Package 'ENMTools'

July 29, 2020

Type Package

Title Analysis of Niche Evolution using Niche and Distribution Models

Version 1.0

Date 2020-07-22 **Encoding** UTF-8

Maintainer Dan Warren <dan.l.warren@gmail.com>

Description Description: Tools for constructing niche models and analyzing patterns of niche evolution. Acts as an interface for many popular modeling algorithms, and allows users to conduct Monte Carlo tests to address basic questions in evolutionary ecology and biogeography. Warren, D.L., R.E. Glor, and M. Turelli (2008) <doi:10.1111/j.1558-5646.2008.00482.x> Glor, R.E., and D.L. Warren (2011) <doi:10.1111/j.1558-5646.2010.01177.x> Warren, D.L., R.E. Glor, and M. Turelli (2010) <doi:10.1111/j.1600-0587.2009.06142.x> Cardillo, M., and D.L. Warren (2016) <doi:10.1111/geb.12455> D.L. Warren, L.J. Beaumont, R. Dinnage, and J.B. Baumgartner (2019) <doi:10.1111/ecog.03900>.

License GPL-2

LazyData TRUE

RoxygenNote 7.1.0

Imports rgeos, knitr, ggplot2, gridExtra, lhs, magrittr, ENMeval, sp, spatstat, ggpubr, rgdal

Depends raster, dismo

Suggests testthat, hypervolume, leaflet, mgcv, ecospat, randomForest, ranger, caret, CalibratR, ape, ResourceSelection, ppmlasso, fields, reshape2

NeedsCompilation no

Author Dan Warren [aut, cre] (https://orcid.org/0000-0002-8747-2451),

Nick Matzke [ctb],

Marcel Cardillo [ctb],

John Baumgartner [ctb],

Linda Beaumont [ctb],

Nicholas Huron [ctb],

Marianna Simoes [ctb],

Teresa Iglesias [ctb],

Russell Dinnage [aut] (https://orcid.org/0000-0003-0846-2819)

Repository CRAN

Date/Publication 2020-07-29 13:12:06 UTC

R topics documented:

dd.env	3
ackground.points.buffer	 4
ackground.raster.buffer	 4
ackground.shape.buffer	 5
ackground.test	 5
alc.B1	 7
alc.B2	 8
heck.bg	 8
heck.clade	 9
heck.species	 9
ombine.species	 10
rop.species	 10
nmtools.aoc	 11
nmtools.bc	12
nmtools.calibrate	 13
nmtools.clade	 14
nmtools.dm	 15
nmtools.ecospat.bg	 16
nmtools.ecospat.id	17
nmtools.gam	18
nmtools.glm	 20
nmtools.hypervolume	 21
nmtools.maxent	22
nmtools.ppmlasso	 24
nmtools.rf	 25
nmtools.rf.ranger	 27
nmtools.species	28
nv.breadth	 29
nv.evaluate	 30
nv.overlap	 31
uro.worldclim	 32
eog.range.overlap	 33
ypervolume.overlap	 33
berolacerta.clade	 34
dentity.test	 35
nstall.extras	 36
nteractive.plot.enmtools.model	 37
nteractive.plot.enmtools.species	38
narginal.plots	 38
noses.list	
nultistack.pca	 40
ode.overlap	41

add.env 3

add.	env	Take. adds ically Hijm	the v no	env	viro alle	nm d b	ent y ti	al _I he	ore use	dic er e	tor	· va	alu	es	to	th	e c	occ	ur	rei	ιсε	e di	ata	ı. '	Тур)_
Index																										57
	visualize.overlap .					•						•				•		•	•							56
	visualize.enm																									
	trimdupes.by.raster																									
	threespace.plot																									
	sim.points species.from.file																									
	raster.standardize .																									
	raster.resid																									
	raster.pca																									
	raster.overlap																									
	raster.cor.plot																									
	raster.cor.matrix																									48
	raster.cor																									47
	raster.breadth																									
	rangebreak.ribbon .																									
	rangebreak.linear .																									
	point.overlap rangebreak.blob																									
	noint overlan																									41

Description

Takes an enmtools.species object and a set of environment layers, and adds the environmental predictor values to the occurrence data. Typically not called by the user directly. Code modified from Elith and Hijmans SDM with R tutorial

Usage

```
add.env(species, env, verbose = TRUE)
```

Arguments

species An enmtools.species or enmtools.clade object
env A raster stack of environmental variables
verbose Controls printing of progress messages

Value

An enmtools.species object with environmental data attached to it.

background.points.buffer

Takes a set of points, a buffer radius, a sample size, and a mask and returns randomly sampled points from within that buffer radius. Code modified from Elith and Hijmans SDM with R tutorial

Description

Takes a set of points, a buffer radius, a sample size, and a mask and returns randomly sampled points from within that buffer radius. Code modified from Elith and Hijmans SDM with R tutorial

Usage

background.points.buffer(points, radius, n, mask)

Arguments

points A two column data frame with X and Y coordinates

radius Radius for circular buffers to draw around points, in meters.

Sample size for number of background points to return

mask A raster to use as a mask for drawing points

Value

A data frame of points drawn at random from circular buffers around the occurrence points.

background.raster.buffer

Takes a set of points, a buffer radius, and a mask and returns a raster based on that buffer radius. Code modified from Elith and Hijmans SDM with R tutorial

Description

Takes a set of points, a buffer radius, and a mask and returns a raster based on that buffer radius. Code modified from Elith and Hijmans SDM with R tutorial

Usage

background.raster.buffer(points, radius, mask)

Arguments

points A two column data frame with X and Y coordinates

radius Radius for circular buffers to draw around points, in meters.

mask A raster to use as a mask

Value

A raster object with values of 1 in every grid cell falling within the buffer.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
background.raster.buffer(iberolacerta.clade$species$cyreni$presence.points, 100000, euro.worldclim)
```

background.shape.buffer

Takes a set of points and a buffer radius, and returns a polygon. Code modified from Elith and Hijmans SDM with R tutorial

Description

Takes a set of points and a buffer radius, and returns a polygon. Code modified from Elith and Hijmans SDM with R tutorial

Usage

```
background.shape.buffer(points, radius)
```

Arguments

points A two column data frame with X and Y coordinates

radius Radius for circular buffers to draw around points, in meters.

Value

A polygon shapefile.

background.test

background.test Conduct a background test (also called a similarity test), as described in Warren et al. 2008. This test can either be run as an asymmetric test (species.1 vs background of species.2) or as a symmetric test (background of species.1 vs background of species.2). For GLM, Bioclim, and Domain models the replicates will be constructed from the background points supplied for each species. For Maxent, the replicates will be constructed from the range rasters stored in the enmtools.species objects.

6 background.test

Description

background.test Conduct a background test (also called a similarity test), as described in Warren et al. 2008. This test can either be run as an asymmetric test (species.1 vs background of species.2) or as a symmetric test (background of species.1 vs background of species.2). For GLM, Bioclim, and Domain models the replicates will be constructed from the background points supplied for each species. For Maxent, the replicates will be constructed from the range rasters stored in the enmtools.species objects.

Usage

```
background.test(
   species.1,
   species.2,
   env,
   type,
   f = NULL,
   nreps = 99,
   test.type = "asymmetric",
   nback = 1000,
   bg.source = "default",
   low.memory = FALSE,
   rep.dir = NA,
   ...
)
```

species.1	An emtools.species object from which presence points (asymmetric) or background (symmetric) will be sampled.
species.2	An enmtools.species object from which background will be sampled.
env	A RasterLayer or RasterStack object containing environmental data
type	The type of model to construct, currently accepts "glm", "mx", "bc", "gam", or "dm"
f	A function to use for model fitting. Only required for GLM models at the moment.
nreps	Number of replicates to perform
test.type	Controls whether the background test will be "symmetric" or "asymmetric"
nback	Number of background points for models
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
low.memory	When set to TRUE, replicate models are written to disc instead of being stored in the output object. Replicate models stored in the output object contain paths to the replicate models on disk instead of the rasters themselves.

calc.B1 7

rep.dir Directory for storing replicate models when low.memory is set to TRUE. If not specified, the working directory will be used.

... Additional arguments to be passed to model fitting functions.

Value

results A list containing replicates, models for the empirical data, and summary statistics and plots.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
monticola <- iberolacerta.clade$species$monticola
cyreni$range <- background.raster.buffer(cyreni$presence.points, 100000, euro.worldclim)
monticola$range <- background.raster.buffer(monticola$presence.points, 100000, euro.worldclim)
background.test(cyreni, monticola, env = euro.worldclim, type = "glm",
f = pres ~ bio1 + bio12, nreps = 10)</pre>
```

calc.B1

calc.B1, Calculates standardized version of Levins (1968) B1 measure of niche breadth given a vector of suitabilities

