# Package: moultmcmc (via r-universe)

October 26, 2024

**Title** Bayesian Inference for Avian Moult Phenology Models

**Version** 0.1.0 **Date** 2023-02-15

Description Precompiled Stan models to conduct full Bayesian inference in regression models for the phenology of avian primary moult based on the approach of Underhill & Zucchini (1988)
 DOI:10.1111/j.1474-919X.1988.tb00993.x> and related hierarchical models to accommodate repeated-measures data (within-season recaptures of individuals).

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**Encoding UTF-8** 

LazyData true

**Roxygen** list(markdown = TRUE)

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**LinkingTo** BH (>= 1.66.0), Rcpp (>= 0.12.0), RcppEigen (>= 0.3.3.3.0), RcppParallel (>= 5.0.1), rstan (>= 2.18.1), StanHeaders (>= 2.18.0)

Remotes cran/moult

SystemRequirements GNU make

**Suggests** testthat (>= 3.0.0), knitr, rmarkdown, remotes

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VignetteBuilder knitr

Repository https://pboesu.r-universe.dev

RemoteUrl https://github.com/pboesu/moultmcmc

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## RemoteRef HEAD

RemoteSha 0a343e0589955fd917239590339acf7e73d6940d

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## **Description**

Precompiled Stan models to conduct full Bayesian inference in regression models for the phenology of avian primary moult based on the approach of Underhill & Zucchini (1988) and related hierarchical models to accommodate repeated-measures data (within-season recaptures of individuals).

## References

Boersch-Supan et al. (2022) Bayesian inference for models of moult duration and timing in birds arXiv DOI:10.48550/arXiv.2205.12120

Underhill & Zucchini (1988) A model for a vian primary moult. Ibis 130:358 DOI:10.1111/j.1474-919X.1988.tb 00993.x

Stan Development Team (2022). RStan: the R interface to Stan. R package version 2.21.5. https://mc-stan.org compare\_plot 3

compare	plot	

Visual comparison of moult models

## **Description**

Visual comparison of moult models

## Usage

```
compare_plot(..., names = NULL)
```

# **Arguments**

two or a moult or moultmeme modelnamesoptional character vector of model names

#### Value

a plot comparing parameter estimates and their uncertainties

```
consolidate_moult_records
```

Consolidate a mixture of continuous and categorical moult records

# Description

This is a helper function to format input data for the Type 1+2 moult model.

#### Usage

```
consolidate_moult_records(moult_score, moult_cat)
```

## **Arguments**

 $moult\_score$  a numeric vector of (linearized) moult scores in [0,1] (0 = old plumage,1 = new

plumage).

moult\_cat a numeric vector of categorical moult codes (1 = old plumage,2 = moulting, 3 =

new plumage)

# Value

a numeric vector of scores and categorical records with values [0,1] for old, new and continuous active moult scores, and value 2 for categorical active moult records.

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fivef	maul	tmcmc
TIXPT	moni	TMCMC

Extract Population-Level Estimates

## **Description**

Extract the population-level ('fixed') effects from a moultmcmc object.

## Usage

```
## S3 method for class 'moultmcmc'
fixef(object, summary = TRUE, probs = c(0.025, 0.975), pars = NULL, ...)
```

## **Arguments**

summary logical, should posterior samples be summarised for each parameter

probs numeric, desired quantiles for summary statistics

pars Optional names of coefficients to extract. By default, all coefficients are ex-

tracted.

... Currently ignored.

## Value

If summary is TRUE, a matrix for the population-level effects. If summary is FALSE, a matrix with one row per posterior draw and one column per population-level effect.

loo.moultmcmc

Efficient approximate leave-one-out cross-validation (LOO)

## **Description**

Efficient approximate leave-one-out cross-validation (LOO)

```
## S3 method for class 'moultmcmc'
loo(x, cores = getOption("mc.cores", 1))
```

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#### **Arguments**

X

A moultmeme model object

cores

The number of cores to use for parallelization. This defaults to the option mc.cores which can be set for an entire R session by options(mc.cores = NUM-BER). The old option loo.cores is now deprecated but will be given precedence over mc.cores until loo.cores is removed in a future release. As of version 2.0.0 the default is now 1 core if mc.cores is not set, but we recommend using as many (or close to as many) cores as possible. Note for Windows 10 users: it is strongly recommended to avoid using the .Rprofile file to set mc.cores (using the cores argument or setting mc.cores interactively or in a script is fine).

