# Package 'dsims'

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Type Package

Title Distance Sampling Simulations

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Description Performs distance sampling simulations. 'dsims' repeatedly generates instances of a user defined population within a given survey region. It then generates realisations of a survey design and simulates the detection process. The data are then analysed so that the results can be compared for accuracy and precision across all replications. This process allows users to optimise survey designs for their specific set of survey conditions. The effects of uncertainty in population distribution or parameters can be investigated under a number of simulations so that users can be confident that they have achieved a robust survey design before deploying vessels into the field. The distance sampling designs used in this package from 'dssd' are detailed in Chapter 7 of Advanced Distance Sampling, Buckland et. al. (2008, ISBN-13: 978-0199225873). General distance sampling methods are detailed in Introduction to Distance Sampling: Estimating Abundance of Biological Populations, Buckland et. al. (2004, ISBN-13: 978-0198509271). Find out more about estimating animal/plant abundance with distance sampling at <a href="http://distancesampling.org/">http://distancesampling.org/</a>.

License GPL (>= 2) Language en-GB

URL https://github.com/DistanceDevelopment/dsims

BugReports https://github.com/DistanceDevelopment/dsims/issues

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Collate 'AICc.R' 'generic.functions.R' 'Density.Summary.R' 'Density.R'
'Population.Description.R' 'Detectability.R' 'Population.R'
'Survey.R' 'DS.Analysis.R' 'Simulation.R' 'ClassConstructors.R'
'Simulation.Summary.R' 'Survey.LT.R' 'Survey.PT.R'
'accumulate.PP.results.R' 'accumulate.warnings.R'
'add.covariate.values.R' 'add.summary.results.R'
'calc.perp.dists.R' 'calc.rad.dists.R'
'calculate.scale.param.R' 'check.covariates.R'
'check.simulation.R' 'check.transects.R'
'create.results.arrays.R' 'description.summary.R'
'dsims-package.R' 'generate.pop.D.R' 'generate.pop.N.R'
'get.covered.area.lines.R' 'get.covered.area.points.R'
'get.density.surface.R' 'message.handler.R'
'modify.strata.for.analysis.R' 'process.dist.shapes.R'
'read.line.transects.R' 'read.point.transects.R'
'read.seg.transects.R' 'run.simulation.R' 'rztpois.R'
'save.sim.results.R' 'simulate.detections.R'
'single.sim.loop.R' 'store.ddf.results.R' 'store.dht.results.R'

### NeedsCompilation no

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### **Description**

Runs simulations of distance sampling surveys to help users optimise their survey designs for their particular study.

#### **Details**

The full process involves defining the study region, a description of the population of interest (including its distribution within the study region), a survey design, a detection process and one or more models to fit to the resulting data. The simulation engine will then use this information to generate both a population and a set of transects and simulate the detection process. The resulting data will be analysed and the estimates stored. By repeating this many times we can test the accuracy and precision of our estimates from various survey designs given our particular population of interest.

This package interfaces with the survey design package 'dssd' to create the survey regions, designs and generate the survey transects. While the 'DSsim' simulation package relied on survey transects already being contained in shapefiles within the supplied directory, dsims will generate the survey transects directly in R.

The main functions in this package are: make.density, make.population.description, make.detectability, make.ds.analysis, make.simulation, run.survey and run.simulation. See also make.region and make.design in the dssd package for examples of how to define study regions and designs.

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Further information on distance sampling methods and example code is available at <a href="http://distancesampling.org/R/">http://distancesampling.org/R/</a>.

Also see our website for vignettes / example code at http://examples.distancesampling.org.

For help with distance sampling and this package, there is a Google Group https://groups.google.com/forum/#!forum/distance-sampling.

### Author(s)

Laura Marshall < lhm@st-and.ac.uk>

add.hotspot

S4 generic method to add a hotspot to the density grid

### **Description**

Uses a Gaussian decay around a central location to add a hotspot to the density grid.

#### Usage

```
add.hotspot(object, centre, sigma, amplitude)
## S4 method for signature 'Density'
add.hotspot(object, centre, sigma, amplitude)
```

### Arguments

object a Density-class object

centre an x,y-coordinate giving the centre of the hotspot

sigma a value giving the scale parameter for a gaussian decay

amplitude the height of the hotspot at its centre

#### Value

the updated Density-class object

#### See Also

```
make.density
```

analyse.data 5

### **Description**

This method carries out an analysis of distance sampling data. This method is provided to allow the user to perform diagnostics of the analyses used in the simulation. The data argument can be obtained by a call to simulate.survey(object, dht.table = TRUE). Note if the first object supplied is of class DS.Analysis then the second argument must be of class DDf.Data. The data argument may be of either class for an object argument of class Simulation.