Description

calc.B1, Calculates standardized version of Levins (1968) B1 measure of niche breadth given a vector of suitabilities

Usage

```
calc.B1(x)
```

Arguments

Х

A numeric vector

Value

B1 A calculation of Levins (1968) B1 metric

Examples

```
calc.B1(c(1, .001, .001))
```

8 check.bg

calc.B2

calc.B2, Calculates standardized version of Levins (1968) B2 measure of niche breadth given a vector of suitabilities

Description

calc.B2, Calculates standardized version of Levins (1968) B2 measure of niche breadth given a vector of suitabilities

Usage

```
calc.B2(x)
```

Arguments

Х

A numeric vector

Value

B2 A calculation of Levins (1968) B2 metric

Examples

```
calc.B2(c(1, .001, .001))
```

check.bg

Takes an emtools.species object and adds background points if they're missing. Looks for range raster first, then goes for environmental layers.

Description

Takes an emtools.species object and adds background points if they're missing. Looks for range raster first, then goes for environmental layers.

Usage

```
check.bg(species, env = NA, nback = 1000, bg.source = "default")
```

Arguments

bg.source

species An enmtools.species object

env A raster or raster stack of environmental data.

Number of background points to generate, if any

Source for drawing background points. If "points", it just uses the background

points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the

first environmental layer.

check.clade 9

Value

An enmtools.species object with background points.

check.clade

Checking for complians of an enmtools.clade object

Description

Checking for complians of an enmtools.clade object

Usage

```
check.clade(this.clade)
```

Arguments

this.clade

An enmtools.clade object

Value

An enmtools.clade object with appropriate formatting.

Examples

```
data(iberolacerta.clade)
check.clade(iberolacerta.clade)
```

check.species

Checking compliance for an object of class enmtools.species.

Description

Checking compliance for an object of class enmtools.species.

Usage

```
check.species(this.species)
```

Arguments

this.species An enmtools.species object to be checked.

Value

An enmtools.species object with appropriate formatting.

10 drop.species

Examples

```
data(iberolacerta.clade)
check.species(iberolacerta.clade$species$monticola)
```

combine.species

Takes a list of enmtools.species objects and combines them into a single enmtools.species object

Description

Takes a list of enmtools.species objects and combines them into a single enmtools.species object

Usage

```
combine.species(species.list)
```

Arguments

species.list List of enmtools.species objects that you want to combine together

Value

An enmtools species object with the occurrence data, names, and range rasters for the species list combined into one.

Examples

```
data(iberolacerta.clade)
combine.species(iberolacerta.clade$species)
```

drop.species

Takes a an ENMTools clade object and a vector of species names. Drops the species from the tree and removes data from the clade object.

Description

Takes a an ENMTools clade object and a vector of species names. Drops the species from the tree and removes data from the clade object.

Usage

```
drop.species(clade, species)
```

Arguments

clade An ENMTools clade object

species A name or vector of names of species within the enmtools.clade object.

enmtools.aoc 11

Value

An enmtools.clade object with the provided species dropped both from the tree and from the set of enmtools.species objects.

Examples

```
## Not run:
data(iberolacerta.clade)
if(requireNamespace("ape", quietly = TRUE)) {
    new.clade <- drop.species(iberolacerta.clade, c("cyreni", "monticola"))
}
## End(Not run)</pre>
```

enmtools.aoc

Takes an overlap matrix and a tree and runs permutation tests to determine the statistical significance of the relationship between overlap and time

Description

Takes an overlap matrix and a tree and runs permutation tests to determine the statistical significance of the relationship between overlap and time

Usage

```
enmtools.aoc(
  clade,
  nreps,
  overlap.source,
  env = NULL,
  f = NULL,
  overlap.matrix = NULL,
  metric = "D"
)
```

Arguments

clade An enmtools.clade object containing species data and a phylogeny

nreps A number of reps to do

overlap.source The source of the overlaps to calculate. Choices are "bc", "dm", "gam", "glm",

"mx", "range", and "point"

env Environmental layers for use when overlap is calculated using niche models.

f The model to be used for GLM and GAM comparisons

overlap.matrix A matrix of overlaps to use, for option overlap.source = "matrix"

metric The overlap metric to use. For ENM sources, this can be any combination of

"D", "I", "cor", "env.D", "env.I", and "env.cor". for range and point overlap this

argument is ignored.

enmtools.bc

Value

A list containing a data frame of coefficients from the empirical regression of overlap on time along with the coefficients from all Monte Carlo replicates, along with plots and p values for the accompanying statistical tests.

enmtools.bc Takes an emtools.species object with presence and background points, and builds a Bioclim model

Description

Takes an emtools.species object with presence and background points, and builds a Bioclim model

Usage

```
enmtools.bc(
   species,
   env = NA,
   test.prop = 0,
   report = NULL,
   overwrite = FALSE,
   nback = 1000,
   env.nback = 10000,
   rts.reps = 0,
   bg.source = "default",
   ...
)
```

species	An enmtools.species object
env	A raster or raster stack of environmental data.
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
nback	Number of background points for models. In the case of bioclim models these are only used for evaluation.
env.nback	Number of points to draw from environment space for environment space discrimination metrics.
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to bioclim()

enmtools.calibrate 13

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

Examples

```
data(euro.worldclim)
data(iberolacerta.clade)
enmtools.bc(iberolacerta.clade$species$monticola, env = euro.worldclim)
```

enmtools.calibrate

Takes an emtools.model object, and reformats it to run through the CalibratR package, calculates Continuous Boyce Index, and runs a Hosmer-Lemeshow goodness-of-fit test. Can either do a full CalibratR run or just return ECE/MCE statistics and plots.

Description

Takes an emtools.model object, and reformats it to run through the CalibratR package, calculates Continuous Boyce Index, and runs a Hosmer-Lemeshow goodness-of-fit test. Can either do a full CalibratR run or just return ECE/MCE statistics and plots.

Usage

```
enmtools.calibrate(
  model,
  recalibrate = FALSE,
  cuts = 11,
  env = NA,
  n.background = 10000,
  ...
)
```

model	An enmtools.model object
recalibrate	When TRUE, does a full CalibratR "calibrate" run to recalibrate the model. When FALSE, just returns metrics and plots measuring calibration of the model as is.
cuts	The number of bins to split suitability scores into for calculating calibration.
env	A set of environment layers to be used for optional env space metrics
n.background	Number of background points to be used for env space metrics
	Further arguments to be passed to CalibratR's "calibrate" function.

14 enmtools.clade

Value

An enmtools.calibrate object containing calibration and classificaction plots, metrics of model calibration, and (optionally) versions of the model that were recalibrated using various methods.