#### Value

The loo() methods return a named list with class c("psis\_loo", "loo"). See ?loo::loo

moultmcmc

Bayesian inference for Underhill-Zucchini moult models and expansions

## **Description**

Bayesian inference for Underhill-Zucchini moult models and expansions

```
moultmcmc(
 moult_column,
 date_column,
  id_column = NULL,
  start_formula = ~1,
  duration_formula = ~1,
  sigma_formula = ~1,
  type = 2,
  lump_non_moult = FALSE,
  data,
  init = "auto",
  flat_prior = TRUE,
  beta_sd = 0,
  log_lik = FALSE,
  use_phi_approx = FALSE,
  active_moult_recaps_only = TRUE,
  same_sigma = FALSE,
)
```

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#### **Arguments**

moult\_column the name the column in data containing moult indices, i.e. a numeric vector of (linearized) moult scores in [0,1] (0 = old plumage, 1 = new plumage; for model types 1-5), numerical moult codes (1 = old plumage, 2 = moulting, 3 = newplumage; for model type 1), or a mixed column created by consolidate\_moult\_records for model type 12. date\_column the name the column in data containing sampling dates, encoded as days since an arbitrary reference date, i.e. a numeric vector id\_column (optional) factor identifier. Usually a season-individual combination to encode within-season recaptures, defaults to NULL. When provided moultmeme will attempt to fit the relevant recaptures model. start\_formula model formula for start date duration\_formula model formula for duration sigma\_formula model formula for start date sigma integer (one of 1,2,3,4,5,12) referring to type of moult data and consequently type model to be fitted (see details) lump\_non\_moult logical; should pre- and post-moult observations be treated as indistinguishable? if TRUE and type %in% c(1,2,12), the relevant lumped model will be fitted (see details). data Input data frame must contain a numeric column "date" and a column "moult cat" which is a numeric vector of categorical moult codes (1 = old plumage,2 = moulting,3 = new plumage). init Specification of initial values for all or some parameters. Can be the string "auto" for an automatic guess based on the data, or any of the permitted rstan options: the digit 0, the strings "0" or "random", or a function. See the detailed documentation for the init argument in rstan::stan. flat\_prior use uniform prior on start date and duration (TRUE) or vaguely informative truncated normal prior (FALSE). Defaults to TRUE. beta\_sd use zero-centred normal priors for regression coefficients other than intercepts? If <= 0 the stan default of improper flat priors is used. boolean retain pointwise log-likelihood in output? This enables model assesslog\_lik ment and selection via the loo package. Defaults to FALSE, can lead to very large output arrays when sample size is large. use\_phi\_approx logical flag whether to use stan's Phi approx function to calculate the "old" likelihoods active\_moult\_recaps\_only logical flag whether to ignore repeated observations outside the active moult same\_sigma logical flag, currently unused Arguments passed to rstan::sampling (e.g. iter, chains).

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## **Details**

type refers to the type of moult data available (see Underhill and Zucchini (1998) and Underhill, Zucchini and Summers (1990)).

type = 1 sample is representative of entire population (not yet moulting, in moult, and birds which have completed moult). For type 1 data, any value between 0 and 1 (> 0 and < 1) can be used as the moult index for birds in active moult. The value used does not matter, only the fact that they are in moult. type = 2 (default) sample is representative of entire population (not yet moulting, in moult, and birds which have completed moult). Moult scores are required.

type = 3 sample is representative only of birds in moult. Individuals with moult scores 0 or 1 are ignored.

type = 4 sample is representative only of birds in moult and those that have completed moult. Individuals with moult scores 0 are ignored.

type = 5 sample is representative only of birds that have not started moult or that are in moult. Individuals with moult scores 1 are ignored.

#### Value

An object of class stanfit returned by rstan::sampling

moult\_plot

moult\_plot generic

# Description

```
moult_plot generic
```

#### Usage

```
moult_plot(...)
```

## **Arguments**

... ...

