

Package ‘sgsR’

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Type Package

Version 1.4.5

License GPL (>= 3)

Title Structurally Guided Sampling

Description Structurally guided sampling (SGS) approaches for airborne laser scanning (ALS; LI-DAR). Primary functions provide means to generate data-driven stratifications & methods for allocating samples. Intermediate functions for calculating and extracting important information about input covariates and samples are also included. Processing outcomes are intended to help forest and environmental management practitioners better optimize field sample placement as well as assess and augment existing sample networks in the context of data distributions and conditions. ALS data is the primary intended use case, however any rasterized remote sensing data can be used, enabling data-driven stratifications and sampling approaches.

URL <https://github.com/tgoodbody/sgsR>,
<https://tgoodbody.github.io/sgsR/>

BugReports <https://github.com/tgoodbody/sgsR/issues>

Depends R (>= 3.5.0), methods

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calculate_allocation *Sample allocation type and count*

Description

Determine how many samples to allocate within strata.

Usage

```
calculate_allocation(
  sraster,
  nSamp,
  allocation = "prop",
  weights = NULL,
  mraster = NULL,
  existing = NULL,
  force = FALSE
)
```

Arguments

sraster	spatRaster. Stratification raster to be used for sampling.
nSamp	Numeric. Number of desired samples.
allocation	Character. Allocation algorithm to be used. Either prop (default) for proportional allocation, optim for optimal allocation (equal sampling cost), equal for equal number of samples (defined by nSamp) for each strata, or "manual" for user defined strata weights defined using weights.
weights	Numeric. Only applicable when allocation = "manual". Vector of weights where sum(weights) == 1. Vector length must be equal to the number of unique strata where the first numeric value corresponds to stratum 1, second stratum 2 etc.
mraster	spatRaster. ALS metric raster. Required when allocation = optim.
existing	sf 'POINT' or data.frame. Existing plot network.
force	Logical. Default = FALSE - force nSamp to be exactly the user defined value in cases where nSamp and sraster strata count are not equally divisible. Additional samples often need to be allocated or removed based on rounding differences resulting from proportional differences between nSamp and strata coverages in sraster. In these instances samples are either added to strata with the lowest number of samples or are removed from strata with the highest number of samples. Has no effect when existing is provided.

Value

Returns a data.frame of:

- strata - Strata ID.
- total - Number of samples to be allocated. Values correspond to under representation (samples needed; positive value) or over representation (too many samples; negative value) based on the nSamp provided.
- need - Required samples per strata based on allocation method. Rounded.

Author(s)

Tristan R.H. Goodbody

References

Gregoire, T.G., & Valentine, H.T. (2007). Sampling Strategies for Natural Resources and the Environment (1st ed.). Chapman and Hall/CRC. <https://doi.org/10.1201/9780203498880>

See Also

Other calculate functions: [calculate_allocation_existing\(\)](#), [calculate_coobs\(\)](#), [calculate_distance\(\)](#), [calculate_pcomp\(\)](#), [calculate_pop\(\)](#), [calculate_representation\(\)](#), [calculate_sampsize\(\)](#)

Examples

```
## Not run:
#--- Load strata raster and existing samples---#
r <- system.file("extdata", "sraster.tif", package = "sgsR")
sr <- terra::rast(r)

e <- system.file("extdata", "existing.shp", package = "sgsR")
e <- sf::st_read(e)

#--- proportional allocation ---#
calculate_allocation(
  sraster = sr,
  nSamp = 10,
  allocation = "prop"
)

## End(Not run)
```

calculate_coobs

coobs algorithm sampling

Description

Perform the COunt of OBServations (coobs) algorithm using existing site data and raster metrics. This algorithm aids the user in determining where additional samples could be located by comparing existing samples to each pixel and associated covariates. The output coobs raster could be used to constrain clhs sampling to areas that are underrepresented.

Usage

```
calculate_coobs(
  mraster,
  existing,
  cores = 1,
  threshold = 0.95,
  plot = FALSE,
  filename = NULL,
  overwrite = FALSE
)
```

Arguments

mraster	spatRaster. ALS metrics raster. Requires at least 2 layers to calculate covariance matrix.
existing	sf 'POINT'. Existing plot network.
cores	Numeric. Number of cores to use for parallel processing. default = 1.
threshold	Numeric. Proxy maximum pixel quantile to avoid outliers. default = 0.95.
plot	Logical. Plots output strata raster and visualized strata with boundary dividers.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.

Value

Output raster with coobs and classified coobs layers.