Examples

enmtools.clade

Defining a class for enmtools.clade. Each clade gets:

Description

Defining a class for enmtools.clade. Each clade gets:

Usage

```
enmtools.clade(species = NA, tree = NA)
```

Arguments

species A list of enmtools.species objects

tree A tree showing the relationships between the species

Value

An enmtools.clade object, either empty or containing a formatted version of the data that was passed into the function.

enmtools.dm 15

enmtools.dm	Takes an emtools.species object with presence and background points, and builds a Domain model

Description

Takes an emtools.species object with presence and background points, and builds a Domain model

Usage

```
enmtools.dm(
  species,
  env = NA,
  test.prop = 0,
  report = NULL,
  nback = 1000,
  env.nback = 10000,
  overwrite = FALSE,
  rts.reps = 0,
  bg.source = "default",
  ...
)
```

Arguments

species	An enmtools.species object
env	A raster or raster stack of environmental data.
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
report	Optional name of an html file for generating reports
nback	Number of background points for models. In the case of Domain, these are only used for evaluation.
env.nback	Number of points to draw from environment space for environment space discrimination metrics.
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to domain()

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

16 enmtools.ecospat.bg

Examples

```
data(euro.worldclim)
data(iberolacerta.clade)
enmtools.dm(iberolacerta.clade$species$monticola, env = euro.worldclim)
```

enmtools.ecospat.bg

enmtools.ecospat.bg, Runs an ecospat background/similarity test using enmtool.species objects.

Description

enmtools.ecospat.bg, Runs an ecospat background/similarity test using enmtool.species objects.

Usage

```
enmtools.ecospat.bg(
  species.1,
  species.2,
  env,
  nreps = 99,
  layers = NULL,
  test.type = "asymmetric",
  th.sp = 0,
  th.env = 0,
  R = 100,
  nback = 1000,
  bg.source = "default",
  ...
)
```

species.1	An enmtools.species object
species.2	An enmtools.species object
env	A set of environmental layers
nreps	The number of pseudoreplicates to perform
layers	A vector of length 2 containing the names of the layers to be used. If no layer names are provided and there are more than two layers in env, enmtools will perform a pca and use the top two layers from that.
test.type	Symmetric or asymmetric test. An asymmetric test is bguivalent to the "one.sided" option in the ecospat documentation, while a symmetric one would be two-sided.
th.sp	Quantile of species densities used as a threshold to exclude low species density values. See documentation for ecospat.grid.clim.dyn.

enmtools.ecospat.id 17

th.env	Quantile of environmental densities across study sites used as threshold to exclude low environmental density values. See documentation for ecospat.grid.clim.dyn.
R	Resolution of the grid. See documentation for ecospat.grid.clim.dyn.
nback	Number of background points to use for density calculations.
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Further arguments to be passed to check.bg

Value

A list containing the ecospat output kernel density estimates for each species and their background, as well as the results of hypothesis tests and their accompanying plots.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
monticola <- iberolacerta.clade$species$monticola
cyreni <- iberolacerta.clade$species$cyreni
enmtools.ecospat.bg(monticola, cyreni, euro.worldclim[[1:2]], nback = 500)</pre>
```

enmtools.ecospat.id enmtools.ecospat.id, Runs an ecospat identity test using enmtools.ecospat.id

Description

enmtools.ecospat.id, Runs an ecospat identity test using enmtool.species objects.

Usage

```
enmtools.ecospat.id(
   species.1,
   species.2,
   env,
   nreps = 99,
   layers = NULL,
   th.sp = 0,
   th.env = 0,
   R = 100,
   nback = 1000,
   bg.source = "default"
)
```

18 enmtools.gam

Arguments

species.1	An enmtools.species object
species.2	An enmtools.species object
env	A set of environmental layers
nreps	The number of pseudoreplicates to perform
layers	A vector of length 2 containing the names of the layers to be used. If no layer names are provided and there are more than two layers in env, enmtools will perform a pca and use the top two layers from that.
th.sp	Quantile of species densities used as a threshold to exclude low species density values. See documentation for ecospat.grid.clim.dyn.
th.env	Quantile of environmental densities across study sites used as threshold to exclude low environmental density values. See documentation for ecospat.grid.clim.dyn.
R	Resolution of the grid. See documentation for ecospat.grid.clim.dyn.
nback	Number of background points to use for density calculations.
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster.

Value

A list containing the ecospat output kernel density estimates for each species and their background, as well as the results of hypothesis tests and their accompanying plots.

If "env", it draws points at randome from the entire study area outlined by the

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
monticola <- iberolacerta.clade$species$monticola
cyreni <- iberolacerta.clade$species$cyreni
enmtools.ecospat.id(monticola, cyreni, euro.worldclim[[1:2]], nback = 500)</pre>
```

first environmental layer.

enmtools.gam	Takes an emtools.species object with presence and background points,
	and builds a gam

Description

Takes an emtools.species object with presence and background points, and builds a gam

enmtools.gam 19

Usage

```
enmtools.gam(
  species,
  env,
  f = NULL,
  test.prop = 0,
 k = 4,
 nback = 1000,
 env.nback = 10000,
 report = NULL,
 overwrite = FALSE,
 rts.reps = 0,
 weights = "equal",
 gam.method = "REML",
 gam.select = TRUE,
 bg.source = "default",
)
```

species	An enmtools.species object
env	A raster or raster stack of environmental data.
f	Standard gam formula
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
k	Dimension of the basis used to represent the smooth term. See documentation for $s()$ for details.
nback	Number of background points to draw from range or env, if background points aren't provided
env.nback	Number of points to draw from environment space for environment space discrimination metrics.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
weights	If this is set to "equal", presences and background data will be assigned weights so that the sum of all presence points weights equals the sum of all background point weights. Otherwise, weights are not provided to the model.
gam.method	Defaults to restricted maximum likelihood to facilitate predictor selection, but if you want to use another method you can pass anything here that gam's "method" argument understands.
gam.select	Controls whether gam algorithm attempts to optimize smoothness and reduce model complexity. See help("gam.selection") for details.

20 enmtools.glm

bg.source

Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.

Arguments to be passed to gam()

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

Examples

```
data(euro.worldclim)
data(iberolacerta.clade)
if(requireNamespace("mgcv", quietly = TRUE)) {
  enmtools.gam(iberolacerta.clade$species$monticola, env = euro.worldclim, f = pres ~ bio1 + bio9)
}
```

enmtools.glm

Takes an emtools.species object with presence and background points, and builds a GLM

Description

Takes an emtools.species object with presence and background points, and builds a GLM

Usage

```
enmtools.glm(
  species,
  env,
  f = NULL
  test.prop = 0,
  eval = TRUE,
  nback = 1000,
  env.nback = 10000,
  report = NULL,
  overwrite = FALSE,
  rts.reps = 0,
 weights = "equal",
 bg.source = "default",
)
```

enmtools.hypervolume 21

Arguments

species	An enmtools.species object
env	A raster or raster stack of environmental data.
f	Standard GLM formula
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
eval	Determines whether model evaluation should be done. Turned on by default, but moses turns it off to speed things up.
nback	Number of background points to draw from range or env, if background points aren't provided
env.nback	Number of points to draw from environment space for environment space discrimination metrics.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
weights	If this is set to "equal", presences and background data will be assigned weights so that the sum of all presence points weights equals the sum of all background point weights. Otherwise, weights are not provided to the model.
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to glm()

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

Examples

Description

Takes an emtools.species object and environmental layers, and constructs a hypervolume using the R package hypervolume

22 enmtools.maxent

Usage

```
enmtools.hypervolume(
  species,
  env,
  samples.per.point = 10,
  reduction.factor = 0.1,
  method = "gaussian",
  ...
)
```

Arguments

Value

An enmtools hypvervolume object containing a hypervolume object, a raster of suitability scores, the species name, and the occurrence data frame.