## Value

•••

moult\_plot.moult

Moult plot for moult model

# Description

Moult plot for moult model

## Usage

```
## S3 method for class 'moult'
moult_plot(x, prob = 0.95, plot_data = TRUE, plot = TRUE, ...)
```

## **Arguments**

moult model object created with moult::moult
 prob coverage probability of active moult in the sampled population
 plot\_data logical, if TRUE plot observations
 plot logical, if TRUE (default) return a plot, else return a dataframe with start and

end dates of moult based on model intercepts

not currently used

## Value

. . .

a plot or data.frame

moult\_plot.moultmcmc

Moult plot for moultmcmc model

# **Description**

Moult plot for moultmeme model

```
## $3 method for class 'moultmcmc'
moult_plot(
    x,
    prob = 0.95,
    prob_ci = NULL,
    plot_data = TRUE,
    plot = TRUE,
    newdata = NULL,
    col.data = NULL,
    ...
)
```

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## **Arguments**

Χ

prob coverage probability of active moult in the sampled population

prob\_ci coverage probability of credible interval

moultmeme model object

plot\_data logical, if TRUE plot observations

plot logical, if TRUE (default) return a plot, else return a dataframe with start and

end dates of moult based on model intercepts

newdata optional data.frame of conditions to plot (passed to predict.moultmcmc)

col.data optional, name of column in model data to colour data points

... not currently used

## Value

a plot or data.frame

namedList

internal helper function to create a named list

# Description

original version by Ben Bolker: https://stackoverflow.com/a/16951524

# Usage

```
namedList(...)
```

## **Arguments**

... args

# Value

a named list

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predict.moultmcmc

Predict method for moultmcmc models

# Description

Predict method for moultmeme models

# Usage

```
## S3 method for class 'moultmcmc'
predict(
  object,
  newdata = NULL,
  predict.type = "parameters",
  summary = TRUE,
  intervals = 0.1,
  prob = 0.95,
  ...
)
```

## Arguments

object a fitted moultmcmc model

newdata data.frame with explanatory variables for which to make predictions

predict.type specifies form of predictions, see details.

summary logical, if TRUE (default) return a data.frame of posterior means, otherwise re-

turn a list of arrays of the full posterior sample of the predicted quantity (with one list element per predicted quantity and array dimensions nrow(newdata)

\*number or posterior draws)

intervals not currently used

prob nominal coverage probability of credible interval

... further arguments

## Value

a data.frame or list, depending on input arguments

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ranef.moultmcmc	Extract Individual-Level Estimates

# Description

Extract the individual-level ('random') effects from a moultmcmc object.

## Usage

```
## S3 method for class 'moultmcmc' ranef(object, summary = TRUE, probs = c(0.025, 0.975), pars = NULL, ...)
```

# Arguments

object	a moultmcmc model
summary	logical, should posterior samples be summarised for each parameter
probs	numeric, desired quantiles for summary statistics
pars	Optional names of coefficients to extract. By default, all coefficients are extracted.
	Currently ignored.

# Value

If summary is TRUE, a matrix for the individual-level effects. If summary is FALSE, a matrix with one row per posterior draw and one column per individual-level effect.

recaptures	Simulated moult scores for 235 individuals with no heterogeneity in duration

# Description

A dataset containing the moult scores and capture dates for a simulated population of passerines including recaptures

## Usage

recaptures

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#### **Format**

A data frame with 299 rows and 13 variables:

id individual identifier

sample\_size number of observations for the said individual

start\_date individual moult initiation date

duration individual duration

set simulation set

date\_sampled observation date (days since January 01)

pfmg\_sampled true PFMG at sampling occasion

pfmg\_with\_error PFMG incorporating measurement error, if any

sampling\_bias descriptor of sampling bias type, if any

prop\_recaptured\_individuals proportion of individuals with more than 1 capture

rel\_tau\_sd relative population standard deviation of the moult duration

obs\_error measurement error

scenario simulation scenario

#### **Source**

P. Boersch-Supan

recaptures2

Simulated moult scores for 235 individuals with heterogeneity in durations

## **Description**

A dataset containing the moult scores and capture dates for a simulated population of passerines including recaptures. Simulation is based on an underlying population moult start date of 196.83, moult duration of 77.80 days and a population standard deviation of the start date of 8.1 days.

