Package 'bamm'

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Type Package

Title Species Distribution Models as a Function of Biotic, Abiotic and Movement Factors (BAM)

Version 0.5.0

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Description Species Distribution Modeling (SDM) is a practical methodology that aims to estimate the area of distribution of a species. However, most of the work has focused on estimating static expressions of the correlation between environmental variables. The outputs of correlative species distribution models can be interpreted as maps of the suitable environment for a species but not generally as maps of its actual distribution. Soberón and Peterson (2005) <doi:10.17161/bi.v2i0.4> presented the BAM scheme, a heuristic framework that states that the occupied area of a species occurs on sites that have been accessible through dispersal (M) and have both favorable biotic (B) and abiotic conditions (A). The 'bamm' package implements classes and functions to operate on each element of the BAM and by using a cellular automata model where the occupied area of a species at time t is estimated by the multiplication of three binary matrices: one matrix represents movements (M), another abiotic -niche-tolerances (A), and a third, biotic interactions (B). The theoretical background of the package can be found in Soberón and Osorio-Olvera (2023) <doi:10.1111/jbi.14587>.

License GPL (>= 3)

URL https://luismurao.github.io/bamm/

BugReports https://github.com/luismurao/bamm/issues

Depends R (>= 3.5.0)

Imports animation (>= 2.3), crosstalk, dplyr (>= 0.8.0), furrr (>= 0.1.0), future (>= 1.18.0), graphics, grDevices, igraph (>= 1.2), leaflet (>= 2.0), magrittr (>= 1.2), Matrix (>= 1.2.14), methods (>= 3.3), plotly, purrr (>= 0.2), raster (>= 3.4-13), Rcpp (>= 0.12.18), Rdpack (>= 0.11.0), RSpectra (>= 0.13.1), sp (>= 1.3.0), stats, utils

Suggests knitr, rmarkdown, testthat (>= 3.0.0)

LinkingTo Rcpp, RcppArmadillo

VignetteBuilder knitr

RdMacros Rdpack

Config/testthat/edition 3

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NeedsCompilation yes

RoxygenNote 7.3.1

SystemRequirements GDAL (>= 2.2.3): gdal-bin (deb), libgdal-dev (deb) or gdal-devel (rmp), GEOS (>= 3.4.0), PROJ (>= 4.9.3): libproj-dev (deb), sqlite3, ImageMagick++: imagemagick (deb), libmagic-dev (deb), libmagick++-dev (deb) or ImageMagick-c++-devel (rpm) ImageMagick (http://imagemagick.org) or GraphicsMagick (http://www.graphicsmagick.org) or LyX (http://www.lyx.org) for saveGIF(); (PDF)LaTeX for saveLatex(); SWF Tools (http://swftools.org) for saveSWF(); FFmpeg (http://ffmpeg.org) or avconv (https://libav.org/avconv.html) for saveVideo()

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Repository CRAN

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Contents

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adj_mat *adj_mat: Function to compute the adjacency matrix of an area.*

Description

Creates an adjacency matrix of an area of interest. This could be the accessible area (M) of a species or any geographic region of interest.

Usage

```
adj_mat(modelsparse, ngbs = 1, eigen_sys = FALSE, which_eigs = 1)
```

Arguments

modelsparse	A setA object returned by the function model2sparse.
ngbs	Numeric. Number of neighbors (see details).
eigen_sys	Logical. If TRUE the eigen analyses of the adjacency matrix will be returned.
which_eigs	Numeric. Which eigen value and eigen vector will be returned.

Details

The model is a raster object of the area where the dispersal process will occur. The number of neighbors depends on the dispersal abilities of the species and the spatial resolution of the niche model; for example, a species's with big dispersal abilities will move throughout more than 1 km^2 per day, so the idea is to give an approximate number of moving neighbors (pixels) per unit of time. For more information about see adjacency matrices in the context of the theory of area of distribution (Soberon and Osorio-Olvera, 2022).

Value

Returns an object of class [setM](#) with 7 slots. The first contains the adjacency matrix. A n x n sparse matrix (n=number of non-NA cells of the niche model) where connected cells are represented by 1. The second slot has the adjacency list. It is a list of matrices with four columns (FromRasCell -from cell ID of the raster-, -to cell ID of the raster-, -from non-NA cell-, -to non-NA cell-). Other slots contain information about initial coordinates where dispersal occurs (initial_points), number of cells used to define the neighborhood (ngbs), non-NA coordinates (coordinates), and a matrix of eigen vectors (eigen_vec).

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
x_coord <- c(-106.5699, -111.3737,-113.9332,
             -110.8913, -106.4262, -106.5699)
y_coord <- c(16.62661, 17.72373, 19.87618,
             22.50763, 21.37728, 16.62661)
xy <- cbind(x_coord, y_coord)
p <- sp::Polygon(xy)
ps <- sp::Polygons(list(p),1)
sps <- sp::SpatialPolygons(list(ps))
mx_grid <- bamm::shape2Grid(sps,resolution = 0.25,ones = TRUE)
mx_sparse <- bamm::model2sparse(model=mx_grid, threshold = 0.1)
adj_mx <- bamm::adj_mat(modelsparse=mx_sparse,
                        ngbs=1,eigen_sys=TRUE,which_eigs=1)
print(adj_mx)
mx_grid_eigen <- mx_grid
mx_grid_eigen[mx_sparse@cellIDs] <- adj_mx@eigen_vec
raster::plot(mx_grid_eigen)
```

---

bam-class   *Class* bam *digram*

Description

Class bam digram

Value

An object of class bam

Slots

sdm_sim A list of sparse vectors representing the area occupied

palatable_matrices A list of sparse vectors representing palatable sites.

sim_steps Number of simulation steps by the species

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

bam_clusters *bam_clusters: Function to estimate the connectivity of suitable areas*

Description

Function to estimate the connectivity of suitable areas given an adjacency matrix.

Usage

```
bam_clusters(model, ngbs = 1, plot_model = FALSE)
```

Arguments

model	A niche model in raster format or a setA object (see model2sparse).
ngbs	Numeric. Number of neighbors (see details).
plot_model	Logical. Indicates whether to plot the niche model using a leaflet map, connected suitable cells shown in the same color.

Details

The main result of the function is the Connectivity-Suitability-Diagram (CSD). In this diagram connected suitable cells make clusters of pixels. For more details about the CSD see (Soberon and Osorio-Olvera, 2022).

Value

An object of class csd. It contains three slots. 1) connections: a data.frame with three columns where first and the second represent (x and y) centroid coordinates of the niche model and the third column with the cluster ID where they belong. 2) interactive_map: a leaflet map of connected suitable pixels shown in the same color. 3) A RasterLayer of connected suitable pixels.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Bio-geography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
set.seed(891)
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)
model <- model > 0.7
clusterin <- bamm::bam_clusters(model,ngbs=1,plot_model=TRUE)
raster::plot(clusterin@raster_map)

clusterin@interactive_map
```

---

bam_sim   *bam_sim: Simulate dispersal dynamics using the set B of the BAM framework.*

Description

bam_sim: Simulate dispersal dynamics using the set B of the BAM framework.

