Package 'secrdesign'

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Type Package

Title Sampling Design for Spatially Explicit Capture-Recapture

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Description Tools for designing spatially explicit capture--
recapture studies of animal populations (primarily a simulation manager for package secr)

License GPL (>=2)

URL http://www.otago.ac.nz/density

R topics documented:

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secrdesign-package   *Spatially Explicit Capture–Recapture Study Design*

Description

Tools to assist the design of spatially explicit capture–recapture studies of animal populations.

Details

Package:	secr
Type:	Package
Version:	2.2.2
Date:	2015-01-10
License:	GNU General Public License Version 2 or later

The primary use of **secrdesign** is to predict by Monte Carlo simulation the precision or bias of density estimates from different detector layouts, given pilot values for density and the detection parameters lambda0/g0 and sigma.

The important functions in **secrdesign** are:

make.scenarios	generate dataframe of parameter values etc.
run.scenarios	perform simulations, with or without model fitting
fit.models	fit SECR model(s) to rawdata output from run.scenarios
predict.fittedmodels	infer 'real' parameter estimates from fitted models
select.stats	collect output for a particular parameter
summary.selectedstatistics	numerical summary of results
plot.selectedstatistics	histogram or CI plot for each scenario

Documentation is provided in a vignette `../doc/secrdesign-vignette.pdf`; an Appendix has code for various examples that should help get you started. The help pages are also available as `../doc/secrdesign-manual.pdf`.

Author(s)

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See Also

make.grid, sim.popn, sim.capthist, secr.fit

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make.array   *Re-cast Simulated Statistical Output as Array*

Description

This function is used internally by summary.secrdesign, and may occasionally be of general use.

Usage

```
make.array(object)
```

Arguments

object   secrdesign object containing numerical values for a particular parameter (i.e.
                output from `select.stats` inheriting from 'selectedstatistics')

Details

`make.array` converts a particular simulated numerical output into an array with one dimension for each varying input.

Value

A numeric array with dimensions corresponding to the varying inputs.

See Also

`run.scenarios`

Examples

```
## collect raw counts
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2)
traps1 <- make.grid()
tmp1 <- run.scenarios(nrepl = 50, trapset = traps1, scenarios = scen1,
    fit = FALSE)
make.array(tmp1)
```

---

make.scenarios   *Construct Scenario Data Frame*

Description

This function prepares a dataframe in which each row specifies a simulation scenario. The dataframe is used as input to `run.scenarios`.

Usage

```
make.scenarios(trapsindex = 1, noccasions = 3,  nrepeats = 1, D, g0, sigma, lambda0,
detectfn = 0, recapfactor = 1, popindex = 1, detindex = 1, fitindex = 1, groups,
crosstraps = TRUE)
```

Arguments

trapsindex	integer vector determining the traps object to use
noccasions	integer vector for the number of sampling occasions
nrepeats	integer vector of multipliers for D (see Details)
D	numeric vector of values for the density parameter (animals / hectare)
g0	numeric vector of values for the g0 parameter
sigma	numeric vector of values for the sigma parameter (m)
lambda0	numeric vector of values for the lambda0 parameter
detectfn	vector of valid detection function codes (numeric or character)
recapfactor	numeric vector of values for recapfactor ([sim.capthist](#))
popindex	integer vector determining which population model is used
detindex	integer vector determining which detection options are used
fitindex	integer vector determining which model is fitted
groups	character vector of group labels (optional)
crosstraps	logical; if TRUE the output includes all combinations of trapsindex, noccasions and nrepeats

Details

The index in trapsindex is used in [run.scenarios](#) to select particular detector arrays from the list of arrays provided as an argument to that function.

The function generates all combinations of the given parameter values using [expand.grid](#). By default, it also generates all combinations of the parameters with trapsindex and the number of sampling occasions. If crosstraps is FALSE then trapsindex, noccasions, and nrepeats are merely used to fill in these columns in the output dataframe.

The argument lambda0 replaces g0 for the hazard detection functions 14–18 ([detectfn](#)).

