm", "nechorme", "ecx4param", "ecxwb1", "ecxexp", "ecxlin", or "ecxwb2".
sig_val	Probability value to use as the lower quantile to test significance of the predictor posterior values against the control, to estimate nec as an interpolated NOEC value from smooth ecx curves.
iter	the number of interations for the brms fit. Defaults to 2e4.
warmup	the number of warmup iterations. Defaults to 4/5ths of iter.
	further arguments to be passed to brm.

#### **Details**

As some concentration-response data will use zero concentration which can cause numerical estimation issues, a small offset is added (1/10th of the next lowest value) to zero values of concentration where x\_var are gamma distributed.

All models provide an estimate for nec. For model types with "nec" as a prefix, nec is directly estimated as a paremeter in the model. Models with "ecx" as a prefix are continuous curve models, tyipically used for extracting ecx values from concentration response data. In this instance the

modify 11

nec value is defined as the concentration at which there is a user supplied (see sig\_val) percentage certainty (based on the Bayesian posterior estimate) that the response falls below the estimated value of the upper assymptote (top) of the response (i.e the response value is significantly lower than that expected in the case of no exposure).

#### Value

The fitted brms model, including an estimate of the nec value and predicted posterior values. A posterior sample of the nec is also available under \$nec\_posterior

modify	modify		
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## Description

Modifies an existing bayesmanecfit object, for example, but adding or removing fitted models.

#### Usage

```
modify(object, model_set = NA, drop_models = NA, add_models = NA)
```

## Arguments

object	a bayesmanecfit output list, as returned by fit.bayesmanec
model_set	A character vector containing the of names of model types to be included in the modified fit.
drop_models	A character vector containing the names of model types you which to drop for the modified fit.
add_models	A character vector containing the names of model types to add to the modified fit.

#### Value

All successully fitted bayesmanecfit model fit.

## Description

Generates a plot of a fitted bayes nec model, as returned by fit.bayesnec.

12 plot.bayesmanecfit

#### Usage

```
## S3 method for class 'bayesmanecfit'
plot(
  Χ,
  CI = TRUE,
  add_nec = TRUE,
  position_legend = "topright",
  add_ec10 = FALSE,
  xform = NA,
  1xform = NA,
  jitter_x = FALSE,
  jitter_y = FALSE,
  ylab = "response",
  xlab = "concentration",
  x_{lim} = NA,
  y_{lim} = NA,
  xticks = NA,
  all_models = FALSE,
)
```

#### **Arguments**

X the bayes nec model fit as returned by fit.bayesnec.

CI a logical value indicating if confidence intervals on the model fit should be plot-

ted, calculated as the upper and lower bounds of the individual predicted values

from all posterior samples

add\_nec a logical value indicating if the estimated nec value and 95% credible intervals

should be added to the plot.

position\_legend

a vector indicating the location of the nec or ec10 legend, as per a call to legend.

add\_ec10 a logical value indicating if an estimated ec10 value and 95% credible intervals

should be added to the plot.

xform a function to be applied as a transformation of the x data.

1xform a function to be applied as a transformation only to axis labels and the annoted

nec/ec10 values.

jitter\_x a logical value indicating if the x data points on the plot should be jittered.

jitter\_y a logical value indicating if the y data points on the plot should be jittered.

ylab a character vector to use for the y-axis label xlab a character vector to use for the x-axis label

x\_lim a numeric vector of length two to use for the lower and uper limits of the x-axis

range

y\_lim a numeric vector of length two to use for the lower and uper limits of the y-axis

range

xticks a numeric vector indicate where to place the tick marks of the x-axis

all\_models Logical indicating if all models in the model set should be plotted simultaneousl,

or if a model average plot should be returned.

plot.bayesnecfit 13

#### Value

a plot of the fitted model

plot.bayesnecfit plot.bayesnecfit

## Description

Generates a plot of a fitted bayes nec model, as returned by fit.bayesnec.

## Usage

```
## S3 method for class 'bayesnecfit'
plot(
  Χ,
  CI = TRUE,
  add_nec = TRUE,
  position_legend = "topright",
  add_ec10 = FALSE,
  xform = NA,
  1xform = NA,
  jitter_x = FALSE,
  jitter_y = FALSE,
  ylab = "response",
  xlab = "concentration",
  x_{lim} = NA,
  y_{lim} = NA,
  xticks = NA,
)
```

## **Arguments**

X	the bayes nec model fit as returned by fit.bayesnec.		
CI	a logical value indicating if confidence intervals on the model fit should be plotted, calculated as the upper and lower bounds of the individual predicted values from all posterior samples		
add_nec	a logical value indicating if the estimated nec value and $95\%$ credible intervals should be added to the plot.		
position_legend			
	a vector indicating the location of the nec or ec10 legend, as per a call to legend.		
add_ec10	a logical value indicating if an estimated ec $10$ value and $95\%$ credible intervals should be added to the plot.		
xform	a function to be applied as a transformation of the x data.		
lxform	a function to be applied as a transformation only to axis labels and the annoted $nec/ec10$ values.		
jitter_x	a logical value indicating if the x data points on the plot should be jittered.		
jitter_y	a logical value indicating if the y data points on the plot should be jittered.		

set\_distribution

ylab	a character vector to use for the y-axis label
xlab	a character vector to use for the x-axis label
x_lim	a numeric vector of length two to use for the lower and uper limits of the x-axis range
y_lim	a numeric vector of length two to use for the lower and uper limits of the y-axis range
xticks	a numeric vector indicate where to place the tick marks of the x-axis

#### Value

a plot of the fitted model

```
predict.bayesnecfit predict.bayesnecfit
```

## Description

predict.bayesnecfit

#### Usage

```
## S3 method for class 'bayesnecfit'
predict(X, precision = 100, x_range = NA)
```

## **Arguments**

X the bayesnec model fit (as returned by fit\_bayesnec)
precision the number of x values over which to predict values
x\_range The range of x values over which to make predictions

#### Value

A list containing x and fitted y, with up and lw values

set_distribution	Sets distribution based on vector		
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## Description

Sets distribution based on vector

```
set_distribution(x, support_integer = FALSE, trials = NULL)
```

set\_distribution 15

#### **Arguments**

```
x a numeric vector.
support_integer

Logical. Should integer vectors be supported? Defaults to FALSE.
trials a numeric vector containing the number of trials. Defaults to NULL.
```

#### **Details**

Checks a vector and recommends a family distribution.

## Value

```
a character vector.
```

## **Examples**

```
library(bayesnec)
set_distribution(rpois(1000, lambda=10), support_integer = TRUE)
set_distribution(rnorm(1000))
set_distribution(x <- rgamma(1000, 2))
set_distribution(ifelse(x < 1, x, 1))
set_distribution(rbinom(1000, 10, 0.5), support_integer = TRUE, 10)</pre>
```

## **Index**

```
binomial, 4
brm, 10
brmsfit, 4
character, 15
check_data, 2
data.frame, 4
define_model, 3
extract_ecx, 4
extract_ecx.bayesmanecfit, 5
\verb|extract_ecx.bayes| necfit, 6
extract_modstats, 7
{\sf extract\_simdat}, 8
fit_bayesmanec, 8
fit_bayesnec, 9
gaussian, 4
integer, 15
{\tt modify}, {\color{red}11}
numeric, 4, 15
plot.bayes manecfit, 11
plot.bayesnecfit, 13
poisson, 4
predict.bayesnecfit, 14
set\_distribution, 14
```