Usage

```
bam_sim(
  sp1,
  sp2,
  set_M,
  initial_points,
  periods_toxic,
  periods_suitable,
  nsteps,
  progress_bar = TRUE
)
```

Arguments

sp1	Niche model of the focal species (the one that disperses).
sp2	Niche model of the species with whom sp1 interacts (currently no dispersal dynamics for this species).
set_M	A setM object containing the adjacency matrix for sp1. See adj_mat
initial_points	A sparse vector returned by the function occs2sparse

periods_toxic	Time periods that sps2 takes to develop defense mechanisms (i.e. toxic).
periods_suitable	
	This is the time that sp2 takes to become non-toxic
nsteps	Number of steps to run the simulation
progress_bar	Show progress bar

Details

The returned object inherits from [setA](#), [setM](#) classes. Details about the dynamic model can be found in Soberon and Osorio-Olvera (2022). The model is cellular automata where the occupied area of a species at time $t+1$ is estimated by the multiplication of three binary matrices: one matrix represents movements (M), another abiotic -niche- tolerances (A), and a third, biotic interactions (B) (Soberon and Osorio-Olvera, 2022).

$$\mathbf{G}_j(t+1) = \mathbf{B}_j(t)\mathbf{A}_j(t)\mathbf{M}_j\mathbf{G}_j(t)$$

Value

An object of class bam. The object contains 12 slots of information (see details) from which simulation results are stored in sdm_sim object, a list of sparse matrices with results of each simulation step.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
# Compute dispersal dynamics of Urania boisduvalii as a function of
# palatable Omphalea
urap <- system.file("extdata/urania_omph/urania_guanahacabibes.tif",
                                    package = "bamm")
ura <- raster::raster(urap)
ompp <- system.file("extdata/urania_omph/omphalea_guanahacabibes.tif",
                                    package = "bamm")
omp <- raster::raster(ompp)
msparse <- bamm::model2sparse(ura)
init_coordsdf <- data.frame(x=-84.38751, y= 22.02932)
initial_points <- bamm::occs2sparse(modelsparse = msparse,init_coordsdf)
set_M <- bamm::adj_mat(modelsparse = msparse,ngbs = 1)
ura_sim <- bamm::bam_sim(sp1=ura, sp2=omp, set_M=set_M,
                        initial_points=initial_points,
                        periods_toxic=5,
                        periods_suitable=1,
```

```
                                    nsteps=40)
ura_omp <- bamm::sim2Raster(ura_sim)
raster::plot(ura_omp[[c(1,5,10,15,20,30,35,40)]])

if(requireNamespace("animation")){
# Animation example
anp <-tempfile(pattern = "simulation_results_",fileext = ".gif")
# new_sim <- bamm::sim2Animation(sdm_simul = ura_sim,
#                                     which_steps = seq_len(ura_sim@sim_steps),
#                                      fmt = "GIF",
#                                     filename = anp)
}
```

---

bam_ssim   *bam_ssim: Simulate dispersal dynamics using the set B of the BAM*
                                  framework.

Description

bam_ssim: Simulate dispersal dynamics using the set B of the BAM framework.

Usage

```
bam_ssim(
  sp1,
  sp2,
  set_M,
  initial_points,
  periods_toxic,
  periods_suitable,
  dispersal_prob = 0.85,
  palatable_matrices = FALSE,
  nsteps,
  progress_bar = TRUE
)
```

Arguments

sp1	Niche model of the focal species (the one that disperses).
sp2	Niche model of the species with whom sp1 interacts (currently no dispersal dynamics for this species).
set_M	A setM object containing the adjacency matrix for sp1. See [adj_mat](#)
initial_points	A sparse vector returned by the function [occs2sparse](#)
periods_toxic	Time periods that sps2 takes to develop defense mechanisms (i.e. toxic).
periods_suitable	
	This is the time that sp2 takes to become non-toxic

dispersal_prob	A numeric value indicating the probability to disperse to neighboring cells. This probability is assumed to be binomially distributed
palatable_matrices	
	Logical. If TRUE palatable matrices for each time will be returned.
nsteps	Number of steps to run the simulation
progress_bar	Show progress bar

Details

The returned object inherits from [setA](#), [setM](#) classes. Details about the dynamic model can be found in Soberon and Osorio-Olvera (2022).

Value

An object of class bam. The object contains 12 slots of information (see details) from which simulation results are stored in sdm_sim object, a list of sparse matrices with results of each simulation step. Palatable matrices are returned as a list of sparse matrices with information about palatable pixels for each step of the simulation.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
urap <- system.file("extdata/urania_omph/urania_guanahacabibes.tif",
                                    package = "bamm")
ura <- raster::raster(urap)
ompp <- system.file("extdata/urania_omph/omphalea_guanahacabibes.tif",
                                    package = "bamm")
omp <- raster::raster(ompp)
msparse <- bamm::model2sparse(ura)
init_coordsdf <- data.frame(x=-84.38751, y= 22.02932)
initial_points <- bamm::occs2sparse(modelsparse = msparse,init_coordsdf)
set_M <- bamm::adj_mat(modelsparse = msparse,ngbs = 1)
ura_ssim <- bamm::bam_ssim(sp1=ura, sp2=omp, set_M=set_M,
                           dispersal_prob = 0.75,
                           initial_points=initial_points,
                           periods_toxic=5,
                           periods_suitable=1,
                           nsteps=40)
ura_omp <- bamm::sim2Raster(ura_ssim)
raster::plot(ura_omp[[c(1,2,5,10,15,20,30,35,40)]])
```

```
if(requireNamespace("animation")){
# Animation example
anp <-tempfile(pattern = "simulation_results_",fileext = ".gif")
#new_sim <- bamm::sim2Animation(sdm_simul = ura_ssim,
#                               which_steps = seq_len(ura_ssim@sim_steps),
#                               fmt = "GIF",
#                               filename = anp)
}
```