Designs may use multiple detector arrays with the same internal geometry (e.g., number and spacing of traps). The number of such arrays is varied with the nrepeats argument. For example, you may compare designs with many small arrays or a few large ones. In practice, run.scenarios simulates a single layout is simulated with density D * nrepeats. This shortcut is not appropriate when animals compete for traps (detector = 'single').

fitindex allows a choice of different models when the argument fit.args of [run.scenarios](#) is a compound list.

If groups is provided each scenario is replicated to the length of groups and a column 'group' is added.

Value

Dataframe with one row per scenario (or sub-scenario) and the columns

scenario	a number identifying the scenario
group	(optional)
trapsindex	
noccasions	
nrepeats	
D	

g0   or lambda0

sigma

detectfn   see detectfn; always numeric

recapfactor

popindex

detindex

fitindex

An attribute 'inputs' is saved for possible use in make.array.

See Also

run.scenarios, sim.capthist

Examples

```
make.scenarios(trapsindex = 1, nrepeats = 1, D = c(5,10), sigma = 25,
g0 = 0.2)
```

---

predict.fittedmodels   *Extract Estimates From Fitted Models*

Description

If simulations have been saved from run.scenarios as fitted secr models it is necessary to use one of these functions to extract estimates for later summarization.

Usage

```
## S3 method for class 'fittedmodels'
predict(object, ...)

## S3 method for class 'fittedmodels'
coef(object, ...)

derived.SL(object, ...)

regionN.SL(object, ...)
```

Arguments

object   fitted model simulation output from run.scenarios

...   other arguments passed to predict, coef, derived or region.N

Details

These functions are used when output from run.scenarios has been saved as fitted models. derived.SL and regionN.SL require a full fit (including the design object) whereas a trimmed model is sufficient for predict and coef.

derived.SL is used to compute the Horvitz-Thompson-like estimate of density when secr.fit has been used with CL = TRUE; it is roughly equivalent to predict.

regionN.SL predicts the realised number (R.N) or expected number (E.N) in a masked area. When detector layouts and/or sigma vary, the masked area will also vary (arbitrarily, depending on the buffer argument 'xsigma') unless a mask is provided by the user; this may be done either in run.scenarios or in regionN.SL.

Value

An object with class ('estimatetables', 'secrdesign', 'list') with appropriate outputtype ('predicted', 'coef', 'derived', 'regionN'; sSee also run.scenarios).

See Also

run.scenarios

Examples

```
## using nrepl = 2 just for checking
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2)
traps1 <- make.grid()  ## default 6 x 6 grid of multi-catch traps
tmp1 <- run.scenarios(nrepl = 2, trapset = traps1, scenarios = scen1,
    fit = TRUE, extractfn = trim)
tmp2 <- predict(tmp1)
tmp3 <- select.stats(tmp2, 'D', c('estimate','RB','RSE'))
summary(tmp3)
```

---

run.scenarios	*Simulate Sampling Designs*

Description

This function performs simulations to predict the precision of abundance estimates from simple 1-session SECR designs. Scenarios are specified via an input dataframe that will usually be constructed with make.scenarios. Each scenario comprises an index to a detector layout, the number of sampling occasions, and specified density (D) and detection parameters (usually g_0 and σ).

Detector layouts are provided in a separate list trapset. This may comprise an actual field design input with read.traps or 'traps' objects constructed with make.grid etc., as in the Examples. Even a single layout must be presented as a component of a list (e.g., list(make.grid())).

If ncores > 1 then each scenario will be run in a separate worker process using parLapply from **parallel** (see also Parallel). Setting ncores greater than the number of scenarios causes an error.

Alternative approaches are offered for predicting precision. Both start by generating a pseudorandom dataset under the design using the parameter values for a particular scenario. The first estimates the parameter values and their standard errors from each dataset by maximizing the full likelihood, as usual in secr.fit. The second takes the short cut of computing variances and SE from the Hessian estimated numerically at the known expected values of the parameters, without maximizing the likelihood. Set method = "none" for this shortcut.