Examples

```
## Not run:
install.extras(repos='http://cran.us.r-project.org')
data(euro.worldclim)
data(iberolacerta.clade)
env <- euro.worldclim[[c(1,8,12,17)]]
if(requireNamespace("hypervolume", quietly = TRUE)) {
    monticola.hv <- enmtools.hypervolume(iberolacerta.clade$species$monticola, env = env)
}
## End(Not run)</pre>
```

enmtools.maxent

Takes an emtools.species object with presence and background points, and builds a maxent model

Description

Takes an emtools.species object with presence and background points, and builds a maxent model

enmtools.maxent 23

Usage

```
enmtools.maxent(
  species,
  env,
  test.prop = 0,
  nback = 1000,
  env.nback = 10000,
  report = NULL,
  overwrite = FALSE,
  rts.reps = 0,
  bg.source = "default",
  ...
)
```

Arguments

species	An enmtools.species object
env	A raster or raster stack of environmental data.
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
nback	Number of background points to draw from range or env, if background points aren't provided
env.nback	Number of points to draw from environment space for environment space discrimination metrics.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to maxent()

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

Examples

```
## Not run:
install.extras(repos='http://cran.us.r-project.org')
data(euro.worldclim)
data(iberolacerta.clade)
if(requireNamespace("rJava", quietly = TRUE)) {
    enmtools.maxent(iberolacerta.clade$species$monticola, env = euro.worldclim)
```

24 enmtools.ppmlasso

```
}
## End(Not run)
```

enmtools.ppmlasso

Takes an emtools.species object with presence and background points, and builds a Point Process Model (with Lasso penalty)

Description

Takes an emtools.species object with presence and background points, and builds a Point Process Model (with Lasso penalty)

Usage

```
enmtools.ppmlasso(
   species,
   env,
   f = NULL,
   test.prop = 0,
   eval = TRUE,
   nback = 1000,
   env.nback = 10000,
   normalise = FALSE,
   report = NULL,
   overwrite = FALSE,
   rts.reps = 0,
   bg.source = "default",
   ...
)
```

species	An enmtools.species object
env	A raster or raster stack of environmental data.
f	Standard R formula
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
eval	Determines whether model evaluation should be done. Turned on by default, but moses turns it off to speed things up.
nback	Number of background points to draw from range or env, if background points aren't provided
env.nback	Number of points to draw from environment space for environment space discrimination metrics.

enmtools.rf 25

normalise	Should the suitability of the model be normalised? If FALSE (the default), suitability is returned as the predicted number of presence points in each grid cell (occurrence density). If TRUE, occurrence densities are divided by the total predicted density, to give a value ranging from 0 to 1, which represents the proportion of the predicted density for a species that occurs in each grid cell.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to ppmlasso()

Details

This runs a ppmlasso model of a species' distribution. It is generally recommended that background points should be on a grid for this method, as the background points are considered 'quadrature' points, used to estimate an integral. If background points are not provided, the function will generate them on a grid, rather than randomly, as is more usual for other SDM methods.

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

Examples

Description

Takes an emtools.species object with presence and background points, and builds a random forest model

26 enmtools.rf

Usage

```
enmtools.rf(
   species,
   env,
   f = NULL,
   test.prop = 0,
   eval = TRUE,
   nback = 1000,
   env.nback = 10000,
   report = NULL,
   overwrite = FALSE,
   rts.reps = 0,
   bg.source = "default",
   ...
)
```

Arguments

species	An enmtools.species object
env	A raster or raster stack of environmental data.
f	A formula for fitting the model
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
eval	Determines whether model evaluation should be done. Turned on by default, but moses turns it off to speed things up.
nback	Number of background points to draw from range or env, if background points aren't provided
env.nback	Number of points to draw from environment space for environment space discrimination metrics.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to rf()

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

enmtools.rf.ranger 27

Examples

```
data(euro.worldclim)
data(iberolacerta.clade)
enmtools.rf(iberolacerta.clade$species$monticola, env = euro.worldclim, nback = 500)
```

enmtools.rf.ranger

Takes an emtools.species object with presence and background points, and builds a random forest model using the 'probability mode' in package 'ranger'

Description

Takes an emtools.species object with presence and background points, and builds a random forest model using the 'probability mode' in package 'ranger'

Usage

```
enmtools.rf.ranger(
   species,
   env,
   f = NULL,
   test.prop = 0,
   eval = TRUE,
   nback = 1000,
   env.nback = 10000,
   report = NULL,
   overwrite = FALSE,
   rts.reps = 0,
   bg.source = "default",
   ...
)
```

species	An enmtools.species object
env	A raster or raster stack of environmental data.
f	A formula for fitting the model
test.prop	Proportion of data to withhold randomly for model evaluation, or "block" for spatially structured evaluation.
eval	Determines whether model evaluation should be done. Turned on by default, but moses turns it off to speed things up.
nback	Number of background points to draw from range or env, if background points aren't provided

28 enmtools.species

env.nback	Number of points to draw from environment space for environment space discrimination metrics.
report	Optional name of an html file for generating reports
overwrite	TRUE/FALSE whether to overwrite a report file if it already exists
rts.reps	The number of replicates to do for a Raes and ter Steege-style test of significance
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
	Arguments to be passed to ranger

Value

An enmtools model object containing species name, model formula (if any), model object, suitability raster, marginal response plots, and any evaluation objects that were created.

Examples

```
data(euro.worldclim)
data(iberolacerta.clade)
enmtools.rf(iberolacerta.clade$species$monticola, env = euro.worldclim, nback = 500)
```

enmtools.species

Defining a class for enmtools.species.

Description

Each species gets:

Usage

```
enmtools.species(
  range = NA,
  presence.points = NA,
  background.points = NA,
  species.name = NA,
  models = NA
)
```

env.breadth 29

Arguments

range A raster or SpatialPolygon with the actual range they occur in

presence.points

A data frame with sampled localities

background.points

A data frame with absence/pseudoabsence/background localities

species.name A character vector with the species name

models A list of models that are made for the species, which will be stuffed in there as

we go along to pass the check. This is used by internal enmtools functions to

make sure the necessary data is present before processing anything.

Value

Returns an enmtools.species object, either empty or populated with the parameter values that were passed into the function.

env.breadth	Calculates breadth of a model in environment space using latin hyper- cube sampling

Description

Calculates breadth of a model in environment space using latin hypercube sampling

Usage

```
env.breadth(model, env, tolerance = 1e-04, max.reps = 10, chunk.size = 1e+05)
```

Arguments

model	An enmtools.model object or a model object that can be projected using the predict() function
env	A raster, raster stack of environmental data, or a list of minima and maxima for the environmental space to evaluate models over.
tolerance	How close do successive overlap metrics have to be before we decide we're close enough to the final answer
max.reps	Maximum number of attempts that will be made to find suitable starting conditions
chunk.size	How many combinations of environmental variables to try at a time. If your niche breadth in environment space is small, increasing this value may help you get a result.

Value

A list containing the environmental space version of the B2 metric and a plot of B2 estimates as a function of sample size, used as a convergence diagnostic.

30 env.evaluate

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
cyreni.glm <- enmtools.glm(cyreni, euro.worldclim, test.prop = 0.2,
f = pres ~ bio1 + bio12, nback = 500)
env.breadth(cyreni.glm, euro.worldclim)</pre>
```

env.evaluate

Calculates evaluation metrics (AUC, etc.) using latin hypercube sampling in environment space

Description

Calculates evaluation metrics (AUC, etc.) using latin hypercube sampling in environment space

Usage

```
env.evaluate(
   species,
   model,
   env,
   bg.source = "background",
   n.background = 10000,
   test.eval = FALSE,
   ...
)
```

Arguments

species	An enmtools.species object
mode1	An enmtools.model object or a model that can be projected using the predict() function of dismo
env	A raster or raster stack of environmental data.
bg.source	Determines whether minima and maxima of the environment space should be picked using the environment layers or the background points.
n.background	The number of background points to sample from the environment space.
test.eval	When set to "true", env.evaluate evaluates the test data stored in the model object instead of the training data.
	Arguments to be passed to other functions

Value

A dismo evaluate object measuring the performance of model predictions in environment space.

env.overlap 31

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
cyreni.glm <- enmtools.glm(cyreni, euro.worldclim, test.prop = 0.2,
f = pres ~ bio1 + bio12, nback = 500)
env.evaluate(cyreni, cyreni.glm, euro.worldclim)</pre>
```

env.overlap

Calculates overlap between models in environment space using latin hypercube sampling

Description

Calculates overlap between models in environment space using latin hypercube sampling

Usage

```
env.overlap(
  model.1,
  model.2,
  env,
  tolerance = 0.001,
  max.reps = 10,
  cor.method = "spearman",
  chunk.size = 1e+05,
  recal.model.1 = NA,
  recal.model.2 = NA
)
```

model.1	An enmtools.model object model object that can be projected using the predict() function
model.2	Another enmtools.model object or other model object that can be projected using the predict() function
env	A raster, raster stack of environmental data, or a list of minima and maxima for the environmental space to evaluate models over
tolerance	How close do successive overlap metrics have to be before we decide we're close enough to the final answer
max.reps	Maximum number of attempts that will be made to find suitable starting conditions
cor.method	Which method to use for calculating correlations between models
chunk.size	How many combinations of environmental variables to try at a time. If your niche breadth in environment space is small, increasing this value may help you get a result.