---

bioindex-class   *Class* bioindex

Description

Class bioindex

Value

An object of class bioindex

Slots

alpha A matrix with the richness of species per site

omega A matrix with the range size of every species

wBeta A numeric value with Whittaker's multiplicative beta index

laBeta A numeric value with Lande's additive beta index

leBeta A numeric value with Legendre's beta index

nestedness A numeric value with Wright and Reeves' nestedness

dispersion_field A matrix with the set of ranges of all species that occur in at each locality

richness_field A matrix with the number of shared species in each site

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

bioindex_sparse-class *Class* bioindex_sparse

Description

Class bioindex_sparse

Value

An object of class bioindex_sparse

Slots

alpha A sparse matrix with the richness of species per site

omega A sparse matrix with the range size of every species

wBeta A numeric value with Whittaker's multiplicative beta index

laBeta A numeric value with Lande's additive beta index

leBeta A numeric value with Legendre's beta index

nestedness A numeric value with Wright and Reeves' nestedness

dispersion_field A sparse matrix with the set of ranges of all species that occur in at each locality

richness_field A sparse matrix with the number of shared species in each site

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

community_sim *community_bam: Community* bamm

Description

Estimate community dynamics using the bamm framework

Usage

```
community_sim(
  en_models,
  ngbs_vect,
  init_coords,
  nsteps,
  threshold_vec = NULL,
  stochastic_dispersal = FALSE,
  disp_prop2_suitability = TRUE,
  disper_prop = 0.5
)
```

Arguments

en_models	A stack or directory with the ecological niche models for each species in the community.
ngbs_vect	A vector containing the number of neighbors for each adjacency matrix of each species in the community see `adj_mat`.
init_coords	A data.frame with 3 columns: sp_name, x and y; x is the longitude and y is the latitude of initial dispersal points
nsteps	Number of iteration steps for the simulation.
threshold_vec	A vector of threshold values used to bnarize niche models.
stochastic_dispersal	
	Logical. If dispersal depends on a probability of visiting neighbor cells (Moore neighborhood).
disp_prop2_suitability	
	Logical. If probability of dispersal is proportional to the suitability of reachable cells. The proportional value must be declared in the parameter 'disper_prop'.
disper_prop	Probability of dispersal to reachable cells.

Details

Each element in community_sim is an object of class. For more details about the simulation see `sdm_sim`. `bam`.

Value

An object of class community_sim. The object contains simulation results for each species in the community.

Author(s)

Luis Osorio-Olvera & Jorge Soberon

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
lagos_path <- system.file("extdata/conejos",
                          package = "bamm")
enm_path <- list.files(lagos_path,
                       pattern = ".tif",
                       full.names = TRUE)[seq(1,10)]
en_models <- raster::stack(enm_path)
ngbs_vect <- sample(1:2,replace = TRUE,
                    size = raster::nlayers(en_models))
init_coords <- read.csv(file.path(lagos_path,
```

```
                                      "lagos_initit.csv"))[seq(1,10),]
nsteps <- 12
sdm_comm <- bamm::community_sim(en_models = en_models,
                                ngbs_vect = ngbs_vect,
                                init_coords = init_coords,
                                nsteps = nsteps)

com_pam <- bamm::csim2pam(sdm_comm,which_steps = seq(1,nsteps))
rich_pam <- pam2richness(com_pam,which_steps = c(1,5,10))
raster::plot(rich_pam)
```

---

community_sim-class   *Class* community_sim *digram*

Description

Class community_sim digram

Value

An object of class community_sim

Slots

community_sim A list of sparse vectors representing the area occupied by the species

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

csd-class   *Class* csd

Description

Class csd

Value

An object of class csd

Slots

connections A data.frame with four columns: x, y, clusterID and cluster_size

interactive_map A leaflet map with markers showing the geographical clusters

raster_map A raster map with cluster IDs as values.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

csd_estimate   *csd_estimate: Estimate the connectivity suitability and dispersal plot*

Description

csd_plot gives an estimate of the number of geographic clusters given a set of dispersal hypothesis and a suitability raster

Usage

```
csd_estimate(model, dispersal_steps = c(2, 4, 8, 16, 32, 64))
```

Arguments

model   A raster model or a setA object representing the suitability model

dispersal_steps

                    A numeric vector with elements representing the dispersal hypothesis to test.

Details

For more information about the Connectivity-Suitability-Diagram see `bam_clusters`

Value

A list of length three. The first element contains the Connectivity- Suitability-Diagram information estimated for each element in the vector of dispersal_steps. The second is tbl_df object with a summary of the number of cluster of each dispersal step and the mean number of connected clusters. The last element is base plot showing the information contained in the tbl_df object.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                             package = "bamm")
model <- raster::raster(model_path)
model <- model > 0.7
csd_plot <- bamm::csd_estimate(model,
                            dispersal_steps=c(2,4,8))
csd_plot$plot
```

---

csim2pam	*csim2pam: Converts community simulation to a Presence Absence Matrix (PAM)*

Description

Converts community simulation object into a Presence Absence Matrices (PAM) for a given simulation steps.

Usage

```
csim2pam(community_sim, which_steps)
```

Arguments

community_sim   An object of class community_bam.

which_steps   Steps in the simulation object to be converted into a PAM

Details

For details about the object community_sim see community_sim

Value

An object of class pam; it contains five slots. 1) pams: a list of sparse matrices with Presence-Absence information (PAMs). 2) which_steps: time steps corresponding to each PAM. 3) sp_names: a vector of species names. 4) the grid area used in the simulation. 5) Non NA cell (pixel) IDs.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
lagos_path <- system.file("extdata/conejos",
                          package = "bamm")
enm_path <- list.files(lagos_path,
                       pattern = ".tif",
                       full.names = TRUE)[seq(1,10)]
en_models <- raster::stack(enm_path)
ngbs_vect <- sample(1:2,replace = TRUE,
                    size = raster::nlayers(en_models))
init_coords <- read.csv(file.path(lagos_path,
                                  "lagos_initit.csv"))[seq(1,10),]
nsteps <- 10
sdm_comm <- bamm::community_sim(en_models = en_models,
                                ngbs_vect = ngbs_vect,
                                init_coords = init_coords,
                                nsteps = nsteps,
                                threshold = 0.1)

pamt10 <- bamm::csim2pam(community_sim = sdm_comm ,
                         which_steps = 10)
pams <- bamm::csim2pam(community_sim = sdm_comm ,
                       which_steps = seq_len(10))
rich_pam <- bamm::pam2richness(pams,which_steps = c(1,5))
print(rich_pam)
```

---

diversity_range-class   *Class* diversity_range

Description

Class diversity_range

Value

An object of class diversity_range

Slots

alpha A column vector with species richness per site

omega A column vector with the size of the area of distribution per species.

alpha_raster Species richness in raster format.

dispersion_field A matrix with the set of ranges of all species that occur in at each locality.

dispersion_field_raster Raster object with the observed values of dispersion field.

diversity_range_raster Raster object of diversity range.

diversity_range_colors Colors to plot endemism levels.

`null_dispersion_field_dist` A matrix with dispersion field null distribution.

`xy_coordinates` A matrix of geographical coordinates

`n_iterations` Number of iterations used to estimate the dispersion field null distribution.

`nsps` Number of species in the PAM.

`nsites` Number of sites in the PAM.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

`diversity_range_analysis`

range_diversity_analysis: diversity analysis

Description

diversity_range_analysis biodiversity indices related to diversity-range plots

Usage