### Usage

```
analyse.data(analysis, data.obj, ...)
## S4 method for signature 'DS.Analysis,Survey'
analyse.data(analysis, data.obj, warnings = NULL, ...)
## S4 method for signature 'DS.Analysis,data.frame'
analyse.data(analysis, data.obj, warnings = NULL, transect = "line", ...)
```

#### **Arguments**

analysis	an object of class DS.Analysis
data.obj	an object of class Survey or a dataframe
•••	optional arguments (currently not used)
warnings	a list of warnings and how many times they arose
transect	character value either "line" or "point" specifying type of transect used in survey

### Value

a list containing an S3 ddf object and optionally an S3 dht object relating to the model with the minimum criteria.

either returns a list of the best model, warnings and the number of successfully fitted models (if warnings is supplied as a list) otherwise displays warnings as it goes and returns the best fitting ds model.

Density-class

Class "Density"

#### **Description**

Class "Density" is an S4 class containing a list of grids which describe the density of individuals / clusters of a population. The list contains one grid (data.frame) for each strata.

#### **Slots**

```
region.name Object of class "character"; the region name.
```

strata.name Object of class "character"; the strata names

density.surface Object of class "list"; list of data.frames with the columns x, y and density. There must be one data.frame for each strata.

x.space Object of class "numeric"; The spacing between gridpoints described in the density data.frames in the x-direction.

y.space Object of class "numeric"; The spacing between gridpoints described in the density data.frames in the y-direction.

units Object of class "numeric"; The units of the grid points.

### See Also

```
make.density
```

Density.Summary-class Class "Density.Summary"

### **Description**

Class "Density. Summary" is an S4 class containing a summary of the density grids for each strata.

### Slots

summary a summary of the average abundances and densities for each strata.

### See Also

make.density

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description.summary

Provides a description of the summary object/output

### **Description**

Prints a list of the terms used in the simulation summary.

### Usage

```
description.summary()
```

### Value

no return, displays an explanation of the simulation summary

### Author(s)

Laura Marshall

Detectability-class

S4 Class "Detectability"

### Description

```
S4 Class "Detectability"
```

### **Slots**

key.function Object of class "character"; a code specifying the detection function form ("hn" = half normal, "hr" = hazard rate.)

 $scale.param\ Object\ of\ class\ "numeric";$  The  $scale\ parameter\ for\ the\ detection\ function.$ 

shape.param Object of class "numeric"; The shape parameter for the detection function.

cov.param Object of class "numeric"; The parameter values associated with the covariates. Not yet implemented

truncation Object of class "numeric"; The maximum distance at which objects may be detected.

#### See Also

```
make.detectability
```

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DS.Analysis-class

Class "DS.Analysis"

### **Description**

Class "DDF. Analysis" is an S4 class describing a basic detection function model to be fitted to distance sampling data.

#### **Slots**

dfmodel Object of class "formula"; describing the detection function model.

key key function to use; "hn" gives half-normal (default), "hr" gives hazard-rate and "unif" gives uniform. Note that if uniform key is used, covariates cannot be included in the model.

adjustment a list containing adjustment parameters: adjustment - either "cos" (recommended), "herm" or "poly", order - the orders of the adjustment terms to fit, scale - the scale by which the distances in the adjustment terms are divided. See details.

truncation Object of class "list"; Specifies the truncation distance for the analyses.

cutpoints Object of class "character"; gives the cutpoints of the bins for binned data analysis.

er.var specifies which encounter rate variance estimator to use.

control.opts A list to specify various options including monotonicity, method, initial.values.

group.strata Dataframe with two columns ("design.id" and "analysis.id"). The former gives the strata names as defined in the design (i.e. the region object) the second specifies how they should be grouped (into less strata) for the analyses

criteria Object of class "character"; describes which model selection criteria to use ("AIC", "AICc", "BIC").

#### Methods

run.analysis signature=c(object = "DS.Analysis", data = data.frame): runs the analysis described in the object on the data provided.

generate.population

S4 generic method to generate an instance of a population

### **Description**

Uses the population description and detectability details to generate an instance of the population. Note that if the first argument supplied is of class Population. Description rather than class Simulation then detectability and region must also be supplied.

### Usage

```
generate.population(object, ...)
## S4 method for signature 'Population.Description'
generate.population(object, detectability = NULL, region = NULL)
## S4 method for signature 'Simulation'
generate.population(object, ...)
```

### Arguments

object an object of class Simulation or Population.Description

... when this is called on an object of class Population. Description the additional

arguments detectability and region.obj should also be supplied

detectability object of class Detectability (optional - only required if object is of class Popu-

lation.Description)

region the region object for the population (optional - only required if object is of class

Population.Description)

#### Value

```
Population-class object
```

### Description

Generates a set of transects based on the design provided.

### Usage

```
## S4 method for signature 'Simulation'
generate.transects(object, quiet = FALSE, ...)
```

### **Arguments**

object of class Simulation

quiet if TRUE silences some warnings

... not implemented

#### Value

an object of class Transect from dssd package

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get.densities

Method to get density values

### Description

This method extracts the density values from a density object. It will optionally also return the x and y centre points for the density grid cells.

