# Package 'bsreg'

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| <b>Description</b> Fit Bayesian models with a focus on the spatial econometric models.   |  |  |  |  |
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bsreg-package

Bayesian Spatial Regression Models

# **Description**

Fit Bayesian models with a focus on the spatial econometric models.

bm

Fit a Bayesian model

# **Description**

Fit a Bayesian model

# Usage

```
bm(x, ...)
## S3 method for class 'formula'
bm(
 Х,
  data = NULL,
  n_save = 1000L,
 n_burn = 500L,
 options = set_options(),
 mh = set_mh(),
 verbose = TRUE,
 W,
 X_SLX,
  type = c("lm", "slx", "sar", "sem", "sdm", "sdem", "sv"),
)
## S3 method for class 'bm'
bm(x, n\_save = 1000L, n\_burn = 0L, verbose = TRUE, ...)
blm(...)
bslx(...)
bsar(...)
bsem(...)
```

cigarettes 3

```
bsdm(...)
bsdem(...)
bsv(...)
```

#### **Arguments**

x Formula or bm object to sample with.

... Not used.

data A data. frame containing the variables in the model.

n\_save, n\_burn Integer scalar. Number of draws for the burn-in period and to store for inference.

options Settings for the prior setup. See set\_options.

mh Settings to tune the Metropolis-Hastings step. See set\_mh.

verbose Logical scalar. Whether to print status updates.

W Numeric matrix (or function to construct one) with the spatial connectivities.

X\_SLX Numeric matrix with explanatory variables that should be lagged spatially.

type Character scalar used to specify the desired model.

#### Value

Returns a list with draws from the specified Bayesian model and an object to obtain further samples.

# **Examples**

```
N <- 100L
beta <- 1:5
X <- matrix(rnorm(N * 5), N, 5)
y <- X %*% beta + rnorm(N)
bm(y ~ X, n_burn = 100, n_draw = 100)
# Reproduce the linear model in Kuschnig (2022)
blm(log(sales) ~ log(price / cpi) + log(ndi / cpi) + factor(name) + factor(year), data = cigarettes)</pre>
```

cigarettes

Cigarette demand

#### **Description**

Panel dataset on cigarette demand in 46 US states from 1963 until 1992, see Baltagi and Levin (1992) and Baltagi and Li (2004). Extended with longitude and latitude from the us\_states dataset.

4 coda

#### Usage

cigarettes

#### **Format**

A data.frame object.

#### References

Baltagi, B. H. and Levin, D. (1992). Cigarette taxation: raising revenues and reducing consumption, *Structural Change and Economic Dynamics*, **3(2)**, 321-335. doi: 10.1016/0954349X(92)90010-4. Baltagi, B. H. and Li, D. (2004). Prediction in the panel data model with spatial correlation. *Advances in Spatial Econometrics*, 283-295. Springer, Berlin. doi: 10.1007/9783662056172\_13.

coda

Methods for coda Markov chain Monte Carlo objects

# Description

Methods to convert parameter and/or coefficient draws to coda's mcmc format for further processing.

# Usage

```
as.mcmc.bm(x, ...)
```

#### **Arguments**

x A bm object, obtained from bm.

... Other parameters for as.mcmc.

#### Value

Returns a coda mcmc object.

sample 5

| sample | Obtain draws from a Bayesian model sampler |
|--------|--|
|        |  |

# Description

Obtain draws from a Bayesian model sampler

# Usage

```
sample(x, n\_save = 1000L, n\_burn = 0L, mh = set\_mh(), verbose = TRUE)
```

# Arguments

x Bayesian model
 n\_save, n\_burn Integer scalar with number of draws to save / burn.
 mh Settings to tune the Metropolis-Hastings step. See set\_mh.
 verbose Logical scalar. Whether to print status updates.

#### Value

Returns a numeric matrix with stored draws. The Bayesian model is modified in place.

| set_mh    | Settings to tune a Metropolis-Hastings step |
|-----------|---|
| Set_IIII1 | settings to tune a metropous-rastings step  |

# Description

Settings to tune a Metropolis-Hastings step

# Usage

```
set_mh(adjust_burn = 0.8, acc_target = c(0.2, 0.45), acc_change = 0.01)
```

# **Arguments**

| adjust_burn | Numeric scalar with the percentage of burn-in that should be used to tune the MH step.       |
|-------------|--|
| acc_target  | Numeric vector with the lower and upper bound of the target acceptance rate for the MH step. |
| acc_change  | Numeric scalar with the percentage adjustment to the proposal scale for tuning.              |

# Value

Returns a list with settings to tune the Metropolis-Hastings step of a Bayesian model.

6 set\_NG

#### **Examples**

```
set_mh(0.5, c(0.1, 0.5), .05)
```

set\_NG

Set up a Normal-Gamma prior

#### **Description**

Set up a Normal-Gamma prior

#### Usage

```
set_NG(
 mu = 0,
 precision = 1e-08,
 shape = 0.01,
 rate = 0.01,
 beta = NULL,
  sigma = NULL
)
set_SNG(
  lambda_a = 0.01,
  lambda_b = 0.01,
  theta_scale = 0,
  theta_a = 1,
  lambda = 1,
  tau = 10,
  theta = 0.1
)
set_HS(lambda = 1, tau = 1, zeta = 1, nu = 1)
```

#### Arguments

mu Numeric scalar or vector with the prior mean of 'beta'.

precision Numeric scalar or matrix with the prior precision of 'beta'. Not used for shrink-

age priors.