```
diversity_range_analysis(
  pam,
  xy_mat = NULL,
  lower_interval = 0.05,
  upper_interval = 0.95,
  raster_templete = NULL,
  niter = 100,
  return_null_dfield = FALSE,
  randal = "indep_swap",
  parallel = TRUE,
  n_cores = 2
)
```

Arguments

`pam`	A Presence-Absence-Matrix of matrix class or sparse matrix.
`xy_mat`	A two dimensional matrix with longitude and latitude data.
`lower_interval`	Lower interval.
`upper_interval`	Upper interval.
`raster_templete`	
	A raster template.
`niter`	Number of iterations to obtain the distribution.
`return_null_dfield`	
	If TRUE the null distribution of dispersal field will be returned.

randal	Randomization algorithm applied to the PAM. Possible choices "curveball","fastball" and "indep_swap".
parallel	If TRUE the computations will be performed in parallel.
n_cores	Number of cores for the parallel computation.

Details

For more information about the biodiversity indices see Soberon and Cavner (2015). For detail about the diversity range analysis see Soberon et al. (2022). To plot diversity range results use `plot` method for objects of class `diversity_range`.

For details about randomization algorithms applied to the PAM see `null_dispersion_field_distribution`.

Value

An object of class `diversity_range`. The main result is the diversity range analysis which shows jointly two indices describing the community composition of every cell in the grid: (1) the relative number of species, and (2) the mean dispersion field (see plot method for `plot` (Soberon et al. 2022). The contains 12 slots with different measurements of biodiversity such as alpha diversity (species richness in each site or pixel), omega (size of the area of distribution of each species), dispersion field (the standardized size of the area of distribution of all species occurring in each pixel).

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Cobos ME, Nuñez-Penichet C (2021). "Visualizing species richness and site similarity from presence-absence matrices." *Biodiversity Informatics*, **16**(1), 20–27. doi:10.17161/bi.v16i1.14782, https://journals.ku.edu/jbi/article/view/14782..

Soberon J, Cavner J (2015). "Indices of Biodiversity Pattern Based on Presence-Absence Matrices: A GIS Implementation." *Biodiversity Informatics*, **10**, 22–34..

Examples

```
set.seed(111)
pam <- matrix(rbinom(10000,1,0.5),nrow = 100,ncol = 1000)
rdivan <- bamm::diversity_range_analysis(pam=pam,
                                         parallel = FALSE,
                                         niter = 10,
                                         return_null_dfield=TRUE)
bamm::plot(rdivan,plot_type="diversity_range")
# Lagomorphos

lagos_path <- system.file("extdata/conejos",
                          package = "bamm")
enm_path <- list.files(lagos_path,
                       pattern = ".tif",
```

```
                               full.names = TRUE)
en_models <- raster::stack(enm_path) >0.01
nonas <- which(!is.na(en_models[[1]][]))
xy_mat <- sp::coordinates(en_models[[1]])[ nonas,]
pam <- bamm::models2pam(en_models,sparse=FALSE)

rdivan <- bamm::diversity_range_analysis(pam=pam,
                                        xy_mat=xy_mat,
                                        raster_templete = en_models[[1]],
                                        parallel=TRUE,
                                        n_cores=2,
                                        return_null_dfield=TRUE)
bamm::plot(rdivan,plot_type="diversity_range")
bamm::plot(rdivan,plot_type="diversity_range_map")
if(require(plotly) && require(crosstalk)){
#bamm::plot(rdivan,plot_type="diversity_range_interactive")
}
```

---

eigen_bam   *eigen_bam: Compute the Eigen system of two bam objects*

Description

Calculates the Eigen values and Eigen vectors of bam objects

Usage

```
eigen_bam(A = NULL, M = NULL, AM = TRUE, which_eigen = 1, rmap = TRUE)
```

Arguments

A	A bam object of class setA.
M	A bam object of class setM.
AM	A logical value to specify whether to use the product AM or MA. If true the AM will be returned else the product MA will be returned.
which_eigen	An integer representing the which eigen value and eigen vector will be computed.
rmap	Logical. If TRUE the function will return a map of the eigen vector of the product AM.

Details

The eigenvector associated with the dominant eigenvalue of an adjacency matrix provides information about the number of forms in which a cell can be visited from other cells. Details about the eigen analysis in the context of the area of distribution can be found in Soberon and Osorio-Olvera (2022).

Value

A list with four objects. 1) eigen_values (these are indicated in which_eigen parameter of the function), 2) eigen_vectors (the corresponding eigen vectors of each eigen value), 3) Standardized eigen vectors (0 to 1), 4) A RasterLayer depicting the information of the first eigen vector of the system.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)
sparse_mod <- bamm::model2sparse(model = model,0.75)
plot(sparse_mod@niche_model)
adj_mod <- bamm::adj_mat(sparse_mod,ngbs = 1,eigen_sys = TRUE)
# Product AM
eig_bam_am <- bamm::eigen_bam(A=sparse_mod,M=adj_mod,AM=TRUE)
raster::plot(eig_bam_am$map)
# Product MA
eig_bam_ma <- bamm::eigen_bam(A=sparse_mod,M=adj_mod,AM=FALSE)
raster::plot(eig_bam_ma$map)
```

---

g_area-class   *S4 classes to organize data and results of* bamm *objects*

Description

S4 classes to organize data and results of bamm objects

Value

An object of class g_area

Slots

coordinates A two column matrix with coordinates

eigen_vec Eigen vector of adjacency matrix

eigen_val Eigen value of adjacency matrix slot g_model A raster representing the geographic area slot g_sparse A sparse matrix of the geographic area

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

jaccard	*jaccard: Estimates the Jaccard index for comparing two binary maps*

Description

Estimates the Jaccard index for comparing two binary maps

Usage

```
jaccard(m1, m2)
```

Arguments

m1	A binary raster A or an object of class setA returned by the function [model2sparse](#).
m2	A binary raster A or an object of class setA returned by the function [model2sparse](#).