Usage

```
run.scenarios(nrepl, scenarios, trapset, maskset, xsigma = 4, nx = 32,
    pop.args, det.args, fit = FALSE, fit.args, extractfn = NULL,
    multisession = FALSE, ncores = 1, seed = 123, ...)

fit.models(rawdata, fit = FALSE, fit.args, extractfn = NULL,
    ncores = 1, ...)
```

Arguments

nrepl	integer number of replicate simulations
scenarios	dataframe of simulation scenarios
trapset	secr traps object or a list of traps objects
maskset	secr mask object or a list of mask objects (optional)
xsigma	numeric buffer width as multiple of sigma (alternative to maskset)
nx	integer number of cells in mask in x direction (alternative to maskset)
pop.args	list of named arguments to sim.popn (optional)
det.args	list of named arguments to sim.capthist (optional)
fit	logical; if TRUE a model is fitted with secr.fit, otherwise data are generated but no model is fitted
fit.args	list of named arguments to secr.fit (optional)
extractfn	function to extract a vector of statistics from secr model
multisession	logical; if TRUE groups are treated as additional sessions
ncores	integer number of cores for parallel processing
seed	integer pseudorandom number seed
...	other arguments passed to extractfn
rawdata	'rawdata' object from previous call to run.scenarios

Details

Designs are constructed from the trap layouts in trapset, the numbers of grids in ngrid, and the numbers of sampling occasions (secondary sessions) in noccasions. These are *not* crossed: the number of designs is the maximum length of any of these arguments. Any of these arguments whose length is less than the maximum will be replicated to match.

pop.args is used to customize the simulated population distribution. It will usually comprise a single list, but may be a list of lists (one per popindex value in scenarios).

det.args may be used to customize some aspects of the detection modelling in sim.capthist, but not traps, popn, detectpar, detectfn, and noccasions, which are controlled directly by the scenarios. It will usually comprise a single list, but may be a list of lists (one per detindex value in scenarios).

fit.args is used to customize the fitted model; it will usually comprise a single list. If you are interested in precision alone, use fit.args=list(method = 'none') to obtain variance estimates from the hessian evaluated at the parameter estimates. This is much faster than a complete model fit, and usually accurate enough.

If no extractfn is supplied then a default is used - see Examples. Replacement functions should follow this pattern i.e. test for whether the single argument is an secr object, and if not supply a named vector of NA values of the correct length.

From 2.2.0, two or more rows in scenarios may share the same scenario number. This is used to generate multiple population subclasses (e.g. sexes) differing in density and/or detection parameters. If multisession = TRUE the subclasses become separate sessions in a multi-session capthist object (this may require a custom extractfn). multisession is ignored with a warning if each scenario row has a unique number.

The L'Ecuyer pseudorandom generator is used with a separate random number stream for each core (see clusterSetRNGStream).

A summary method is provided (see summary.secrdesign). It is usually necessary to process the simulation results further with predict.fittedmodels and/or select.stats before summarization.

Value

An object of class (x, 'secrdesign', 'list'), where x is one of 'fittedmodels', 'estimatetables', 'selectedstatistics' or 'rawdata', with components

call	function call
version	character string including the software version number
starttime	character string for date and time of run
proctime	processor time for simulations, in seconds
scenarios	dataframe as input
trapset	list of trap layouts as input
maskset	list of habitat masks (input or generated)
xsigma	from input
nx	from input
pop.args	from input
det.args	from input
fit	from input
fit.args	from input
extractfn	function used to extract statistics from each simulation
seed	from input
nrepl	from input
output	list with one component per scenario
outputtype	character code - see vignette

If fit = FALSE and extractfn = identity the result is of class ('rawdata', 'secrdesign', 'list'). This may be used as input to fit.models, which interprets each model specification in fit.args as a new 'sub-scenario' of each input scenario (i.e. all models are fitted to every dataset). The output possibilities are the same as for run.scenarios.

If subclasses have been defined (i.e. scenarios has multiple rows with the same scenario ID), each simulated capthist object has covariates with a character-valued column named "group" ("1", "2" etc.) (there is also a column "sex" generated automatically by sim.popn).