### Usage

```
get.densities(density, coords = FALSE)
```

### **Arguments**

density

object of class Density

coords

if TRUE also returns x, y coordinates

### Value

either returns a numeric vector of density values or a dataframe with columns x, y and density.

get.N

S4 generic method to return N

### Description

Returns the population size

### Usage

```
get.N(object)
## S4 method for signature 'Population.Description'
get.N(object)
```

### **Arguments**

object

an object of class Population.Description

### Value

numeric value of the population size

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histogram.N.ests histogram.N.ests

#### **Description**

Plots a histogram of the estimates abundances

### Usage

```
histogram.N.ests(x, use.max.reps = FALSE, N.ests = "individuals", ...)
```

#### **Arguments**

x object of class Simulation

use.max.reps by default this is FALSE meaning that only simulation repetitions where all models converged for that data set are included. By setting this to TRUE any repetition where one or more models converged will be included in the summary results.

N.ests character indicating whether to plot estimates of abundance of 'individuals', 'clusters' or 'both'. By default this is individuals.

... optional parameters to pass to the generic hist function in graphics

#### Value

No return value, displays a histogram of the abundance estimates

make.density Creates a Density object

### **Description**

Creates a density grid across the study area describing the distribution of animals.

### Usage

```
make.density(
  region = make.region(),
  x.space = 20,
  y.space = NULL,
  constant = numeric(0),
  fitted.model = NULL,
  density.formula = NULL,
  density.surface = list()
)
```

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### Arguments

region the Region object in which the density grid will be created x.space the intervals in the grid in the x direction y.space the intervals in the grid in the y direction a value describing a constant density across the surface. If not supplied a default value of 1 is used for all strata.

fitted.model gam object created using mgcv with only x and y as explanatory covariates. density.formula a formula of x and/or y describing the density surface.

Object of class list; an sf grid recording the density grid polygons, density values within those polygons and the central x and y coordinates.

#### **Details**

There are multiple ways to create the density grid. The most straight forward is to create a grid with constant values (to which high and low areas can later be added) or pass in a fitted mgcv gam. The gam model should only be fitted with x and y as explanatory variables. If you plan on trying multiple animal distributions by adding high and low areas to a constant surface it is recommended to make a copy of the initial flat density grid object as the first step in grid generation is computationally intensive and can take a little while to complete, especially if you have a fine density grid.

#### Value

```
Density-class object
```

#### Author(s)

Laura Marshall

#### See Also

```
make.region
```

#### **Examples**

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make.detectability

Creates a Detectability object

### **Description**

The detectability of the population is described by the values in this class.

#### Usage

```
make.detectability(
  key.function = "hn",
  scale.param = 25,
  shape.param = numeric(0),
  cov.param = list(),
  truncation = 50
)
```

#### **Arguments**

key.function specifies shape of the detection function (either half-normal "hn", hazard rate

"hr" or uniform "uf")

scale.param numeric vector with either a single value to be applied globally or a value for

each strata. These should be supplied on the natural scale.

shape.param numeric vector with either a single value to be applied globally or a value for

each strata. These should be supplied on the natural scale.

cov.param Named list with one named entry per individual level covariate. Covariate pa-

rameter values should be defined on the log scale (rather than the natural scale), this is the same scale as provided in the ddf output in mrds and also in the MCDS output in Distance. Cluster sizes parameter values can be defined here. Each list entry will either be a data.frame containing 2 or 3 columns: level, param and where desired strata. If the region has multiple strata but this column is omitted then the values will be assumed to apply globally. The cluster size entry in the list must be named 'size'. Alternatively the list element may a numeric vector

with either a single value to be applied globally or a value for each strata.

truncation the maximum perpendicular (or radial) distance at which objects may be de-

tected from a line (or point) transect.

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#### Value

```
Detectability-class object
```

#### Author(s)

Laura Marshall

#### See Also

make.simulation make.population.description make.density

#### **Examples**

```
# Multi-strata example (make sf shape)
s1 = matrix(c(0,0,0,2,1,2,1,0,0,0),ncol=2, byrow=TRUE)
s2 = matrix(c(1,0,1,2,2,2,2,0,1,0),ncol=2, byrow=TRUE)
pol1 = sf::st_polygon(list(s1))
pol2 = sf::st_polygon(list(s2))
sfc <- sf::st_sfc(pol1,pol2)</pre>
strata.names <- c("low", "high")</pre>
sf.pol <- sf::st_sf(strata = strata.names, geom = sfc)</pre>
region <- make.region(region.name = "Multi-strata Eg",</pre>
                       strata.name = strata.names,
                       shape = sf.pol)
density <- make.density(region = region,</pre>
                         x.space = 0.22,
                         constant = c(20,50))
covs <- list()</pre>
covs$size <- list(list(distribution = "poisson", lambda = 25),</pre>
                   list(distribution = "poisson", lambda = 15))
covs$sex <- data.frame(level = rep(c("male", "female"),2),</pre>
                       prob = c(0.5, 0.5, 0.6, 0.4),
                       strata = c(rep("low",2),rep("high",2)))
# Define the population description (this time using the density to determine
# the population size)
popdesc <- make.population.description(region = region,</pre>
                                         density = density,
                                         covariates = covs,
                                         fixed.N = FALSE)
cov.param <- list()</pre>
cov.param$size <- c(log(1.02), log(1.005))
cov.param$sex <- data.frame(level = c("male", "female", "male", "female"),</pre>
                              param = c(\log(1.5), 0, \log(1.7), \log(1.2)),
                              strata = c("low","low","high","high"))
# define the detecability
detect <- make.detectability(key.function = "hn",</pre>
```