32 euro.worldclim

recal.model.1 Optional. The output of enmtools.recalibrate for model 1, which needs to have been run with "recalibrate = TRUE".

recal.model.2 Optional. The output of enmtools.recalibrate for model 2, which needs to have been run with "recalibrate = TRUE".

Value

A list of values measuring the overlap between models in environment space, as well as some plots depicting change of the estimates as a function of how many samples were used, which are included as a sort of convergence diagnostic.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
monticola <- iberolacerta.clade$species$monticola
cyreni.glm <- enmtools.glm(cyreni, euro.worldclim, f = pres ~ bio1 + bio12, nback = 500)
monticola.glm <- enmtools.glm(monticola, euro.worldclim, f = pres ~ bio1 + bio12, nback = 500)
env.overlap(cyreni.glm, monticola.glm, euro.worldclim)</pre>
```

euro.worldclim

Worldclim data for Europe

Description

This is a fairly low-resolution set of Worldclim layers for Europe to be used in demonstrating ENMTools functions.

Usage

```
data(euro.worldclim)
```

Format

A raster brick with 19 worldclim layers.

geog.range.overlap 33

geog.range.overlap	Takes two emtools.species objects with range rasters, calculates over- lap between them as in Fitzpatrick and Turelli 2006

Description

Takes two emtools.species objects with range rasters, calculates overlap between them as in Fitz-patrick and Turelli 2006

Usage

```
geog.range.overlap(x, y)
```

Arguments

- x An enmtools.species object containing a range raster
- y An enmtools.species object containing a range raster

Value

A numeric value measuring range overlap.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
monticola <- iberolacerta.clade$species$monticola
cyreni$range <- background.raster.buffer(cyreni$presence.points, 100000, euro.worldclim)
monticola$range <- background.raster.buffer(monticola$presence.points, 100000, euro.worldclim)
geog.range.overlap(cyreni, monticola)</pre>
```

hypervolume.overlap Takes an emtools.species object and environmental layers, and constructs a hypervolume using the R package hypervolume

Description

Takes an emtools.species object and environmental layers, and constructs a hypervolume using the R package hypervolume

34 iberolacerta.clade

Usage

```
hypervolume.overlap(
  species.1,
  species.2,
  env = NA,
  reduction.factor = 0.1,
  ...
)
```

Arguments

species.1 An enmtools.species or enmtools.hypervolume object
species.2 An enmtools.species or enmtools.hypervolume object
env A stack of environmental rasters, required when enmtools.species objects are passed
reduction.factor
Passed to hypervolume functions
... Extra parameters to be passed to enmtools.hypervolume

Value

A list containing a set of hypervolume objects and the overlap that was measured between them.

Examples

```
## Not run:
install.extras(repos='http://cran.us.r-project.org')
data(euro.worldclim)
data(iberolacerta.clade)
mont <- iberolacerta.clade$species$monticola
cyr <- iberolacerta.clade$species$cyreni
env <- euro.worldclim[[c(1,8,12,17)]]
if(requireNamespace("hypervolume", quietly = TRUE)) {
    hypervolume.overlap(mont, cyr, env = env)
}
## End(Not run)</pre>
```

iberolacerta.clade

GBIF data for a clade of Iberolacerta lizards from spain

Description

This is some sample data downloaded from GBIF for the purposes of demonstrating ENMTools functionality.

identity.test 35

Usage

```
data(iberolacerta.clade)
```

Format

An enmtools.clade object with seven species and a phylogeny.

identity.test

identity.test Conduct a niche identity/equivalency test as described in Warren et al. 2008.

Description

identity.test Conduct a niche identity/equivalency test as described in Warren et al. 2008.

Usage

```
identity.test(
  species.1,
  species.2,
  env,
  type,
  f = NULL,
  nreps = 99,
  nback = 1000,
  bg.source = "default",
  low.memory = FALSE,
  rep.dir = NA,
  ...
)
```

species.1	An emtools.species object
species.2	An enmtools.species object
env	A RasterLayer or RasterStack object containing environmental data
type	The type of model to construct, currently accepts "glm", "mx", "bc", "gam", "rf", or "dm"
f	A function to use for model fitting. Only required for GLM models at the moment.
nreps	Number of replicates to perform
nback	Number of background points for models
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.

36 install.extras

low.memory	When set to TRUE, replicate models are written to disc instead of being stored
	in the output object. Replicate models stored in the output object contain paths
	to the replicate models on disk instead of the rasters themselves.
rep.dir	Directory for storing replicate models when low.memory is set to TRUE. If not specified, the working directory will be used.
	Additional arguments to be passed to model fitting functions.

Value

results A list containing the replicates, models for the empirical data, and summary statistics and plots.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
monticola <- iberolacerta.clade$species$monticola
cyreni$range <- background.raster.buffer(cyreni$presence.points, 100000, euro.worldclim)
monticola$range <- background.raster.buffer(monticola$presence.points, 100000, euro.worldclim)
identity.test(cyreni, monticola, env = euro.worldclim, type = "glm",
f = pres ~ bio1 + bio12, nreps = 10)</pre>
```

install.extras

install.extras

Description

Convenience function that installs all extra packages used in ENMTools. ENMTools uses functions from a lot of external packages, and due to CRAN best practices it doesn't install those packages by default. The function install.extras() just calls install.packages with a list of all of the extra packages. At present this list includes mgcv, ecospat, randomForest, hypervolume, ape, ppmlasso, leaflet, ranger, CalibratR, caret, and ResourceSelection.

Usage

```
install.extras(repos = "http://cran.us.r-project.org", ...)
```

Arguments

repos URL for the repository to use for installing R packages
... Other parameters to be passed to install.packages

Value

No return value.

Examples

```
install.extras()
```

```
interactive.plot.enmtools.model
```

Plot an enmtools.model object on an interactive map

Description

Function that take an enmtools.model object and plots an interactive map of the presence points, background points (if applicable), and species suitability map. This function uses leaflet for mapping and will only function properly if you have an active internet connection.

Usage

```
## S3 method for class 'enmtools.model'
interactive.plot(
    x,
    map.provider = "Esri.WorldPhysical",
    cluster.points = FALSE,
    raster.opacity = 1,
    ...
)
```

Arguments

```
x entools.model object to plot

map.provider Name of a map provider for the underlying interactive base map. Default is

"Esri.WorldPhysical", and attractive topographic map with no place labels. A

preview of all map provider options can be viewed at http://leaflet-extras.

github.io/leaflet-providers/preview/

cluster.points Should points be clustered? If TRUE, points close together will be grouped into

clusters that can be interactively expanded by clicking on them.

raster.opacity Specifies the opacity level of the suitability raster.

other arguments (not used currently)
```

Value

An interactive leaflet plot depicting the predictions and data from the enmtools.model object.

38 marginal.plots

```
interactive.plot.enmtools.species
```

Plot an enmtools.species object on an interactive map

Description

Function that take an enmtools.species object and plots an interactive map of the presence points, background points (if applicable), and species range raster (if applicable). This function uses leaflet for mapping and will only function properly if you have an active internet connection.

Usage

```
## S3 method for class 'enmtools.species'
interactive.plot(
    x,
    map.provider = "Esri.WorldPhysical",
    cluster.points = FALSE,
    ...
)
```

Arguments

X	entools.species object to plot
map.provider	Name of a map provider for the underlying interactive base map. Default is "Esri.WorldPhysical", and attractive topographic map with no place labels. A preview of all map provider options can be viewed at http://leaflet-extras.github.io/leaflet-providers/preview/
cluster.points	Should points be clustered? If TRUE, points close together will be grouped into clusters that can be interactively expanded by clicking on them.
	other arguments (not used currently)

Value

An interactive leaflet plot visualizing the data present in the species object.

marg	inal.plots	marginal.plots Plots the marginal response of a model to an environ- mental variable with all other variables held at their mean in env

Description

marginal.plots Plots the marginal response of a model to an environmental variable with all other variables held at their mean in env

moses.list 39

Usage