Note

100 ha = 1 km^2

Note

For `ncores > 1` it pays to keep an eye on the processes from the Performance page of Windows Task Manager (<ctrl><alt><del>), or 'top' in linux OS. If you interrupt `run.scenarios` (<Esc> from Windows) you may occasionally find some processes do not terminate and have to be manually terminated from the Task Manager - they appear as Rscript.exe on the Processes page.

Author(s)

Murray Efford

See Also

predict.fittedmodels, select.stats, summary.secrdesign, summary.selectedstatistics, sim.popn, sim.capthist, secr.fit

Examples

```
## Simple example: generate and summarise trapping data
## at two densities and for two levels of sampling frequency
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2, noccasions =
    c(5,10))
traps1 <- make.grid()   ## default 6 x 6 trap grid
tmp1 <- run.scenarios(nrepl = 20, trapset = traps1, scenarios = scen1,
    fit = FALSE)
summary(tmp1)

## Not run:

###########################
## 2-phase example
## first make and save rawdata
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2)
traps1 <- make.grid()   ## default 6 x 6 trap grid
tmp1 <- run.scenarios(nrepl = 20, trapset = traps1, scenarios = scen1,
    fit = FALSE, extractfn = identity)

## review rawdata
summary(tmp1)

## then fit and summarise models
tmp2 <- fit.models(tmp1, fit.args = list(list(model = g0~1),
    list(model = g0~T)), fit = TRUE, ncores = 4)
summary(tmp2)
###########################

## Construct a list of detector arrays
## Each is a set of 5 parallel lines with variable between-line spacing;
## the argument that we want to vary (spacey) follows nx, ny and spacex
## in the argument list of make.grid().

spacey <- seq(2000,5000,500)
```

```
names(spacey) <- paste('line', spacey, sep = '.')
trapset <- lapply(spacey, make.grid, nx = 101, ny = 5, spacex = 1000,
    detector = 'proximity')

## Make corresponding set of masks with constant spacing (1 km)
maskset <- lapply(trapset, make.mask, buffer = 8000, spacing = 1000,
    type = 'trapbuffer')

## Generate scenarios
scen <- make.scenarios (trapsindex = 1:length(spacey), nrepeats = 8,
    noccasions = 2, D = 0.0002, g0 = c(0.05, 0.1), sigma = 1600, cross = TRUE)

## RSE without fitting model
sim <- run.scenarios (50, scenarios = scen, trapset = trapset, maskset = maskset,
    ncores = 8, fit = TRUE, fit.args = list(method = 'none'), seed = 123)

## Extract statistics for predicted density
sim <- select.stats(sim, parameter = 'D')

## Plot to compare line spacing
summ <- summary (sim, type='array',  fields = c('mean','lcl','ucl'))$summary
plot(0,0,type='n', xlim=c(1.500,5.500), ylim = c(0,0.36), yaxs = 'i',
    xaxs = 'i', xlab = 'Line spacing  km', ylab = 'RSE (D)')
xv <- seq(2,5,0.5)
points(xv, summ$mean[,1,'RSE'], type='b', pch=1)
points(xv, summ$mean[,2,'RSE'], type='b', pch=16)
segments(xv, summ$lcl[,1,'RSE'], xv, summ$ucl[,1,'RSE'])
segments(xv, summ$lcl[,2,'RSE'], xv, summ$ucl[,2,'RSE'])
legend(4,0.345, pch=c(1,16), title = 'Baseline detection',
    legend = c('g0 = 0.05', 'g0 = 0.1'))

## End(Not run)
```

---

select.stats   *Select Statistics to Summarize*

Description

When the results of each simulation with run.scenarios are saved as a dataframe (e.g. from predict()) it is necessary to select estimates of just one parameter for numerical summarization. This does the job. find.param is a helper function to quickly display the parameters available for summarisation.

Usage

```
select.stats(object, parameter = "D", statistics)
find.param(object)
find.stats(object)
```

Arguments

`object`	'estimatetables' object from `run.scenarios`
`parameter`	character name of parameter to extract
`statistics`	character vector of statistic names

Details

`select.stats` is used to select a particular vector of numeric values for summarization. The 'parameter' argument indexes a row in the data.frame for one replicate (i.e., one 'real' parameter). Each 'statistic' is either a column in that data.frame or a statistic derived from a column.