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```
scale.param = 0.08,
cov.param = cov.param,
truncation = 0.2)
plot(detect, popdesc)
```

make.ds.analysis

Creates an Analysis object

### Description

This method creates an Analysis objects which describes a one or more models to fit to the distance data. The simulation will fit each of these models to the data generated in the simulation and select the model with the minimum criteria value.

### Usage

```
make.ds.analysis(
  dfmodel = list(~1),
  key = "hn",
  truncation = numeric(0),
  cutpoints = numeric(0),
  er.var = "R2",
  control.opts = list(),
  group.strata = data.frame(),
  criteria = "AIC"
)
```

### **Arguments**

dfmodel	list of distance sampling model formula specifying the detection function (see ?Distance::ds for further details)
key	key function to use; "hn" gives half-normal (default) and "hr" gives hazard-rate.
truncation	absolute truncation distance in simulation units matching the region units.
cutpoints	supply a vector of cutpoints if you wish the simulation to perform binned analyses.
er.var	encounter rate variance estimator to use when abundance estimates are required. Defaults to "R2" for line transects and "P3" for point transects. See mrds::varn for more information / options.
control.opts	A list of control options: method - optimisation method,
group.strata	Dataframe with two columns ("design.id" and "analysis.id"). The former gives the strata names as defined in the design (i.e. the region object) the second specifies how they should be grouped (into less strata) for the analyses. See details for more information.
criteria	character model selection criteria (AIC, AICc, BIC)

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#### **Details**

It is possible to group strata at the analysis stage using the group.strata argument. For example, for design purposes it may have been sensible to divide strata into substrata. This can help make more convex shapes and therefore zigzag designs more efficient or perhaps it helped to keep transects angled parallel to density gradients across the study area. Despite these (purely design relevant) substrata we may still wish to calculate estimates of density / abundance etc. for each stratum. The table below gives an example of the data.frame which can be used to do this. Imagine a study region with an onshore strata and an offshore strata. The onshore strata has been divided in two at the design stage to keep transects perpendicular to the coast. We now want to analyse this as just two strata the onshore and offshore.

design.id	analysis.id
onshoreN	onshore
onshoreS	onshore
offshore	offshore

#### Value

DS. Analysis-class object

#### Author(s)

Laura Marshall

#### See Also

ds make.simulation

### **Examples**

```
key = c("hn", "hn", "hr"),
truncation = 500,
criteria = "AIC")
```

make.population.description

Creates a Population. Description object

### Description

Creates an object which describes a population. The values in this object will be used to create instances of the population.

### Usage

```
make.population.description(
  region = make.region(),
 density = make.density(),
 covariates = list(),
 N = numeric(0),
 fixed.N = TRUE
)
```

### **Arguments**

region	the Region object in which this population exists (see make.region).
density	the Density object describing the distribution of the individuals / clusters (see make.density).
covariates	Named list with one named entry per individual-level covariate. Cluster sizes can be defined here, it must be named 'size'. The distribution of covariate values can either be defined by specifying a particular distribution and its parameters or as a discrete distribution in a dataframe. Dataframes should have columns level and prob (and optionally strata) specifying the covariates levels, probabilities and strata if they are strata specific. Distributions can be defined as lists with named entries distribution and the relevant parameters as specified in details. A list of distributions can be provided with one for each strata.
N	the number of individuals / clusters in a population with one value per strata.

the number of individuals / clusters in a population with one value per strata.

Total population size is 1000 by default.

fixed.N a logical value. If TRUE the population is generated from the value(s) of N

otherwise it is generated from the values in the density grid.

### **Details**

Individual-level covariate values can be defined as one of the following distributions: 'normal', 'poisson', 'ztruncpois' or 'lognormal'. The distribution name and the associated parameters as defined in the table below must be provided in a named list. Either one list can be provided for the entire study area or multiple lists grouped together as a list with one per strata.

Distribution Parameters
normal mean sd
poisson lambda
ztruncpois mean
lognormal meanlog sdlog

#### Value

```
Population.Description-class
```

#### Author(s)

Laura Marshall

#### See Also