```
marginal.plots(model, env, layer, standardize = TRUE)
```

Arguments

model An enmtools model object

env A RasterLayer or RasterStack object containing environmental data

layer The name of the layer to plot

standardize Whether to set the maximum of the response function to 1, or to instead use the

raw values.

Value

results A plot of the marginal response of the model to the environmental variable.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni.glm <- enmtools.glm(iberolacerta.clade$species$cyreni,
f = pres ~ bio1 + bio12, euro.worldclim)
marginal.plots(cyreni.glm, euro.worldclim, "bio1")</pre>
```

moses.list

Takes a list of enmtools.species objects and uses model selection to ask whether they're better treated jointly or separately

Description

Takes a list of enmtools.species objects and uses model selection to ask whether they're better treated jointly or separately

Usage

```
moses.list(
  species.list,
  env,
  f = NULL,
  eval = FALSE,
  nback = 1000,
  bg.source = "default",
  ...
)
```

40 multistack.pca

Arguments

species.list A list of enmtools.species objects, or an enmtools.clade object.

env A raster or raster stack of environmental data.

f A GLM-style function for model fitting

eval Boolean indicating whether or not GLMs should be evaluated using AUC/TSS/etc.

nback Number of background points to generate, if any

bg. source Source for drawing background points. If "points", it just uses the background

points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the

first environmental layer.

further arguments to be passed to enmtools.glm

Value

A list containing GLMs for the groups separately and together, as well as AIC values for those models.

multistack.pca multistack.pca, simultaneous PCA on more than one stack of environmental rasters

Description

multistack.pca, simultaneous PCA on more than one stack of environmental rasters

Usage

```
multistack.pca(..., n = 2)
```

Arguments

... Any number of environmental raster stacks or bricks

n The number of PCA layers to return

Value

A list containing a stack or brick of rasters for each input set representing the top n pca axes of the initial environmental variables, as well as the pca object from the analysis that produced them and some useful plots showing the distribution of each PC in the different stacks.

node.overlap 41

Examples

```
world <- raster::getData(name = "worldclim", download = TRUE, var = "bio", res = 5)
test1 <- crop(world, extent(10, 15, 10, 15))
test2 <- crop(world, extent(17, 22, 17, 22))
test3 <- crop(world, extent(24, 26, 24, 26))
multistack.pca(test1, test2, test3)</pre>
```

node.overlap

Takes an overlap matrix and a tree and returns average overlap at nodes using Fitzpatrick & Turelli averaging method. Typicall called via enmtools.aoc rather than used directly.

Description

Takes an overlap matrix and a tree and returns average overlap at nodes using Fitzpatrick & Turelli averaging method. Typicall called via enmtools.aoc rather than used directly.

Usage

```
node.overlap(overlap, tree)
```

Arguments

overlap An overlap matrix

tree A tree

Value

A data frame of node ages and overlaps

point.overlap

Takes two emtools.species objects with range rasters, calculates overlap between them as in Cardillo and Warren 2016

Description

Takes two emtools.species objects with range rasters, calculates overlap between them as in Cardillo and Warren 2016

Usage

```
point.overlap(x, y)
```

42 rangebreak.blob

Arguments

x An enmtools.species object containing presence points

y An enmtools.species object containing presence points

Value

A numeric value measuring the overlap between point distributions.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
monticola <- iberolacerta.clade$species$monticola
if(requireNamespace("fields", quietly = TRUE)) {
    point.overlap(cyreni, monticola)
}</pre>
```

rangebreak.blob

rangebreak.blob Conduct a blob rangebreak test as described in Glor and Warren 2011.

Description

rangebreak.blob Conduct a blob rangebreak test as described in Glor and Warren 2011.

Usage

```
rangebreak.blob(
  species.1,
  species.2,
  env,
  type,
  f = NULL,
  nreps = 99,
  nback = 1000,
  bg.source = "default",
  low.memory = FALSE,
  rep.dir = NA,
  ...
)
```

rangebreak.blob 43

Arguments

species.1	An emtools.species object
species.2	An enmtools.species object
env	A RasterLayer or RasterStack object containing environmental data
type	The type of model to construct, currently accepts "glm", "mx", "bc", "gam", or "dm" $$
f	A function to use for model fitting. Only required for GLM models at the moment.
nreps	Number of replicates to perform
nback	Number of background points for models
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
low.memory	When set to TRUE, replicate models are written to disc instead of being stored in the output object. Replicate models stored in the output object contain paths to the replicate models on disk instead of the rasters themselves.
rep.dir	Directory for storing replicate models when low.memory is set to TRUE. If not specified, the working directory will be used.
	Additional arguments to be passed to model fitting functions.

Value

results A list containing the replicates, models for the empirical data, and summary statistics and plots.

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
aranica <- iberolacerta.clade$species$aranica
if(requireNamespace("fields", quietly = TRUE)) {
    rangebreak.blob(cyreni, aranica, env = euro.worldclim, type = "glm",
f= pres ~ bio1 + bio12, nreps = 10)
}</pre>
```

44 rangebreak.linear

rangebreak.linear Conduct a linear rangebreak test as described in Glor and Warren 2011.

Description

rangebreak.linear Conduct a linear rangebreak test as described in Glor and Warren 2011.

Usage

```
rangebreak.linear(
  species.1,
  species.2,
  env,
  type,
  f = NULL,
  nreps = 99,
  nback = 1000,
  bg.source = "default",
  low.memory = FALSE,
  rep.dir = NA,
  ...
)
```

Arguments

species.1	An emtools.species object
species.2	An enmtools.species object
env	A RasterLayer or RasterStack object containing environmental data
type	The type of model to construct, currently accepts "glm", "mx", "bc", "gam", or "dm"
f	A function to use for model fitting. Only required for GLM models at the moment.
nreps	Number of replicates to perform
nback	Number of background points for models
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
low.memory	When set to TRUE, replicate models are written to disc instead of being stored in the output object. Replicate models stored in the output object contain paths to the replicate models on disk instead of the rasters themselves.
	· · · · · · · · · · · · · · · · · · ·
rep.dir	Directory for storing replicate models when low.memory is set to TRUE. If not specified, the working directory will be used.

rangebreak.ribbon 45

Value

results A list containing the replicates, models for the empirical data, and summary statistics and plots.

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
aranica <- iberolacerta.clade$species$aranica
rangebreak.linear(cyreni, aranica, env = euro.worldclim, type = "glm",
f= pres ~ bio1 + bio12, nreps = 10)</pre>
```

rangebreak.ribbon

rangebreak.ribbon Conduct a ribbon rangebreak test as described in Glor and Warren 2011.

Description

rangebreak.ribbon Conduct a ribbon rangebreak test as described in Glor and Warren 2011.

Usage

```
rangebreak.ribbon(
  species.1,
  species.2,
  ribbon,
  env,
  type,
  f = NULL,
  width = 1,
  nreps = 99,
  nback = 1000,
  bg.source = "default",
  low.memory = FALSE,
  rep.dir = NA,
  ...
)
```

Arguments

species.1 An emtools.species object species.2 An emtools.species object

ribbon An enmtools.species object representing the region of marginal habitat in the overlap between the species' ranges

46 rangebreak.ribbon

env	A RasterLayer or RasterStack object containing environmental data
type	The type of model to construct, currently accepts "glm", "mx", "bc", or "dm"
f	A function to use for model fitting. Only required for GLM models at the moment.
width	Width of the ribbon, in the same units as the occurrence points (e.g, decimal degrees)
nreps	Number of replicates to perform
nback	Number of background points for models
bg.source	Source for drawing background points. If "points", it just uses the background points that are already in the species object. If "range", it uses the range raster. If "env", it draws points at randome from the entire study area outlined by the first environmental layer.
low.memory	When set to TRUE, replicate models are written to disc instead of being stored in the output object. Replicate models stored in the output object contain paths to the replicate models on disk instead of the rasters themselves.
rep.dir	Directory for storing replicate models when low.memory is set to TRUE. If not specified, the working directory will be used.
	Additional arguments to be passed to model fitting functions.

Value

results A list containing models for the replicates, models for the empirical data, and summary statistics and plots.