If `statistics` is not specified, the default is to use all numeric columns in the input (i.e., c('estimate', 'SE.estimate', 'lcl', 'ucl') for predict and c('beta', 'SE.beta', 'lcl', 'ucl') for coef).

`statistics` may include any of 'estimate', 'SE.estimate', 'lcl', 'ucl', 'true', 'RB', 'RSE', 'COV' and 'ERR' (for outputtype 'coef' use 'beta' and 'SE.beta' instead of 'estimate and 'SE.estimate'). 'true' refers to the known parameter value used to generate the data.

The computed statistics are:

Statistic	Name	Value
RB	Relative bias	(estimate - true) / true
RSE	Relative SE	SE.estimate / estimate
ERR	Absolute deviation	abs(estimate - true)
COV	Coverage	(estimate > lcl) & (estimate < ucl)

'RB', 'COV' and 'ERR' relate an estimate to the known (true) value of the parameter in `object$scenarios`. They are computed only when a model has been fitted without method = 'none'.

'COV' remains binary (0/1) in the output from `select.stats`; the result of interest is the mean of this statistic across replicates (see `summary.secrdesign`). Similarly, 'ERR' is used with field 'rms' in `summary.secrdesign` to compute the root-mean-squared-error RMSE.

`find.param` and `find.stats` may be used to 'peek' at objects of class 'estimatetables' and 'selectedstatistics' respectively to recall the available parameter estimates or 'statistics'.

Value

For `select.stats`, an object with class c('selectedstatistics','secrdesign', 'list') suitable for numerical summarization with `summary.selectedstatistics`. The value of 'parameter' is stored as an attribute.

For `find.param`, a character vector of the names of parameters with estimates in `object`.

See Also

`run.scenarios`, `validate`

Examples

```
## using nrepl = 2 just for checking
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2)
traps1 <- make.grid()
tmp1 <- run.scenarios(nrepl = 2, trapset = traps1, scenarios = scen1,
    fit = TRUE, extractfn = trim)
```

```
tmp2 <- predict(tmp1)
tmp3 <- select.stats(tmp2, 'D', c('estimate','RB','RSE','COV'))
summary(tmp3)
```

---

summary.secrdesign   *Generic Methods for secrdesign Objects*

Description

Methods to summarize simulated datasets.

Usage

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

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

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

## S3 method for class 'selectedstatistics'
summary(object, fields = c('n', 'mean',
'se'), dec = 5, alpha = 0.05, type = c('list','dataframe','array'), ...)

## S3 method for class 'selectedstatistics'
plot(x, scenarios, statistic, type =
c('hist', 'CI'), refline, xlab = NULL, ...)

header(object)
```

Arguments

object	object of class simulations from `run.scenarios`
dec	number of decimal places in output
fields	character vector; names of required summary statistics (see Details)
alpha	alpha level for confidence intervals and quantiles
type	character code for type of output (see Details)
...	other arguments – not currently used by summary but passed to [hist](#) by the plot method
x	object of class 'selectedstatistics' from `run.scenarios`
scenarios	integer indices of scenarios to plot (all plotted if not specified)
statistic	integer or character indices if the statistics in x for which histograms are requested
refline	logical; if TRUE a reference line is plotted at the true value of a parameter
xlab	character; optional label for x-axis

Details

If `object` inherits from 'selectedstatistics' then the numeric

If `object` inherits from 'selectedstatistics' then the numeric results from replicate simulations are summarized using the chosen 'fields' (by default, the number of non-missing values, mean and standard error), along with header information describing the simulations. Otherwise the header alone is returned.

`fields` is a vector of any selection from c('n', 'mean', 'sd', 'se', 'min', 'max', 'lcl', 'ucl', 'median', 'q', 'rms'), or the character value 'all'.

Field 'q' provides 1000 alpha/2 and 1000[1 - alpha/2] quantiles qxxx and qyyy.

'lcl' and 'ucl' refer to the upper and lower limits of a 100(1 - alpha)% confidence interval for the statistic, across replicates.

'rms' gives the root-mean-square of the statistic - most useful for the statistic 'ERR' (see `select.stats`) when it represents the overall accuracy or RMSE.

The `plot` method plots either (i) histograms of the selected statistics (type = 'hist') or (ii) the estimate and confidence interval for each replicate (type = 'CI'). The default for type = 'hist' is to plot the first statistic - this is usually 'n' (number of detected animals) when `fit = FALSE`, and 'estimate' (parameter estimate) when `fit = TRUE`. If length(statistic) > 1 then more than one plot will be produced, so a multi-column or multi-row layout should be prepared with `par` arguments 'mfcol' or 'mfrow'.

For type = 'CI' the statistics must include 'estimate', 'lcl' and 'ucl' (or 'beta', 'lcl' and 'ucl' if outputtype = 'coef').

Value

List with components 'header'

call	original function call
starttime	from object
proctime	from object
constants	small dataframe with values of non-varying inputs
varying	small dataframe with values of varying inputs
fit.args	small dataframe with values arguments for secr.fit, if specified

and 'OUTPUT', a list with one component for each field. Each component may be a list or an array.

See Also

`run.scenarios`, `make.array`, `select.stats` `validate`

Examples