Note

Special thanks to Dr. Brendan Malone for the original implementation of this algorithm.

Author(s)

Tristan R.H. Goodbody

References

Malone BP, Minasny B, Brungard C. 2019. Some methods to improve the utility of conditioned Latin hypercube sampling. PeerJ 7:e6451 DOI 10.7717/peerj.6451

See Also

Other calculate functions: [calculate_allocation\(\)](#), [calculate_allocation_existing\(\)](#), [calculate_distance\(\)](#), [calculate_pcomp\(\)](#), [calculate_pop\(\)](#), [calculate_representation\(\)](#), [calculate_sampsize\(\)](#)

Examples

```
## Not run:
#--- Load raster and existing plots---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

e <- system.file("extdata", "existing.shp", package = "sgsR")
e <- sf::st_read(e)

calculate_coobs(
  mraster = mr,
  existing = e,
  cores = 4
)

## End(Not run)
```

calculate_distance *Distance to access layer*

Description

Per pixel distance to nearest access vector. Intended to be used as a 'cost' constraint within the [sample_clhs](#) function

Usage

```
calculate_distance(  
  raster,  
  access,  
  slope = FALSE,  
  plot = FALSE,  
  filename = NULL,  
  overwrite = FALSE  
)
```

Arguments

raster	spatRaster. Raster to be used to calculate pixel level distance to access layer.
access	sf 'LINESTRING' or 'MULTILINESTRING'. Access network.
slope	Logical. Calculate slope distance instead of geographic distance. raster needs to be a digital terrain model for this to make sense.
plot	Logical. Plots output strata raster with samples.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.

Value

Input raster with dist2access layer appended.

Author(s)

Tristan R.H. Goodbody

See Also

Other calculate functions: [calculate_allocation\(\)](#), [calculate_allocation_existing\(\)](#), [calculate_coobs\(\)](#), [calculate_pcomp\(\)](#), [calculate_pop\(\)](#), [calculate_representation\(\)](#), [calculate_sampsize\(\)](#)

Examples

```
## Not run:
#--- Load raster and access files ---#
r <- system.file("extdata", "mraster_small.tif", package = "sgsR")
mr <- terra::rast(r)

a <- system.file("extdata", "access.shp", package = "sgsR")
ac <- sf::st_read(a)

calculate_distance(
  raster = mr,
  access = ac,
)

## End(Not run)
```

calculate_lhsOpt	<i>Analyze optimal Latin hypercube sample number</i>
------------------	------------------------------------------------------

Description

Population level analysis of metric raster data to determine optimal Latin Hypercube sample size

Usage

```
calculate_lhsOpt(
  mats,
  PCA = TRUE,
  quant = TRUE,
  KLdiv = TRUE,
  minSamp = 10,
  maxSamp = 100,
  step = 10,
  rep = 10,
  iter = 10000
)
```

Arguments

mats	List. Output from calculate_pop function.
PCA	Logical. Calculates principal component loadings of the population for PCA similarity factor testing. default = FALSE.
quant	Logical. Perform quantile comparison testing.
KLdiv	Logical. Perform Kullback–Leibler divergence testing.
minSamp	Numeric. Minimum sample size to test. default = 10.

maxSamp	Numeric. Maximum sample size to test. default = 100.
step	Numeric. Sample step size for each iteration. default = 10.
rep	Numeric. Internal repetitions for each sample size. default = 10.
iter	Positive Numeric. The number of iterations for the Metropolis-Hastings annealing process. Defaults to 10000. Internal to clhs .

Value

data.frame with summary statistics.

Note

Special thanks to Dr. Brendan Malone for the original implementation of this algorithm.

Author(s)

Tristan R.H. Goodbody

References

Malone BP, Minasny B, Brungard C. 2019. Some methods to improve the utility of conditioned Latin hypercube sampling. PeerJ 7:e6451 DOI 10.7717/peerj.6451

Examples

```
## Not run:
#--- Load raster and access files ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

#--- calculate lhsPop details ---#
mats <- calculate_pop(mraster = mr)

calculate_lhsOpt(mats = mats)

calculate_lhsOpt(
  mats = mats,
  PCA = FALSE,
  iter = 200
)

## End(Not run)
```

calculate_pcomp	<i>Raster principal components</i>
-----------------	------------------------------------

Description

Calculate and rasterize principal components from a metric raster

Usage

```
calculate_pcomp(
  mraster,
  nComp,
  center = TRUE,
  scale = TRUE,
  maxcells = Inf,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE,
  ...
)
```

Arguments

mraster	spatRaster. ALS metrics raster.
nComp	Numeric. Value indicating number of principal components to be rasterized.
center	Logical. Value indicating whether the variables should be shifted to be zero centered.
scale	Logical. Value indicating whether the variables should be scaled to have unit variance.
maxcells	Numeric. Maximum number of samples to use to generate principal components. For objects that are too large to feed into prcomp .
plot	Logical. Plots output strata raster with samples.
details	Logical. If FALSE (default) output is only stratification raster. If TRUE return a list where \$details is additional stratification information and \$raster is the output stratification spatRaster.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.
...	Additional arguments to be passed to prcomp .