Details

The Jaccard index is computed as follows

$$J(A, B) = \frac{|A \cap B|}{|A \cup B|} = \frac{|A \cap B|}{|A| + |B| - |A \cap B|}.$$

Value

Returns a data.frame with three values: 1) jaccard (Jaccard index), 2) percentage_m1 (the percentage of m1 that the intersection $|A \cap B|$ represents), and 3) percentage_m2

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
m1_path <- system.file("extdata/conejos/Lepus_othus_cont.tif",
                       package = "bamm")
m2_path <- system.file("extdata/conejos/Brachylagus_idahoensis_cont.tif",
                       package = "bamm")
m1 <- raster::raster(m1_path) > 0.01
m2 <- raster::raster(m2_path) >0.01
jcc <- bamm::jaccard(m1,m2)
print(jcc)
```

---

leaflet-class   *Class* leaflet *leaflet*

Description

Class leaflet leaflet

Value

An object of class leaflet

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

model2sparse   *model2sparse: Converts a niche model into a diagonal sparse matrix*

Description

model2sparse: Converts a niche model into a diagonal sparse matrix

Usage

```
model2sparse(model, threshold = NULL)
```

Arguments

model	A raster object representing the geographic projection of a niche model.
threshold	A threshold to convert a continuous model into a binary model.

Details

threshold parameter represents the suitability value used to convert continuous model into a binary model.

Value

An object of class [setA](#). The niche model is stored as diagonal sparse matrix (slot sparse_model).

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)

sparse_mod <- bamm::model2sparse(model, threshold=0.75)
print(sparse_mod)
raster::plot(sparse_mod@niche_model)
```

---

models2pam   *models2pam: Converts binary rasters to a PAM*

Description

Function to convert binary raster models to a Presence Absences Matrix.

Usage

```
models2pam(
  mods_stack,
  return_coords = FALSE,
  sparse = TRUE,
  parallel = FALSE,
  ncores = 2
)
```

Arguments

mods_stack	A raster stack containing binary models of each species in the community.
return_coords	Logical. If TRUE the pam will be returned with coordinates in the first two columns.
sparse	Logical. If TRUE the PAM will be returned as a sparse matrix.
parallel	Logical. If TRUE computations will be done in parallel
ncores	Integer. Number of cores to run the parallel process.

Details

For more information about PAM see Soberon and Cavner (2015).

Value

A presence-absence matrix (PAM).

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberon J, Cavner J (2015). "Indices of Biodiversity Pattern Based on Presence-Absence Matrices: A GIS Implementation." *Biodiversity Informatics*, **10**, 22–34..

Examples

```
lagos_path <- system.file("extdata/conejos",
                          package = "bamm")
enm_path <- list.files(lagos_path,
                       pattern = ".tif",
                       full.names = TRUE)[1:10]
en_models <- raster::stack(enm_path) >0.01
pam <- bamm::models2pam(en_models,
                        return_coords=TRUE,
                        sparse=FALSE,
                        parallel=FALSE,ncores=2)
head(pam)
```

```
null_dispersion_field_distribution
                    null_dispersion_field_distribution: Null distribution of the dispersion
                    field
```

Description

null_dispersion_field_distribution estimates a random distribution of the dispersion field values.

Usage

```
null_dispersion_field_distribution(
  pam,
  n_iter = 10,
  randal = "indep_swap",
  parallel = TRUE,
  n_cores = 2
)
```

Arguments

pam	A Presence-Absence-Matrix of matrix class or sparse matrix.
n_iter	Number of iterations to obtain the distribution.
randal	Randomization algorithm applied to the PAM. Possible choices "curveball", "fastball", and "indep_swap".
parallel	If TRUE the computations will be performed in parallel.
n_cores	Number of cores for the parallel computation.

Details

Estimates a random distribution of the dispersion field values. To obtain random values it uses the function [permute_pam](#) at each step of the iterations. Randomization of the PAM can be performed using the "fastball" (Godard and Neal, 2022) and the "curveball" (Strona et al., 2014), and and the independent swap (Kembel et al. 2010) algorithms. The implementation of the "fastball" in C++ is provided in <https://github.com/zpneal/fastball/blob/main/fastball.cpp>

Value

A data matrix of size nrow(pam) X n_iter with dispersion field values.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberon J, Cavner J (2015). "Indices of Biodiversity Pattern Based on Presence-Absence Matrices: A GIS Implementation." *Biodiversity Informatics*, **10**, 22–34.

Strona G, Nappo D, Boccacci F, Fattorini S, San-Miguel-Ayanz J (2014). "A fast and unbiased procedure to randomize ecological binary matrices with fixed row and column totals." *Nature Communications*, **5**(1), 1–9. ISSN 20411723, [doi:10.1038/ncomms5114](https://doi.org/10.1038/ncomms5114), <https://www.r-project.org>.

Godard K, Neal ZP (2022). "fastball: a fast algorithm to randomly sample bipartite graphs with fixed degree sequences." *Journal of Complex Networks*, **10**(6), cnac049. ISSN 2051-1329, [doi:10.1093/comnet/cnac049](https://doi.org/10.1093/comnet/cnac049), https://academic.oup.com/comnet/article-pdf/10/6/cnac049/47758701/cnac049.pdf.

Kembel SW, Cowan PD, Helmus MR, Cornwell WK, Morlon H, Ackerly DD, Blomberg SP, Webb CO (2010). "Picante: R tools for integrating phylogenies and ecology." *Bioinformatics*, **26**, 1463–1464.

Examples

```
set.seed(111)
pam <- matrix(rbinom(100,1,0.3),nrow = 10,ncol = 10)
dfield_rand <- bamm::null_dispersion_field_distribution(pam,n_iter=10,
                                                        parallel=FALSE,
                                                        randal="indep_swap",
                                                        n_cores = 2)

head(dfield_rand)
```

---

occs2sparse | *occs2sparse: Converts occurrence data into a sparse matrix object*

Description

occs2sparse: Converts occurrence data into a sparse matrix object

Usage

```
occs2sparse(modelsparse, occs)
```

Arguments

modelsparse	A setA object returned by the function model2sparse
occs	A matrix or a data.frame containing two columns. The first one is the longitude and the second is the latitude.

Details

Rows of this column vector represent non NA pixels of the niche model.

Value

A sparse vector of zeros (presences) and ones (absences).

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)

sparse_mod <- bamm::model2sparse(model,threshold=0.05)

occs_lep_cal <- data.frame(longitude = c(-115.10417,
                                         -104.90417),
                           latitude = c(29.61846,
                                        29.81846))

occs_sparse <- bamm::occs2sparse(modelsparse = sparse_mod,
                                 occs = occs_lep_cal)

head(occs_sparse)
```

---

pam-class   *Class* pam *Presence-Absence Matrix*

Description

Class pam Presence-Absence Matrix

Value

An object of class pam

Slots

pams A list of sparse matrices representing Presence-Absence Matrix for each simulation time

which_steps Simulation steps

sp_names Names of species in the PAM

grid Raster grid of the studied area

cellIDs Cells with ids of the PAM sites

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

pam2bioindex *pam2bioindex: PAM to biodiversity index*

Description

pam2bioindex estimates various biodiversity indices for a certain PAM.

Usage