shape, rate Numeric scalars with the prior shape and rate of 'sigma'.

lambda\_a, lambda\_b

Numeric scalars with the prior shape and rate of 'lambda'.

theta\_scale Numeric scalar with the proposal scale of 'theta'. Defaults to zero for a fixed

value.

theta\_a Numeric scalar with the prior rate of 'theta'.

lambda, tau, theta, zeta, nu, beta, sigma

Numerics with starting values for the respective parameter.

set\_options 7

# Value

Returns a list with priors and settings.

set\_options

Set up Bayesian model priors and settings

# Description

Set up Bayesian model priors and settings

#### Usage

```
set_options(
  type = c("Independent", "Conjugate", "Shrinkage", "Horseshoe"),
  NG = set_NG(),
  SNG = set_SNG(),
  HS = set_HS(),
  SAR = set_SAR(),
  SLX = set_SLX(),
  SEM = set_SEM(),
  SV = set_SV(),
  ...
)
```

# Arguments

| type | Character scalar with the prior type for the nested linear model.   |
|------|---|
| NG   | Settings for the Normal-Gamma prior (independent or conjugate). See set_NG.   |
| SNG  | Settings for the Normal-Gamma shrinkage prior (Polson and Scott, 2010). See ${\tt set\_NG}$ .   |
| HS   | Settings for the Horseshoe shrinkage prior (Makalic and Schmidt, 2015). See ${\tt set\_NG}$ .   |
| SAR  | Settings for the spatial autoregressive setup. See set_SAR.   |
| SLX  | Settings for the spatially lagged explanatory setup. See $set\_SAR$ . Note that settings for the spatial term 'theta' are provided to $NG$ instead. |
| SEM  | Settings for the spatial error setup. See set_SAR.  |
| SV   | Settings for the stochastic volatility setup. See set_SV.   |
|      | Used to provide custom prior elements.  |

#### Value

Returns a list with priors and settings for a Bayesian model.

# Examples

```
set_options("Shrinkage", SNG = set_SNG(lambda_a = 1, lambda_b = 1))
```

set\_SAR

 $set\_SAR$ 

Set up a spatial prior

# **Description**

Set up a spatial prior

# Usage

```
set_SAR(
  lambda_a = 1.01,
  lambda_b = 1.01,
  lambda = 0,
  lambda_scale = 0.1,
  lambda_min = -1,
  lambda_max = 1 - 1e-12,
 delta_a = 1.01,
 delta_b = 1.01,
 delta = 1,
 delta_scale = 0,
 delta_min = 1e-12,
 delta_max = Inf
)
set_SLX(
  lambda_a = 1.01,
  lambda_b = 1.01,
  lambda = 0,
  lambda_scale = 0.1,
  lambda_min = -1,
 lambda_max = 1 - 1e-12,
 delta_a = 1.01,
 delta_b = 1.01,
  delta = 1,
 delta_scale = 0,
 delta_min = 1e-12,
 delta_max = Inf
)
set_SEM(
  lambda_a = 1.01,
  lambda_b = 1.01,
  lambda = 0,
  lambda_scale = 0.1,
  lambda_min = -1,
  lambda_max = 1 - 1e-12,
  delta_a = 1.01,
```

set\_SV 9

```
delta_b = 1.01,
  delta = 1,
  delta_scale = 0,
  delta_min = 1e-12,
  delta_max = Inf
)
```

# **Arguments**

```
lambda_a, lambda_b
```

Numeric scalars with the prior shapes of the connectivity strength 'lambda'.

lambda\_min, lambda\_max

Numeric scalars with upper and lower bounds for 'lambda'.

delta\_a, delta\_b

Numeric scalars with the prior shapes of the connectivity parameter 'delta'.

delta\_scale Numeric scalar with the proposal scale of 'delta'. Defaults to zero for a fixed value.

delta\_min, delta\_max

Numeric scalars with upper and lower bounds for 'delta'.

# Value

Returns a list with priors and settings.

set\_SV

Set up a volatility prior

#### **Description**

Set up a volatility prior

# Usage

```
set_SV(
    priors,
    mu = 0,
    phi = 0.5,
    sigma = 1,
    nu = Inf,
    rho = 0,
    beta = 0,
    latent0 = 0
)
```

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#### **Arguments**

#### Value

Returns a list with priors and settings.

tune

Burn-in and tune a Bayesian model sampler

# Description

Burn-in and tune a Bayesian model sampler

# Usage

```
tune(x, n_burn = 1000L, mh = set_mh(), verbose = TRUE)
burn(x, n_burn = 1000L, verbose = TRUE)
```

# **Arguments**

x Bayesian model
 n\_burn Integer scalar with number of draws to save / burn.
 mh Settings to tune the Metropolis-Hastings step. See set\_mh.
 verbose Logical scalar. Whether to print status updates.

# Value

Modifies the Bayesian model in place and returns it invisibly.

us\_states 11

 $us\_states$ 

United States Historical States

# **Description**

Polygons of US state boundaries for the period 1960–2000. Subset from Siczewicz (2011). Licensed under CC BY-NC-SA 2.5 by the Atlas of Historical County Boundaries.

# Usage

us\_states

#### **Format**

A data. frame object.

#### **Source**

https://publications.newberry.org/ahcbp/

# References

Siczewicz, P. (2011) U.S. Historical States and Territories (Generalized 0.01 deg). Dataset. Atlas of Historical County Boundaries, edited by Long, J. H. . Chicago: The Newberry Library, 2011. Available online from https://publications.newberry.org/ahcbp/.

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