Value

Output raster with specified number of principal components as layers.

Author(s)

Tristan R.H. Goodbody

See Also

Other calculate functions: [calculate_allocation\(\)](#), [calculate_allocation_existing\(\)](#), [calculate_coobs\(\)](#), [calculate_distance\(\)](#), [calculate_pop\(\)](#), [calculate_representation\(\)](#), [calculate_sampsize\(\)](#)

Examples

```
#--- Load raster ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

calculate_pcomp(
  mraster = mr,
  nComp = 2
)

pcomp <- calculate_pcomp(
  mraster = mr,
  nComp = 3,
  details = TRUE
)

#--- Display principal component details ---#
# pcomp$pca

#--- Display importance of components ---#
# summary(pcomp$pca)
```

calculate_pop

Population descriptors

Description

Population matrices and descriptions of metric raster data

Calculates population level statistics including principal components, quantile matrix, and covariance matrix needed necessary for [calculate_lhsOpt](#). Outputs can also be used as an input for [sample_ahels](#).

Usage

```
calculate_pop(mraster, PCA = FALSE, matQ = TRUE, nQuant = 10, matCov = TRUE)
```

Arguments

mraster	spatRaster. ALS metrics raster.
PCA	Logical. Calculates principal component loadings of the population for PCA similarity factor testing. default = FALSE.
matQ	Logical. Calculates quantile matrix of the population for quantile comparison testing. default = TRUE.
nQuant	Numeric. Number of quantiles to divide the population into for matQ. default = 10.
matCov	Logical. Calculates covariate matrix of the population. Needed for Kullback–Leibler divergence testing. default = TRUE. Requires matQ = TRUE.

Value

List of matrices to be used as input for [calculate_lhsOpt](#).

Note

Special thanks to Dr. Brendan Malone for the original implementation of this algorithm.

Author(s)

Tristan R.H. Goodbody

References

Malone BP, Minasny B, Brungard C. 2019. Some methods to improve the utility of conditioned Latin hypercube sampling. PeerJ 7:e6451 DOI 10.7717/peerj.6451

See Also

Other calculate functions: [calculate_allocation\(\)](#), [calculate_allocation_existing\(\)](#), [calculate_coobs\(\)](#), [calculate_distance\(\)](#), [calculate_pcomp\(\)](#), [calculate_representation\(\)](#), [calculate_sampsize\(\)](#)

Examples

```
### Load raster and access files ###
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

calculate_pop(mraster = mr)
```

`calculate_representation`*Compare sample representation within sraster strata*

Description

Compare sample representation within sraster strata

Usage

```
calculate_representation(sraster, existing, drop = NULL, plot = FALSE)
```

Arguments

<code>sraster</code>	spatRaster. Stratification raster.
<code>existing</code>	sf 'POINT'. Existing plot network.
<code>drop</code>	Numeric. Numeric value between 0-1 representing the sraster frequency (<code>srasterFreq</code>) below which strata will be dropped from comparison (e.g.. This parameter can be useful for when comparing stratum where percent coverage of strata may be ~ 0 percent and should be dropped. This could occur when mapping multiple stratifications.
<code>plot</code>	Logical. Plot frequency of strata coverage and sampling coverage for <code>sraster</code> and <code>existing</code> . Will return a list if TRUE.

Details

Calculate how sraster strata are represented in existing samples

Value

Returns a tibble where:

- `strata` - sraster strata ID.
- `srasterFreq` - sraster coverage frequency.
- `sampleFreq` - Sampling frequency within sraster strata.
- `diffFreq` - Difference between `srasterFreq` & `sampleFreq`. Positive values indicate over representation.
- `nSamp` - Number of samples within each strata in `existing`.
- `need` - `srasterFreq * sum(nSamp)`. Total theoretical number of required samples to be representative of strata coverage. This values is rounded. It is important for the user to consider `diffFreq`. A small difference - e.g. 1 in `sampleFreq` vs. `srasterFreq` frequency could make the algorithm allocate or remove samples that could likely be ignored.