```
pam2bioindex(pam, biodiv_index = "dispersion_field", as_sparse = FALSE)
```

Arguments

pam	A Presence-Absence-Matrix of matrix class or sparse matrix.
biodiv_index	Possible values are alpha, omega, wbeta (Whittaker's multiplicative beta index), laBeta (Lande's additive beta index) dispersion_field, all.
as_sparse	Return indices as sparse objects

Details

The biodiversity indices can be found in Soberón and Cavner (2015).

Value

An object of class [bioindex](#) with three slots each represents a matrix of diversity indices: alpha, omega, and dispersion field, richness_field.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberon J, Cavner J (2015). "Indices of Biodiversity Pattern Based on Presence-Absence Matrices: A GIS Implementation." *Biodiversity Informatics*, **10**, 22–34.

Examples

```
set.seed(111)
pam <- matrix(rbinom(100,1,0.3),nrow = 10,ncol = 10)
bioindices <- bamm::pam2bioindex(pam=pam,biodiv_index="all")
# Return results as sparse models
bioindices <- bamm::pam2bioindex(pam=pam,biodiv_index="all",as_sparse=TRUE)
bioindices@alpha
bioindices@omega
bioindices@dispersion_field
```

---

pam2richness   *pam2richness: Converts Presence Absence Matrix (pam object) to*
                          richness raster

Description

Converts Presence Absence Matrix (pam object) to richness raster

Usage

```
pam2richness(pamobj, which_steps)
```

Arguments

pamobj	An object of class pam see `csim2pam`
which_steps	Time steps in the pam to convert

Value

A RasterStack richness for each simulation step

Author(s)

Luis Osorio-Olvera & Jorge Soberón.

Examples

```
lagos_path <- system.file("extdata/conejos",
                           package = "bamm")
enm_path <- list.files(lagos_path,
                        pattern = ".tif",
                     full.names = TRUE)[seq(1,10)]
en_models <- raster::stack(enm_path)
ngbs_vect <- sample(2,replace = TRUE,
                     size = raster::nlayers(en_models))
init_coords <- read.csv(file.path(lagos_path,
                                  "lagos_initit.csv"))[seq(1,10),]
nsteps <- 10
sdm_comm <- bamm::community_sim(en_models = en_models,
```

```
                                ngbs_vect = ngbs_vect,
                                init_coords = init_coords,
                                nsteps = nsteps,
                                threshold = 0.1)

pams <-bamm::csim2pam(community_sim = sdm_comm ,
                      which_steps = seq_len(nsteps))
richness_stack <- bamm::pam2richness(pamobj = pams,
                                     which_steps = pams@which_steps)
raster::plot(richness_stack)
```

| permute_pam | *permute_pam: Function to permute a Presence-Absence-Matrix.* |

Description

permute_pam: Function to permute a Presence-Absence-Matrix.

Usage

```
permute_pam(m, niter = NULL, as_sparse = FALSE, randal = "indep_swap")
```

Arguments

m	Presence-Absence-Matrix (PAM) or a binary matrix with columns representing species and rows sites.
niter	Number of iterations to permute the PAM.
as_sparse	If TRUE the PAM will be returned as a sparse matrix
randal	Randomization algorithm applied to the PAM. Possible choices "curveball", "fastball", and "indep_swap".

Details

This function can use the "curveball" (Strona et al., 2014), the fastball (Godard and Neal, 2022), and the independent swap algorithms. The implementation of the "fastball" in C++ is provided in <https://github.com/zpneal/fastball/blob/main/fastball.cpp>. Please when using the "fastball" algorithm for publications cite Godard and Neal (2022). When using the "curveball" cite Strona et al. (2014). When using independent swap ("indep_swap") cite Kembel et al. (2010)

Value

Returns a permuted matrix of the same dimensions of m (same number of rows and columns). Note that the sum of each row and column of this permuted matrix is equal to that of m. species.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Strona G, Nappo D, Boccacci F, Fattorini S, San-Miguel-Ayanz J (2014). "A fast and unbiased procedure to randomize ecological binary matrices with fixed row and column totals." *Nature Communications*, **5**(1), 1–9. ISSN 20411723, doi:10.1038/ncomms5114, `https://www.r-project.org`.

Godard K, Neal ZP (2022). "fastball: a fast algorithm to randomly sample bipartite graphs with fixed degree sequences." *Journal of Complex Networks*, **10**(6), cnac049. ISSN 2051-1329, doi:10.1093/comnet/cnac049, https://academic.oup.com/comnet/article-pdf/10/6/cnac049/47758701/cnac049.pdf.

Kembel SW, Cowan PD, Helmus MR, Cornwell WK, Morlon H, Ackerly DD, Blomberg SP, Webb CO (2010). "Picante: R tools for integrating phylogenies and ecology." *Bioinformatics*, **26**, 1463–1464.

Examples

```
set.seed(111)
pam <- matrix(rbinom(100,1,0.3),nrow = 10,ncol = 10)
ppam <- bamm::permute_pam(m = pam,niter = NULL,as_sparse = FALSE)
# Check if matrices are different
all(pam == ppam)
# Check if row totals are the same
all(Matrix::rowSums(pam) == Matrix::rowSums(ppam))
# Check if column total are the same
all(Matrix::colSums(pam) == Matrix::colSums(ppam))
```

---

plot,diversity_range,ANY-method

Plot method for objects of class diversity_range **bamm**.

Description

Plot method for objects of class diversity_range **bamm**.

Usage

```
## S4 method for signature 'diversity_range,ANY'
plot(
  x,
  xlab = NULL,
  plot_type = "diversity_range",
  legend = TRUE,
  legend_position = "bottomright",
  ylab = NULL,
  col = NULL,
  pch = NULL,
  pch_legend = 19,
  radius = 0.5,
  ...
)
```

Arguments

`x`	An object of class diversity_range
`xlab`	x label
`plot_type`	Plot type: possible options: "diversity_range" (range-diversity plot), "diversity_range_map" (a raster map with diversity_range categories), "alpha" (a raster map with alpha diversity values), "dispersion_field" (a raster with dispersion field)
`legend`	Logical. If TRUE the legend of the categorical diversity range values will appear.
`legend_position`	
	Legend position.
`ylab`	y label
`col`	Plot colors.
`pch`	Patch type.
`pch_legend`	Patch type for legends.
`radius`	Size of the patch for the interactive map.
`...`	Graphical parameters. Any argument that can be passed to 1) base::plot, such as axes=FALSE, main='title', ylab='latitude' 2) leaflet::leaflet or 3) leaflet::addCircleMarkers.

Details

To show interactive diversity_range plots install the 'plotly' R package.

Value

Plot of the results of the diversity_range analysis

Author(s)

Luis Osorio-Olvera & Jorge Soberón

`predict,bam-method`	*Predict method of the package* **bamm**.

Description

predicts species' distribution under suitability changes

Usage