```
make.simulation make.detectability make.density
```

### **Examples**

```
# Create a basic rectangular study area
region <- make.region()</pre>
# Make a density grid (large spacing for speed)
density <- make.density(region = region,</pre>
                         x.space = 200,
                         y.space = 100,
                         constant = 1)
density <- add.hotspot(density, centre = c(1000, 100), sigma = 250, amplitude = 10)
# Define some covariate values for out population
covs <- list()</pre>
covs$size <- list(distribution = "ztruncpois", mean = 5)</pre>
# Define the population description
popdsc <- make.population.description(region = region,</pre>
                                        density = density,
                                        covariates = covs,
                                        N = 200)
# define the detecability
detect <- make.detectability(key.function = "hn", scale.param = 25, truncation = 50)</pre>
# generate an example population
pop <- generate.population(popdsc, region = region, detectability = detect)</pre>
plot(pop, region)
# Multi-strata example (make sf shape)
s1 = matrix(c(0,0,0,2,1,2,1,0,0,0),ncol=2, byrow=TRUE)
s2 = matrix(c(1,0,1,2,2,2,2,0,1,0),ncol=2, byrow=TRUE)
```

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```
pol1 = sf::st_polygon(list(s1))
pol2 = sf::st_polygon(list(s2))
sfc <- sf::st_sfc(pol1,pol2)</pre>
strata.names <- c("low", "high")</pre>
sf.pol <- sf::st_sf(strata = strata.names, geom = sfc)</pre>
region <- make.region(region.name = "Multi-strata Eg",</pre>
                       strata.name = strata.names,
                       shape = sf.pol)
density <- make.density(region = region,</pre>
                         x.space = 0.22,
                         constant = c(10,80))
covs <- list()</pre>
covs$size <- list(list(distribution = "poisson", lambda = 25),</pre>
                   list(distribution = "poisson", lambda = 15))
covs$sex <- data.frame(level = rep(c("male", "female"),2),</pre>
                       prob = c(0.5, 0.5, 0.6, 0.4),
                       strata = c(rep("low",2),rep("high",2)))
# Define the population description (this time using the density to determine
# the population size)
popdesc <- make.population.description(region = region,</pre>
                                         density = density,
                                         covariates = covs,
                                         fixed.N = FALSE)
# define the detecability (see make.detectability to alter detection function
# for different covariate values)
detect <- make.detectability(key.function = "hn", scale.param = 25, truncation = 50)</pre>
# generate an example population
pop <- generate.population(popdesc, region = region, detectability = detect)</pre>
plot(pop, region)
```

make.simulation

Creates a Simulation object

### Description

This creates a simulation with all the information necessary for dsims to generate a population, create transects, simulate the survey process and fit detection functions and estimate density / abundance. This function can be used by itself based on default values to create a simple line transect example, see Examples below. To create more complex simulations it is advisable to define the different parts of the simulation individually before grouping them together. See the Arguments for links to the functions which make the definitions for the individual simulation components. For a more in depth example please refer to the 'GettingStarted' vignette.

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### Usage

```
make.simulation(
  reps = 10,
  design = make.design(),
  population.description = make.population.description(),
  detectability = make.detectability(),
  ds.analysis = make.ds.analysis()
)
```

#### **Arguments**

```
reps number of times the simulation should be repeated

design an object of class Survey. Design created by a call to make. design

population. description

an object of class Population. Description created by a call to make. population. description

detectability and object of class Detectability created by a call to make. detectability

ds. analysis an objects of class DS. Analysis created by a call to make. ds. analysis
```

#### **Details**

The make.simulation function is now set up so that by default (with the exception of specifying point transects rather than line) it can run a simple simulation example. See examples.

#### Value

```
Simulation-class object
```

#### Author(s)

Laura Marshall

### See Also

```
make.region make.density make.population.description make.detectability make.ds.analysis make.design
```

### **Examples**

```
popdsc <- make.population.description(region = region,</pre>
                                       density = density,
                                       N = 200)
# Define the detecability
detect <- make.detectability(key.function = "hn",</pre>
                              scale.param = 25,
                              truncation = 50)
# Define the design
design <- make.design(region = region,</pre>
                       transect.type = "line",
                       design = "systematic",
                       samplers = 20,
                       design.angle = 0,
                       truncation = 50)
# Define the analyses
ds.analyses <- make.ds.analysis(dfmodel = ~1,</pre>
                                 key = "hn",
                                 truncation = 50,
                                 criteria = "AIC")
# Put all the components together in the simulation (note no. of replicates
# reps = 1 is only for a single test run and should be 999 or more to be able
# to draw inference.)
simulation <- make.simulation(reps = 1,</pre>
                               design = design,
                               population.description = popdsc,
                               detectability = detect,
                               ds.analysis = ds.analyses)
# run an example survey to check the setup
survey <- run.survey(simulation)</pre>
plot(survey, region)
# Run the simulation
# Warning: if you have increased the number of replications then it can take a
# long time to run!
simulation <- run.simulation(simulation)</pre>
summary(simulation)
# For a more in depth example please look at
vignette("GettingStarted", 'dsims')
```

### **Description**

```
Plots an S4 object of class 'Density'
Plots an S4 object of class 'Density'
```

### Usage

```
## S4 method for signature 'Density,ANY'
plot(x, y, strata = "all", title = "", scale = 1)
## S4 method for signature 'Density,Region'
plot(x, y, strata = "all", title = "", scale = 1, line.col = gray(0.2))
```