```
data(iberolacerta.clade)
data(euro.worldclim)
cyreni <- iberolacerta.clade$species$cyreni
aranica <- iberolacerta.clade$species$aranica

# We're just going to fudge together occurrence data from a ribbon here
# from random points between the two species' ranges
p <- data.frame(Longitude = runif(50, -4, -2), Latitude = runif(50, 40, 43))
bg <- background.points.buffer(p, 100000, 100, euro.worldclim[[1]])
ribbon <- enmtools.species(species.name = "ribbon", presence.points = p, background.points = bg)
rangebreak.ribbon(cyreni, aranica, ribbon = ribbon, env = euro.worldclim,
type = "glm", f= pres ~ bio1 + bio12, nreps = 10)</pre>
```

raster.breadth 47

raster.breadth	raster.breadth, applies measures of niche breadth to an ENM

Description

This function measures the spatial heterogeneity of the distribution of suitability scores from an ENM. It returns Levins' two metrics of niche breadth.

Usage

```
raster.breadth(x, verbose = FALSE)
```

Arguments

x An object of class raster or RasterLayer, or an ENMTools model object contain-

ing a suitability raster.

verbose Controls printing of diagnostic messages

Value

results A vector containing the two metrics B1 and B2 for niche breadth.

Examples

```
data(iberolacerta)
data(euro.worldclim)
aurelioi.glm <- enmtools.glm(iberolacerta.clade$species$aurelioi, euro.worldclim,
f = pres ~ bio1 + bio12)
raster.breadth(aurelioi.glm)</pre>
```

raster.cor

Calculates the correlation coefficient between two rasters.

Description

Calculates the correlation coefficient between two rasters.

Usage

```
raster.cor(x, y, method = "spearman")
```

Arguments

x Either a raster or an ENMTools model object with a suitability raster.
y Either a raster or an ENMTools model object with a suitability raster.

method The method to be used for calculating correlations. Defaults to spearman, but

can take "kendall" or "pearson" as well.

48 raster.cor.matrix

Value

A numeric correlation coefficient.

Examples

```
data(euro.worldclim)
raster.cor(euro.worldclim[[1]], euro.worldclim[[2]])
```

raster.cor.matrix

Takes a raster stack and returns a data frame containing Pearson correlation coefficients between the included rasters

Description

Takes a raster stack and returns a data frame containing Pearson correlation coefficients between the included rasters

Usage

```
raster.cor.matrix(env, method = "pearson")
```

Arguments

env A RasterStack object containing two or more rasters

method Type of correlation to measure. Can do "pearson", "kendall", or "spearman"

Value

A data frame of correlation coefficients for a set of rasters.

```
data(euro.worldclim)
raster.cor.matrix(euro.worldclim)
```

raster.cor.plot 49

raster.cor.plot	Takes a raster stack and returns a data frame containing Pearson cor- relation coefficients between the included rasters
	returners ee egg-tetering e erween me trietinaea raasiers

Description

Takes a raster stack and returns a data frame containing Pearson correlation coefficients between the included rasters

Usage

```
raster.cor.plot(env, method = "pearson")
```

Arguments

env A RasterStack object containing two or more rasters

method Type of correlation to measure. Can do "pearson", "kendall", or "spearman"

Value

A list of two plots. The first maps the correlations between rasters into an MDS space, so that predictors that fall close together in that space are more correlated. The second plot is a heatmap depicting the correlations between pairs of layers.

Examples

```
data(euro.worldclim)
raster.cor.plot(euro.worldclim)
```

raster.overlap

raster.overlap, measures overlap between two ENMs

Description

This function measures similarity in the geographic distribution of suitability scores from two ENMs. It returns two metrics, I and D. These metrics are described in Warren et al. 2008.

Usage

```
raster.overlap(x, y, verbose = FALSE)
```

raster.pca

Arguments

X	A raster or RasterLayer object, or ENMTools model object containing a suitability raster.
У	Another raster or RasterLayer object, or ENMTools model object containing a suitability raster.
verbose	Controls printing of diagnostic messages

Value

results A vector containing the three metrics (I, D, and Spearman rank correlation)

Examples

```
data(iberolacerta.clade)
data(euro.worldclim)
aurelioi.glm <- enmtools.glm(iberolacerta.clade$species$aurelioi,
euro.worldclim, f = pres ~ bio1 + bio12)
aranica.glm <- enmtools.glm(iberolacerta.clade$species$aranica,
euro.worldclim, f = pres ~ bio1 + bio12)
raster.overlap(aurelioi.glm, aranica.glm)</pre>
```

raster.pca

raster.pca, PCA on a set of environmental rasters

Description

raster.pca, PCA on a set of environmental rasters

Usage

```
raster.pca(env, n)
```

Arguments

env A set of environmental layers n The number of PCA layers to return

Value

A list containing a stack of rasters representing the top n pca axes of the initial environmental variables, as well as the pca object from the analysis that produced them.

```
env.pca <- raster.pca(euro.worldclim, 2)</pre>
```

raster.resid 51

raster.resid	raster.resid Measure standardized residuals from a linear regression between two rasters.

Description

This function builds a linear model for the relationship between two rasters, and returns the linear model and a spatial raster of the residuals from that model.

Usage

```
raster.resid(x, y)
```

Arguments

x A raster or RasterLayer object, or ENMTools model object containing a suitability raster.

y Another raster or RasterLayer object, or ENMTools model object containing a suitability raster.

Value

results A list containing a raster of residuals from a linear regression between the two supplied rasters and the linear model itself.

Examples

Description

This function is used by a lot of the metrics calculated by ENMTools, in order to standardize suitability scores so they sum to 1 over a geographic space.

Usage

```
raster.standardize(x, verbose = FALSE)
```

Arguments

х	A raster or RasterLayer object, or an ENMTools model object containing a suitability raster.
verbose	Controls printing of diagnostic messages

52 sim.points

Value

A new raster object, standardized so that values sum to 1

Examples

```
data(euro.worldclim)
raster.standardize(euro.worldclim[[1]])
```

sim.points

Simulate a point process from an enmtools.model object

Description

Function that takes an enmtools . model object and simulates points from it using a point process.

Usage

```
sim.points(
  object,
  n.points = 1000,
  seed = NA,
  sample.type = "ppp",
  replace = FALSE,
  threshold = NA,
  ...
)
```

Arguments

object entools.model object to simulate from

n.points approximate number of points to simulate. You may get small number fewer or

greater. If you need an exact number of points, generate too many, then drop the

extra ones.

seed optional seed for the random number generator

sample.type method for sampling occurrence points. Default is "ppp", which is a poisson

point process. Also accepts "binomial" for treating suitabilities as binomial trials, "thresh.pa" for sampling with equal probability every grid cell above a certain threshold value, and "thresh.con" for sampling in proportion to suitability

above a certain threshold value.

replace whether to sample with replacement.

threshold a threshold suitability below which probability of sampling drops to zero. Used

for "thresh.pa" and "thresh.con" sampling.

... additional parameters, not currently used but included for S3 compatability

Value

A data frame of simulated points from the enmtools.model object

species.from.file 53

column.	species.from.file	Takes a csv file and uses it to construct one or more enmtools.species objects. It constructs one object per unique value in the "species.col" column.
---------	-------------------	--

Description

Takes a csv file and uses it to construct one or more enmtools.species objects. It constructs one object per unique value in the "species.col" column.

Usage