```
## collect raw counts
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2)
traps1 <- make.grid()
tmp1 <- run.scenarios(nrepl = 50, trapset = traps1, scenarios = scen1,
    fit = FALSE)

opar <- par(mfrow=c(2,3))
plot(tmp1, statistic = 1:3)
```

```
par(opar)

summary(tmp1)

summary(tmp1, field=c('q025', 'median', 'q975'))
```

---

validate   *Reject Implausible Statistics*

Description

Simulation output may contain rogue values due to idiosyncracies of model fitting. For example, nonidentifiability due to inadequate data can result in spurious extreme 'estimates' of the sampling variance. Undue influence of rogue replicates can be reduced by using the median as a summary field rather than the mean. This function is another way to deal with the problem, by setting to NA selected statistics from replicates for which some 'test' statistic is out-of-range.

Usage

```
validate(x, test, validrange = c(0, Inf), targets = test)
```

Arguments

x	object that inherits from 'selectedstatistics'
test	character; name of statistic to check
validrange	numeric vector comprising the minimum and maximum permitted values of 'test', or a matrix (see details)
targets	character vector with names of one or more statistics to set to missing (NA) when test is out-of-range

Details

Values of 'test' and 'targets' should be columns in each component 'replicate x statistic' matrix (i.e., scenario) of x$output. You can check for these with `find.stats`.

If `validrange` is a matrix its first and second columns are interpreted as scenario-specific bounds (minima and maxima), and the number of rows must match the number of scenarios.

If all non-missing values of 'test' are in the valid range, the effect is to force the target statistics to NA wherever 'test' is NA.

The default is to change only the test field itself. If the value of 'test' does not appear in 'targets' then the test field is unchanged.

If `targets = "all"` then all columns are set to NA when the test fails.

Value

An object of class c('selectedstatistics', secrdesign, 'list') with the same structure and header information as the input, but possibly with some values in the 'output' component converted to NA.

See Also

`select.stats`, `find.stats`

Examples

```
## Not run:

## generate some data
scen1 <- make.scenarios(D = c(5,10), sigma = 25, g0 = 0.2)
traps1 <- make.grid()
tmp1 <- run.scenarios(nrepl = 5, trapset = traps1, scenarios = scen1,
    fit = TRUE, extractfn = trim)
tmp2 <- predict(tmp1)
tmp3 <- select.stats(tmp2, 'D', c('estimate','RB','RSE','COV'))

## just for demonstration --
## apply scenario-specific +/- 20% bounds for estimated density
## set RB, RSE and COV to NA when estimate is outside this range
permitted <- outer(tmp3$scenarios$D, c(0.8,1.2))
permitted   ## a 2 x 2 matrix
tmp4 <- validate(tmp3, 'estimate', permitted, c('RB', 'RSE','COV'))

## what have we done?!
tmp4$output
summary(tmp4)


## End(Not run)
```

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