### **Arguments**

X	object of class Density
у	object of class Region
strata	the strata name or number to be plotted. By default all strata will be plotted.
title	plot title
scale	used to scale the x and y values in the plot (warning may give unstable results when a projection is defined for the study area!)
line.col	sets the line colour for the shapefile

#### Value

```
ggplot object
ggplot object
```

```
{\it plot}, {\it Detectability}, {\it ANY-method} \\ {\it Plot}
```

### Description

Plots an S4 object of class 'Detectability'

### Usage

```
## S4 method for signature 'Detectability,ANY'
plot(
    x,
    y,
    add = FALSE,
    plot.units = character(0),
    region.col = NULL,
    gap.col = NULL,
```

```
main = "",
...
)

## S4 method for signature 'Detectability,Population.Description'
plot(
    x,
    y,
    add = FALSE,
    plot.units = character(0),
    region.col = NULL,
    gap.col = NULL,
    main = "",
...
)
```

### **Arguments**

object of class Detectability
object of class Population.Description
logical indicating whether it should be added to existing plot
allows for units to be converted between m and km
fill colour for the region
fill colour for the gaps
character plot title
other general plot parameters

### Value

No return value, gives a warning to the user

No return value, plotting function

```
{\it plot}, {\it Population}, {\it ANY-method} \\ {\it Plot}
```

### Description

Unused, will give a warning that the region must also be supplied.

Plots an S4 object of class 'Population'. Requires that the associated region has already been plotted. This function adds the locations of the individuals/clusters in the population.

### Usage

```
## S4 method for signature 'Population, ANY'
plot(x, y, ...)
## S4 method for signature 'Population, Region'
plot(x, y, ...)
```

#### **Arguments**

x object of class Population y object of class Region

... other general plot parameters

### Value

ggplot object

```
plot, Survey, Region-method plot
```

#### **Description**

Produces four plots of the survey: 1) Plots the transects inside the survey region, 2) plots the population, 3) plots the transects, population and detections 4) plots a histogram of the detection distances. Note that only plots 3 & 4 are generated without the survey region if Region is omitted.

#### Usage

```
## S4 method for signature 'Survey,Region'
plot(x, y, type = "all", ...)
## S4 method for signature 'Survey,ANY'
plot(x, y = NULL, type = "all", ...)
```

### **Arguments**

x object of class Survey

y object of class Region or NULL

type character specifies which plots you would like, defaults to "all". Other options

include "transects", "population", "survey" and "distances". These will plot only the transects, only the population locations, both the transects and population with detections indicated or a histogram of the detection distances, respectively. Note that the final plots is only available if there were one or more detections. Only "survey" and "distances" available if the y Region argument is not supplied.

. . . additional plotting parameters

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#### Value

Generate 4 plots showing the survey population, transects (including covered areas), detections and a histogram of the detection distances. Plots include the survey region. Also invisibly returns a list of ggplot objects if the user would like to customise the plots.

Generate 2 plots showing the survey population, transects (including covered areas), detections and a histogram of the detection distances. Plots do not include survey region. Also invisibly returns a list of ggplot objects if the user would like to customise the plots.

Population-class

Class "Population"

### **Description**

Contains an instance of a population including a description of their detectability in the form of an object of class Detectability.

#### Slots

region.name Object of class "character"; the name of the region object.

strata.names Object of class "character"; the names of the strata.

N Object of class "numeric"; the number of individuals/clusters.

D Object of class "numeric"; the density of individuals/clusters.

population Object of class "data.frame"; the locations of individuals/clusters and any population covariates.

detectability Object of class "Detectability"; describes how easily the individuals/clusters can be detected.

#### Methods

plot signature=(object = "Line.Transect"): plots the locations of the individuals/clusters.

#### See Also

make.population.description, make.detectability

Population.Description-class

Class "Population.Description"

### **Description**

Class "Population.Description" is an S4 class containing a description of the population. It provides methods to generate an example population.

#### **Slots**

N Object of class "numeric"; number of individuals in the population (optional).

density Object of class "Density"; describes the population density

region.name Object of class "character"; name of the region in which the population exists.

strata.names Character vector giving the strata names for the study region.

covariates Named list with one named entry per individual level covariate. Cluster sizes can be defined here. Each list entry will either be a data.frame containing 2 columns, the first the level (level) and the second the probability

size logical value indicating whether the population occurs in clusters. (prob). The cluster size entry in the list must be named 'size'.

gen.by.N Object of class "logical"; If TRUE N is fixed otherwise it is generated from a Poisson distribution.

#### Methods

```
get.N signature=(object = "Population.Description"): returns the value of N
generate.population signature=(object = "Population.Description"): generates a sin-
gle realisation of the population.
```

### See Also

make.population.description

run.simulation

Method to run a simulation

#### **Description**

Runs the simulation and returns the simulation object with results. If running in parallel and max.cores is not specified it will default to using one less than the number of cores / threads on your machine. For example code see make.simulation

28 run.survey

#### Usage

```
run.simulation(
    simulation,
    run.parallel = FALSE,
    max.cores = NA,
    counter = TRUE,
    transect.path = character(0),
    progress.file = character(0))
```

#### **Arguments**

simulation Simulation-class object

run.parallel logical option to use multiple processors

max.cores integer maximum number of cores to use, if not specified then one less than the

number available will be used.

counter logical indicates if you would like to see the progress counter.

transect.path character gives the pathway to a folder of shapefiles or the path to a single shape-

file (.shp file) which give the transects which should be used for the simulations. If a folder of transects a new shapefile will be used for each repetition. If a path specifying a single shapefile then the same transects will be used for each

repetition.

progress.file character path with filename to output progress to file for Distance for Windows

progress counter. Not to be used when running directly in R.