```
species.from.file(filename, species.col = "species")
```

Arguments

filename Name of a .csv file

species.col Name of the column from the csv file to use for species names. Default is

"species".

Value

A list containing species objects, one for each unique value in species.col.

threespace.plot	threespace.plot, A plot that compares the environmental distribution of presence points, background points, and the set of supplied environmental layers.

Description

threespace.plot, A plot that compares the environmental distribution of presence points, background points, and the set of supplied environmental layers.

Usage

```
threespace.plot(model, env, maxpts = NA)
```

Arguments

model	An enmtools.model object
env	A set of environment layers

maxpts Maximum number of points to plot from env layers

54 trimdupes.by.raster

Value

A ggplot2 object that plots the distribution of environments in the climate layers to the distribution of environments at background and presence localities.

Examples

```
my.model<- enmtools.gam(iberolacerta.clade$species$monticola, euro.worldclim)
threespace.plot(my.model, euro.worldclim)</pre>
```

trimdupes.by.raster

Takes a set of points and a raster mask and returns a data frame trimmed so that only one point is returned per grid cell in the mask raster.

Description

Takes a set of points and a raster mask and returns a data frame trimmed so that only one point is returned per grid cell in the mask raster.

Usage

```
trimdupes.by.raster(points, mask)
```

Arguments

points A two column data frame with X and Y coordinates

mask A raster to use as a mask for drawing points

Value

A new data frame with one point per grid cell.

```
data(iberolacerta.clade)
data(euro.worldclim)
pts <- iberolacerta.clade$species$monticola$presence.points
trimdupes.by.raster(pts, euro.worldclim)</pre>
```

visualize.enm 55

visualize.enm	visualize.enm, Makes a heatmap of suitability of habitat in environ-
	ment space according to a given model

Description

visualize.enm, Makes a heatmap of suitability of habitat in environment space according to a given model

Usage

```
visualize.enm(
  model,
  env,
  nbins = 100,
  layers = names(env)[1:2],
  plot.test.data = FALSE,
  plot.points = TRUE,
  minmax = NA
)
```

Arguments

model	An enmtools.model object
env	A set of environmental layers
nbins	The number of bins per layer to use for drawing environment space
layers	A vector of layer names to use for drawing environment space
plot.test.data	Logical determining whether test data should be plotted, if present. If test data is plotted, it will appear as translucent green triangles.
plot.points	Logical determining whether presence points should be plotted on suitability plot
minmax	A named list of minima and maxima for each axis, in case the user wants to constrain or expand the space over which models are plotted.

Value

suit.plot A list containing two dimensional plot of an ENM in environment space and a plot of the available environments.

```
data(iberolacerta.clade)
data(euro.worldclim)
aurelioi.glm <- enmtools.glm(iberolacerta.clade$species$aurelioi, euro.worldclim,
f = pres ~ poly(bio1, 4) + poly(bio12, 4))
visualize.enm(aurelioi.glm, euro.worldclim, layers = c("bio1", "bio12"))</pre>
```

56 visualize.overlap

visualize.overlap	visualize.overlap, Makes a contour map of suitability of habitat in en-
visualize.overlap	visualize.overlap, makes a contour map of suitability of nabital in en-
	vironment space for two models

Description

visualize.overlap, Makes a contour map of suitability of habitat in environment space for two models

Usage

```
visualize.overlap(
  model.1,
  model.2,
  env,
  nbins = 100,
  layers,
  plot.points = TRUE
)
```

Arguments

model.1	An enmtools.model object
model.2	An enmtools.model object
env	A set of environmental layers
nbins	The number of bins per layer to use for drawing environment space
layers	A vector of layer names to use for drawing environment space
plot.points	Logical determining whether presence points should be plotted on suitability plot

Value

overlap.plot A two dimensional plot of an ENM

```
data(iberolacerta.clade)
ar <- iberolacerta.clade$species$aranica
au <- iberolacerta.clade$species$aurelioi
data(euro.worldclim)
aranica.bc <- enmtools.bc(ar, euro.worldclim)
aurelioi.bc <- enmtools.bc(au, euro.worldclim)
visualize.overlap(aranica.bc, aurelioi.bc, euro.worldclim, layers = c("bio1", "bio9"))</pre>
```

Index

* background	* equivalency
background.test, 5	background.test, 5
threespace.plot, 53	identity.test,35
* barrier	* extrapolation
rangebreak.blob,42	threespace.plot, 53
rangebreak.linear,44	* hypothesis-testing
rangebreak.ribbon,45	identity.test,35
* biogeography	rangebreak.blob,42
rangebreak.blob,42	rangebreak.linear,44
rangebreak.linear,44	rangebreak.ribbon,45
rangebreak.ribbon,45	* hypothesis
* breadth	background.test, 5
calc.B1,7	* identity
calc.B2,8	identity.test,35
* comparison	* keywords
threespace.plot, 53	raster.breadth,47
* correlation	raster.overlap,49
raster.resid,51	raster.standardize, 51
* datasets	* niche
euro.worldclim,32	calc.B1, 7
iberolacerta.clade,34	calc.B2,8
* enmtools	enmtools.ecospat.bg, 16
background.test,5	enmtools.ecospat.id, 17
identity.test,35	visualize.enm, 55
rangebreak.blob,42	visualize.overlap,56
rangebreak.linear,44	* overlap
rangebreak.ribbon,45	visualize.overlap, 56
* enm	* pca
calc.B1,7	multistack.pca, 40
calc.B2,8	raster.pca,50
enmtools.ecospat.bg, 16	threespace.plot, 53
enmtools.ecospat.id, 17	* plot
marginal.plots,38	enmtools.ecospat.bg, 16
visualize.enm,55	enmtools.ecospat.id, 17
visualize.overlap,56	marginal.plots, 38
* environment	visualize.enm, 55
multistack.pca,40	visualize.overlap, 56
raster.pca,50	* presence
threespace.plot, 53	threespace.plot, 53

58 INDEX

* rangebreak	enmtools.maxent, 22
rangebreak.blob,42	enmtools.ppmlasso,24
rangebreak.linear,44	enmtools.rf, 25
rangebreak.ribbon,45	enmtools.rf.ranger, 27
* raster	enmtools.species, 28, 38
multistack.pca,40	env.breadth, 29
raster.pca, 50	env.evaluate, 30
raster.resid, 51	env.overlap, 31
* residuals	euro.worldclim, 32
raster.resid, 51	
* response	geog.range.overlap,33
marginal.plots, 38	
* sdm	hypervolume.overlap,33
calc.B1, 7	ibaralacenta alada 24
calc.B2,8	iberolacerta.clade, 34
enmtools.ecospat.bg, 16	identity.test, 35
enmtools.ecospat.id, 17	install.extras, 36
marginal.plots, 38	interactive.plot.enmtools.model, 37
visualize.enm, 55	interactive.plot.enmtools.species, 38
visualize.overlap, 56	leaflet, <i>37</i> , <i>38</i>
* testing	iear iet, 37, 30
background.test, 5	marginal.plots, 38
background. test, s	moses.list, 39
add.env, 3	multistack.pca, 40
background.points.buffer, 4	node.overlap,41
background.raster.buffer,4	
background.shape.buffer, 5	point.overlap,41
background.test, 5	1 11 1 40
3	rangebreak.blob,42
calc.B1, 7	rangebreak.linear,44
calc.B2,8	rangebreak.ribbon,45
check.bg, 8	ranger, 28
check.clade, 9	raster.breadth,47
check.species, 9	raster.cor,47
combine.species, 10	raster.cor.matrix,48
	raster.cor.plot,49
drop.species, 10	raster.overlap,49
	raster.pca, 50
enmtools.aoc, 11	raster.resid,51
enmtools.bc, 12	raster.standardize,51
enmtools.calibrate, 13	ain mainta 50
enmtools.clade, 14	sim.points, 52
	species.from.file,53
enmtools.dm, 15	
enmtools.dm, 15 enmtools.ecospat.bg, 16	threespace.plot, 53
enmtools.dm, 15 enmtools.ecospat.bg, 16 enmtools.ecospat.id, 17	
enmtools.dm, 15 enmtools.ecospat.bg, 16	threespace.plot, 53