```
## S4 method for signature 'bam'
predict(
  object,
  niche_layers,
  nbgs_vec = NULL,
  nsteps_vec,
  stochastic_dispersal = FALSE,
  disp_prop2_suitability = TRUE,
  disper_prop = 0.5,
  animate = FALSE,
  period_names = NULL,
  fmt = "GIF",
  filename,
  bg_color = "#F6F2E5",
  suit_color = "#0076BE",
  occupied_color = "#03C33F",
  png_keyword = "sdm_sim",
  ani.width = 1200,
  ani.height = 1200,
  ani.res = 300
)
```

Arguments

`object`	a of class bam.
`niche_layers`	A raster or RasterStack with the niche models for each time period
`nbgs_vec`	A vector with the number of neighbors for the adjacency matrices
`nsteps_vec`	Number of simulation steps for each time period.
`stochastic_dispersal`	
	Logical. If dispersal depends on a probability of visiting neighbor cells (Moore neighborhood).
`disp_prop2_suitability`	
	Logical. If probability of dispersal is proportional to the suitability of reachable cells. The proportional value must be declared in the parameter 'disper_prop'.
`disper_prop`	Probability of dispersal to reachable cells.
`animate`	Logical. If TRUE a dispersal animation on climate change scenarios will be created
`period_names`	Character vector with the names of periods that will be animated. Default NULL.
`fmt`	Animation format. Possible values are GIF and HTML
`filename`	File name.
`bg_color`	Color for unsuitable pixels. Default "#F6F2E5".
`suit_color`	Color for suitable pixels. Default "#0076BE".
`occupied_color`	Color for occupied pixels. Default "#03C33F".

png_keyword	A keyword name for the png images generated by the function
ani.width	Animation width unit in px
ani.height	Animation height unit in px
ani.res	Animation resolution unit in px

Value

A RasterStack of predictions of dispersal dynamics as a function of environmental change scenarios.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
# rm(list = ls())
# Read raster model for Lepus californicus
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)
# Convert model to sparse
sparse_mod <- bamm::model2sparse(model = model,threshold=0.1)
# Compute adjacency matrix
adj_mod <- bamm::adj_mat(sparse_mod,ngbs=1)


# Initial points to start dispersal process

occs_lep_cal <- data.frame(longitude = c(-115.10417,
                                           -104.90417),
                           latitude = c(29.61846,
                                         29.81846))
# Convert to sparse the initial points
occs_sparse <- bamm::occs2sparse(modelsparse = sparse_mod,
                                 occs = occs_lep_cal)

# Run the bam (sdm) simultation for 100 time steps
smd_lep_cal <- bamm::sdm_sim(set_A = sparse_mod,
                             set_M = adj_mod,
                             initial_points = occs_sparse,
                             nsteps = 10)
#---------------------------------------------------------------------------
# Predict species' distribution under suitability change
# scenarios (could be climate chage scenarios).
#---------------------------------------------------------------------------

# Read suitability layers (two suitability change scenarios)
layers_path <- system.file("extdata/suit_change",
                           package = "bamm")
niche_mods_stack <- raster::stack(list.files(layers_path,
                                               pattern = ".tif$",
                                               full.names = TRUE))
```

```
raster::plot(niche_mods_stack)
# Predict
new_preds <- predict(object = smd_lep_cal,
                     niche_layers = niche_mods_stack,
                     nsteps_vec = c(50,100))

# Generate the dispersal animation for time period 1 and 2

if(requireNamespace("animation")){
ani_prd <- tempfile(pattern = "prediction_",fileext = ".gif")
#new_preds <- predict(object = smd_lep_cal,
#                     niche_layers = niche_mods_stack,
#                     nsteps_vec = c(10,10),
#                     animate=TRUE,
#                     filename=ani_prd,
#                   fmt="GIF")

}
```

---

sdm_sim   *sdm_sim: Simulate single species dispersal dynamics using the BAM*
                                framework.

Description

sdm_sim: Simulate single species dispersal dynamics using the BAM framework.

Usage

```
sdm_sim(
  set_A,
  set_M,
  initial_points,
  nsteps,
  stochastic_dispersal = TRUE,
  disp_prop2_suitability = TRUE,
  disper_prop = 0.5,
  progress_bar = TRUE
)
```

Arguments

set_A   A setA object returned by the function [model2sparse](#)

set_M   A setM object containing the adjacency matrix of the study area. See [adj_mat](#)

initial_points   A sparse vector returned by the function [occs2sparse](#)

nsteps   Number of steps to run the simulation

stochastic_dispersal

> Logical. If dispersal depends on a probability of visiting neighbor cells (Moore neighborhood).

disp_prop2_suitability

> Logical. If probability of dispersal is proportional to the suitability of reachable cells. The proportional value must be declared in the parameter 'disper_prop'.

disper_prop   Probability of dispersal to reachable cells.

progress_bar   Show progress bar

Details

The model is cellular automata where the occupied area of a species at time $t + 1$ is estimated by the multiplication of two binary matrices: one matrix represents movements (M), another abiotic -niche- tolerances (A) (Soberon and Osorio-Olvera, 2022).

$$\mathbf{G}_j(t+1) = \mathbf{A}_j(t)\mathbf{M}_j\mathbf{G}_j(t)$$

The equation describes a very simple process: To find the occupied patches in $t + 1$ start with those occupied at time t denoted by $\mathbf{G}_j(t)$, allow the individuals to disperse among adjacent patches, as defined by $\mathbf{M}_j$, then remove individuals from patches that are unsuitable, as defined by $\mathbf{A}_j(t)$.

Value

An object of class bam with simulation results. The simulation are stored in the sdm_sim slot (a list of sparse matrices).

Author(s)

Luis Osorio-Olvera & Jorge Soberón

References

Soberón J, Osorio-Olvera L (2023). "A dynamic theory of the area of distribution." *Journal of Biogeography6*, **50**, 1037-1048. doi:10.1111/jbi.14587, https://onlinelibrary.wiley.com/doi/abs/10.1111/jbi.14587..

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)

sparse_mod <- bamm::model2sparse(model,threshold=0.05)
adj_mod <- bamm::adj_mat(sparse_mod,ngbs=1)
occs_lep_cal <- data.frame(longitude = c(-110.08880,
                                            -98.89638),
                           latitude = c(30.43455,
                                           25.19919))

occs_sparse <- bamm::occs2sparse(modelsparse = sparse_mod,
```

```
                                            occs = occs_lep_cal)
sdm_lep_cal <- bamm::sdm_sim(set_A = sparse_mod,
                             set_M = adj_mod,
                             initial_points = occs_sparse,
                             nsteps = 10,
                             stochastic_dispersal = TRUE,
                             disp_prop2_suitability=TRUE,
                             disper_prop=0.5,
                             progress_bar=TRUE)

sim_res <- bamm::sim2Raster(sdm_lep_cal)
raster::plot(sim_res)
```

---

setA-class   *Class for the A set of the BAM diagram*

Description

A class for the A set of the BAM diagram. It contains raster models and IDs of pixels with values different than NA.

Value

An object of class setA showClass("setA")

Slots

niche_model A niche model in raster format. It can be a binary model or continuous. If the model is in a continuous format.

suit_threshold Suitability value used to binarize continuous model

cellIDs A numeric vector with the IDs of the cells with prediction values

suit_values A numeric vector with suitability value of the continuous map

sparse_model A niche model in sparse matrix format

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

setM-class   *Class for the M set of the* bamm *diagram*

Description

Class for the M set of the bamm diagram

Value

An object of class setM

Slots

adj_matix An adjacency matrix

adj_list An adjacency list

initial_points A presence-absence vector with species' occurrences

n_initial_points Number of initial points used to start the dispersal process

ngbs Number of neighbors

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
showClass("setM")
```

---

shape2Grid   *shape2Grid: Function to create a grid given a spatial polygon*

Description

shape2Grid creates a raster grid given a spatial polygon and a grid resolution.