## Usage

recaptures2

#### **Format**

A data frame with 299 rows and 13 variables:

id individual identifier

sample size number of observations for the said individual

start\_date individual moult initiation date

duration individual duration

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```
set simulation set
    date_sampled observation date (days since January 01)
    pfmg_sampled true PFMG at sampling occasion
    pfmg_with_error PFMG incorporating measurement error, if any
    sampling_bias descriptor of sampling bias type, if any
    prop_recaptured_individuals proportion of individuals with more than 1 capture
    rel_tau_sd relative population standard deviation of the moult duration
    obs_error measurement error
    scenario simulation scenario
Source
    P. Boersch-Supan
  residual_plot
                            residual_plot generic
Description
    residual_plot generic
Usage
    residual_plot(...)
Arguments
    . . .
Value
```

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## **Description**

This function displays a plot that shows where observed dates and moult scores fall relative to the predictions of the fitted model. Active moult observations should generally fall within +/- 3 start-date standard deviations of the regression line.

# Usage

```
## S3 method for class 'moult'
residual_plot(x, plot = TRUE, ...)
```

# Arguments

X	moult model object created with moult::moult
plot	logical, if TRUE (default) return a plot, else return a data.frame with calculated quantities
	not currently used

## Value

a plot

siskins

Moult records of Eurasian Siskins

# Description

A dataset containing simulated moult scores and capture dates of Eurasian Siskins (Spinus spinus), based on a sub-urban Scottish population.

## Usage

siskins

#### **Format**

```
A data frame with 299 rows and 3 variables:
```

```
yday sampling date (days since Jan 01)
pfmg PFMG at sampling occasion
id individual identifier
start_date "true" individual start date
duration "true" individual moult duration
```

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## **Source**

Philipp Boersch-Supan

#### References

Insley et al. (in prep). Breeding and moult phenology of siskins in the Scottish Highlands.

summary.moultmcmc

Summary method for moultmcmc models

# Description

Summary method for moultmeme models

# Usage

```
## S3 method for class 'moultmcmc'
summary(object, ...)
```

# Arguments

object a moultmeme object ... passed to summary\_table

## Value

a summary table

summary\_table

Summary table generic

# Description

Summary table generic

# Usage

```
summary_table(...)
```

# Arguments

... ...

## Value

•••

```
summary_table.moult Summary Table for moult model
```

## Description

Summary Table for moult model

# Usage

```
## S3 method for class 'moult'
summary_table(x, prob = 0.95, tidy_names = TRUE, ...)
```

## **Arguments**

```
x moult model object created with moult::moult
prob nominal coverage probability of confidence interval
tidy_names adjust default parameter names from moult() to follow consistent nomenclature
of model.matrix()
... not currently used
```

## Value

a tibble

# **Examples**

```
## Not run: m1 <- moult::moult(Mindex ~ Day, data = sanderlings)
## Not run: summary_table(m1)</pre>
```

summary\_table.moultmcmc

Summary Table

# Description

Summary Table

```
## S3 method for class 'moultmcmc'
summary_table(
    x,
    pars = x$stanfit@sim$pars_oi,
    prob = 0.95,
    include = TRUE,
    ...
)
```

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#### **Arguments**

x moultmeme fit object

pars A character vector of parameter names. The default is all parameters for which

samples are saved. If include = FALSE, then the specified parameters are ex-

cluded from the printed summary.

prob nominal coverage probability of credible interval

include Logical scalar (defaulting to TRUE) indicating whether to include or exclude

the parameters named by the pars argument.

... Additional arguments passed to the summary method for stanfit objects.

#### Value

a tibble

weavers\_processed

Moult records of Southern Masked Weavers

# **Description**

A dataset containing the moult scores and capture dates for Southern Masked Weavers (Ploceus velatus) from the Western Cape, South Africa.

## Usage

weavers\_processed

#### **Format**

A data frame with 5282 rows and 6 variables:

**RDate** sampling date (calendar date)

Sex SAFRING sex code

Year Sampling Year

Moult feather scores for primaries

pfmg Proportion of feather mass grown

day sampling date (days since August 01 of each year)

#### **Source**

Erni et al. 2013

## References

Oschadleus 2005, Patterns of primary moult in the weavers, Ploceidae. University of Cape Town.

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