### Value

the Simulation-class object which now includes the results

#### See Also

make.simulation

run.survey

S4 generic method to simulate a survey

### Description

Simulates the process by which individuals or clusters are detected. If a simulation is passed in then it will generate a population, set of transects and simulate the detection process. If a survey is passed in it will simply simulate the detection process. See make.simulation for example usage.

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#### **Usage**

```
run.survey(object, ...)
## S4 method for signature 'Simulation'
run.survey(object, filename = character(0))
## S4 method for signature 'Survey.LT'
run.survey(object, region = NULL)
## S4 method for signature 'Survey.PT'
run.survey(object, region = NULL)
```

### **Arguments**

object an object of class Simulation
... allows extra arguments

filename optional argument specifying a path to a shapefile if the transects are to be loaded

from file.

region an object of class Region.

#### Value

An object which inherits from a Survey-class object. This will be a Survey.LT-class object in the case of a simulation with a line transect design and a Survey.PT-class if the simulation has a point transect design.

#### See Also

make.simulation

rztpois

Randomly generates values from a zero-truncated Poisson distribution

### **Description**

Generates values from a zero-truncated Poisson distribution with mean equal to that specified. It uses an optimisation routine to check which value of lambda will give values with the requested mean.

### Usage

```
rztpois(n, mean = NA)
```

#### **Arguments**

n number of values to randomly generate

mean of the generated values

30 save.sim.results

#### Value

returns a randomly generated value from a zero-truncated Poisson distribution.

#### Note

Internal function not intended to be called by user.

#### Author(s)

Len Thomas

save.sim.results

save.sim.results

### **Description**

Saves the simulation results from each replicate to file. It will save up to 3 txt files, one for the abundance estimation for individuals, one for the abundance estimation of clusters (where applicable) and one for detectability estimates and model selection information.

### Usage

```
save.sim.results(simulation, filepath = character(0), sim.ID = numeric(0))
```

#### Arguments

simulation object of class Simulation which has been run.

filepath optionally a path to the directory where you would like the files saved, otherwise

it will save it to the working directory.

sim. ID optionally you can add a simulation ID to the filename

#### Value

invisibly returns the original simulation object

#### Author(s)

L. Marshall

set.densities 31

set.densities

Method to set density values

### Description

This method sets the density values in a density object.

### Usage

```
set.densities(density, densities)
```

### Arguments

density

object of class Density

densities

a numeric vector of density values to update the density grid with.

### Value

returns the Density object with updated density values

```
show, {\tt Density.Summary-method} \\ show
```

### Description

displays the density summary table

### Usage

```
## S4 method for signature 'Density.Summary'
show(object)
```

### **Arguments**

object

object of class Density.Summary

### Value

No return value, displays the density summary

show, Simulation-method

show

### **Description**

Not currently implemented

### Usage

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

### Arguments

object

object of class Simulation

### Value

No return value, displays a summary of the simulation

```
show, {\it Simulation.Summary-method} \\ show
```

### Description

Displays the simulation summary

### Usage

```
\hbox{\it \#\# S4 method for signature 'Simulation.Summary' show(object)}
```

### Arguments

object

object of class Simulation.Summary

### Value

No return value, displays information in Simulation.Summary object

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Simulation-class

Class "Simulation"

#### Description

Class "Simulation" is an S4 class containing descriptions of the region, population, survey design and analyses the user wishes to investigate. Once the simulation has been run the N.D.Estimates will contain multiple estimates of abundance and density obtained by repeatedly generating populations, simulating the survey and completing the analyses.

#### Slots

reps Object of class "numeric"; the number of times the simulation should be repeated.

single.transect.set Object of class "logical"; if TRUE the same set of transects are used in each repetition.

design Object of class "Survey.Design"; the survey design.

population.description Object of class "Population.Description"; the population.description.

detectability Object of class "Detectability"; a description of the detectability of the population.

ds.analysis Object of class "DS.Analysis"

add. options a list to expand simulation options in the future.

ddf.param.ests Object of class "array"; stores the parameters associated with the detection function.

results A "list" with elements 'individuals' (and optionally 'clusters' and 'expected.size') as well as 'Detection'.