Usage

```
shape2Grid(shpolygon, resolution, ones = TRUE)
```

Arguments

shpolygon   A SpatialPolygon, SpatialPolygonDataFrame representing the desired shape of
             the grid.

resolution   Numeric. Spatial resolution of the grid.

ones   Logical. Fill with ones the values of the raster. If not the values will be written
             as cellID values.

Value

Returns a raster object with the shape of 'shpolygon' of a given resolution.

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
x_coord <- c(-106.5699, -111.3737,-113.9332, -110.8913, -106.4262, -106.5699)
y_coord <- c(16.62661, 17.72373, 19.87618, 22.50763, 21.37728, 16.62661)
xy <- cbind(x_coord, y_coord)
p <- sp::Polygon(xy)
ps <- sp::Polygons(list(p),1)
sps <- sp::SpatialPolygons(list(ps))
r1 <- bamm::shape2Grid(sps,resolution = 0.1,ones = FALSE)
plot(r1)
sp::plot(sps,add=TRUE)
```

---

show,setA-method   *Show information in setA class* **bamm**.

Description

Show information in setA class **bamm**.

Show information in csd class **bamm**.

Show information in pam class **bamm**.

Show information in pam class **bamm**.

Show information in setA class **bamm**.

Show information in diversity_range class **bamm**.

Usage

```
## S4 method for signature 'setA'
show(object)

## S4 method for signature 'csd'
show(object)

## S4 method for signature 'pam'
show(object)

## S4 method for signature 'bioindex_sparse'
show(object)
```

```
## S4 method for signature 'setM'
show(object)

## S4 method for signature 'diversity_range'
show(object)
```

Arguments

object   An object of class diversity_range

Value

Display information about the setA object

Display information about the csd object

Display information about the pam object

Display information about the bioindex_spars object

Display information about the setM object

Display information about the diversity_range object

Author(s)

Luis Osorio-Olvera & Jorge Soberón

---

sim2Animation   *sim2Animation: Animate BAM simulation object.*

Description

Animates BAM simulation object.

Usage

```
sim2Animation(
  sdm_simul,
  which_steps,
  fmt = "GIF",
  filename,
  png_keyword = "sdm_sim",
  extra_legend = NULL,
  bg_color = "#F6F2E5",
  suit_color = "#0076BE",
  occupied_color = "#03C33F",
  gif_vel = 0.8,
  ani.width = 1200,
  ani.height = 1200,
  ani.res = 300
)
```

Arguments

`sdm_simul`	A bam object. See `sdm_sim`
`which_steps`	A numeric vector indicating the simulation steps that are going to be converted into raster layers.
`fmt`	Animation format. Possible values are GIF and HTML
`filename`	File name.
`png_keyword`	A keyword name for the png images generated by the function
`extra_legend`	A legend to add to the animation.
`bg_color`	Color for unsuitable pixels. Default "#F6F2E5".
`suit_color`	Color for suitable pixels. Default "#0076BE".
`occupied_color`	Color for occupied pixels. Default "#03C33F".
`gif_vel`	A value that regulates the velocity of frame transitions. The bigger it is the transition will be slower default 0.8
`ani.width`	Animation width unit in px
`ani.height`	Animation height unit in px
`ani.res`	Animation resolution unit in px

Details

The animation can be saved in a GIF or HTML format. Note that the generation of the GIF can be time consuming for large simulation (simulations with more than 60 time steps).

Value

A RasterStack of species' distribution at each simulation step

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)
sparse_mod <- bamm::model2sparse(model,0.1)
adj_mod <- bamm::adj_mat(sparse_mod,ngbs=2)
occs_lep_cal <- data.frame(longitude = c(-115.10417,
                                          -104.90417),
                           latitude = c(29.61846,
                                        29.81846))
occs_sparse <- bamm::occs2sparse(modelsparse = sparse_mod,
                                 occs = occs_lep_cal)
sdm_lep_cal <- bamm::sdm_sim(set_A = sparse_mod,
                             set_M = adj_mod,
                             initial_points = occs_sparse,
```

```
                                    nsteps = 50)

if(requireNamespace("animation")){
ani_name <- tempfile(pattern = "simulation_",fileext = ".html")
#sdm_lep_cal_st <- bamm::sim2Animation(sdm_simul = sdm_lep_cal,
#                                      which_steps = seq(1,50,by=1),
#                                      fmt = "HTML",ani.width = 1200,
#                                      ani.height = 1200,
#                                      filename = ani_name)
}
```

---

sim2Raster   *sim2Raster: Convert a BAM simulation object to RasterStack*

Description

Convert a BAM simulation object to RasterStack.

Usage

```
sim2Raster(sdm_simul, which_steps = NULL)
```

Arguments

sdm_simul	A bam object. See [sdm_sim](#)
which_steps	A numeric vector indicating the simulation steps that are going to be converted into raster layers.

Value

A RasterStack of species' distribution at each simulation step

Author(s)

Luis Osorio-Olvera & Jorge Soberón

Examples

```
model_path <- system.file("extdata/Lepus_californicus_cont.tif",
                          package = "bamm")
model <- raster::raster(model_path)
sparse_mod <- bamm::model2sparse(model,threshold=0.1)
adj_mod <- bamm::adj_mat(sparse_mod,ngbs = 1)
occs_lep_cal <- data.frame(longitude = c(-115.10417,
                                         -104.90417),
                           latitude = c(29.61846,
                                        29.81846))
occs_sparse <- bamm::occs2sparse(modelsparse = sparse_mod,
```

```
                                  occs = occs_lep_cal)
sdm_lep_cal <- bamm::sdm_sim(set_A = sparse_mod,
                             set_M = adj_mod,
                             initial_points = occs_sparse,
                             nsteps = 10)
sdm_lep_cal_st <- bamm::sim2Raster(sdm_simul = sdm_lep_cal,
                                   which_steps = seq(1,10,by=1))

raster::plot(sdm_lep_cal_st)
```

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