The 'individuals' and 'clusters' elements are a list of three 3-dimensional arrays. The first is a summary array containing values for 'Area' (strata area), 'CoveredArea' (the area covered in the strata by the survey), Effort' (the line length or number of points surveyed), 'n' (the number of sightings), 'n.miss.dists' (the number of missing distances - only applicable to mixed detector types and not yet implemented in dsims), 'k' (the number of transects), 'ER' (encounter rate), 'se.ER' (standard error of the encounter rate), 'cv.ER' (coefficient of variation of the encounter rate). A value is provided for each of these for each strata as well as the region as a whole and for each simulation repetition as well as storing the mean and standard deviation of these values across simulation repetitions.

The second array 'N' is the abundance estimates table. It contains values for the 'Estimate' (estimated abundance based on data from iteration i), 'se' (standard error associated with the estimate), 'cv' (coefficient of variation of estimate), 'lcl' (lower 95% confidence interval value), 'ucl' (upper 95% confidence interval value), 'df' the degrees of freedom associated with the estimate. A value is provided for each of these for each strata as well as the region as a whole and for each simulation repetition as well as storing the mean and standard deviation of these values across simulation repetitions.

The third array 'D' is the density estimates table. It contains values for the 'Estimate' (estimated density based on data from iteration i), 'se' (standard error associated with the estimate), 'cv' (coefficient of variation of estimate), 'lcl' (lower 95% confidence interval value),

'ucl' (upper 95% confidence interval value), 'df' the degrees of freedom associated with the estimate. A value is provided for each of these for each strata as well as the region as a whole and for each simulation repetition as well as storing the mean and standard deviation of these values across simulation repetitions.

When animals occur in clusters the expected.size element of the results list contains a 3-dimensional array. It gives values for 'Expected.S' (expected cluster size), 'se.Expected.S' (the standard error of the expected cluster size), 'cv.Expected.S' (the coefficient of variation for the expected cluster size). Values are given for each analysis strata as well as a value for the survey region as a whole and across each simulation repetition as well as overall means and standard deviations across repetitions.

The Detection element of the results list is a 3-dimensional array with values for 'True.Pa' (the proportion of animals in the covered region which were detected), 'Pa' (the estimated proportion of animals detected in the covered region), 'ESW' (the estimated strip width), 'f(0)' (The estimated value of the detection function pdf at distance 0), 'SelectedModel' (the index of the model which had the best fit to the dataset for the repetition), 'DeltaCriteria' (the difference in information criteria between the best and second best fitting models where two or more models were fitted and converged), 'SuccessfulModels' (the number of models which successfully converged). Currently detection functions are pooled across all strata so there is only one global value for each simulated dataset as well as a mean value and standard deviation where appropriate.

warnings A "list" to store warnings and error messages encountered during runtime.

#### Methods

summary signature=(object = "Simulation"): produces a summary of the simulation and its results.

generate.population signature = (object = "Simulation"): generates a single instance of a population.

generate.transects signature = (object = "Simulation"): generates a single set of transects.

run.survey signature = (object = "Simulation"): carries out the simulation process as far as generating the distance data and returns an object containing the population, transects and data.

run.simulation signature = (simulation = "Simulation"): runs the whole simulation for the specified number of repetitions.

#### See Also

make.simulation

Simulation.Summary-class

Class "Simulation.Summary"

### **Description**

Class "Simulation. Summary" is an S4 class containing a summary of the simulation results. This is returned when summary(Simulation) is called. If it is not assigned to a variable the object will be displayed via the show method.

#### Methods

show signature=(object = "Simulation.Summary"): prints the contents of the object in a user friendly format.

```
summary, Density-method
```

summary

### Description

Provides a summary table of the density object.

### Usage

```
## S4 method for signature 'Density'
summary(object, ...)
```

#### **Arguments**

```
object of class Simulation
... not implemented
```

#### Value

```
a Density. Summary-class object
```

### **Description**

Provides a summary of the simulation results.

#### Usage

```
## S4 method for signature 'Simulation'
summary(object, description.summary = TRUE, use.max.reps = FALSE, ...)
```

36 Survey.LT-class

#### **Arguments**

object of class Simulation

description.summary

logical indicating whether an explanation of the summary should be displayed

use.max.reps

by default this is FALSE meaning that only simulation repetitions where all models converged for that data set are included. By setting this to TRUE any repetition where one or more models converged will be included in the summary

results.

... no additional arguments currently implemented

### Value

Object of class Simulation.Summary

Survey-class

Virtual Class "Survey"

#### Description

Class "Survey" is an S4 class containing an instance of a population.

#### **Slots**

population Object of class "Population"; an instance of a population.

Survey.LT-class

Class "Survey.LT" extends class "Survey"

### Description

Class "Survey.LT" is an S4 class containing a population and a set of transects.

#### **Slots**

transect Object of class "Line.Transect"; the line transects.

perpendicular.truncation Object of class "numeric"; the maximum distance from the transect at which animals may be detected.

### See Also

make.design

Survey.PT-class 37

Survey.PT-class

Class "Survey.PT" extends class "Survey"

### Description

Class "Survey.PT" is an S4 class containing a population and a set of transects.

#### **Slots**

transect Object of class "Point.Transect"; the point transects.

radial.truncation Object of class "numeric"; the maximum distance from the transect at which animals may be detected.

#### See Also

make.design

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