Author(s)

Tristan R.H. Goodbody, Martin Queinnec

See Also

Other calculate functions: [calculate_allocation\(\)](#), [calculate_allocation_existing\(\)](#), [calculate_coobs\(\)](#), [calculate_distance\(\)](#), [calculate_pcomp\(\)](#), [calculate_pop\(\)](#), [calculate_sampsize\(\)](#)

Examples

```
### --- generate example stratification ---###

#--- load ALS metrics from sgsR internal data ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")

#--- read ALS metrics using the terra package ---#
mraster <- terra::rast(r)

#--- perform stratification ---#
sraster <- strat_kmeans(
  mraster = mraster$zq90,
  nStrata = 6
)

### --- create existing sample network ---###

#--- simple random sampling ---#
existing <- sample_srs(
  raster = mraster$zq90,
  nSamp = 100
)

#--- calculate representation ---#

calculate_representation(
  sraster = sraster,
  existing = existing
)
```

calculate_sampsize *Sample size determination*

Description

Determine a samples size for simple random sampling using relative standard error

Usage

```
calculate_sampsize(
  mraster,
  rse = NULL,
  start = 0.01,
  end = 0.05,
```

```

    increment = 0.001,
    plot = FALSE
  )

```

Arguments

<code>mraster</code>	spatRaster. Metrics raster. All values must be numeric.
<code>rse</code>	Numeric. Desired relative standard error (coefficient of variation of the mean) threshold to determine sample size.
<code>start</code>	Numeric. First rse value to begin rse sequence. default = 0.01.
<code>end</code>	Numeric. Final rse value to end rse sequence. default = 0.05.
<code>increment</code>	Numeric. Value to increment between start & end. default = 0.001.
<code>plot</code>	Logical. if TRUE output graphical representation of estimated sample size vs. rse.

Value

A data.frame of sample size and rse by raster variable.

Note

$$rse = (100 * SE) / mean$$

Where:

- SE - Standard error of the mean
- s - Standard deviation of the observations
- n - Number of observations

Author(s)

Tristan R.H. Goodbody

References

Benedetti, R., Piersimoni, F., & Postiglione, P. (2015). Sampling spatial units for agricultural surveys. pp 202-203. Berlin: Springer.

See Also

Other calculate functions: [calculate_allocation\(\)](#), [calculate_allocation_existing\(\)](#), [calculate_coobs\(\)](#), [calculate_distance\(\)](#), [calculate_pcomp\(\)](#), [calculate_pop\(\)](#), [calculate_representation\(\)](#)

Examples

```
#--- Load raster ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

calculate_sampsize(
  mraster = mr,
  rse = 0.01
)

calculate_sampsize(
  mraster = mr
)

calculate_sampsize(
  mraster = mr,
  rse = 0.025,
  start = 0.01,
  end = 0.08,
  increment = 0.01
)

#--- higher variance leads to need for more samples ---#
```

extract_metrics	<i>Extract metrics</i>
-----------------	------------------------

Description

Extract metric values to existing samples

Usage

```
extract_metrics(
  mraster,
  existing,
  quiet = FALSE,
  data.frame = FALSE,
  filename = NULL,
  overwrite = FALSE
)
```

Arguments

mraster	spatRaster. Metrics Raster.
existing	sf 'POINT'. Existing plot network.
quiet	Logical. If TRUE the user will not get messages about samples with NA values.

data.frame	Logical. Output as data.frame if TRUE
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.

Value

An sf or data.frame object of samples with metrics attributes.

Note

If data.frame = TRUE output will be written using [write.table](#)

Author(s)

Tristan R.H. Goodbody

See Also

Other extract functions: [extract_strata\(\)](#)

Examples

```
#--- Load mraster ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

#' #--- load existing samples ---#
e <- system.file("extdata", "existing.shp", package = "sgsR")
e <- sf::st_read(e)

extract_metrics(
  mraster = mr,
  existing = e
)
```

extract_strata

Extract strata

Description

Extract stratum values to existing samples

Usage

```
extract_strata(  
  sraster,  
  existing,  
  quiet = FALSE,  
  data.frame = FALSE,  
  filename = NULL,  
  overwrite = FALSE  
)
```

Arguments

sraster	spatRaster. Stratification raster.
existing	sf 'POINT'. Existing plot network.
quiet	Logical. If TRUE the user will not get messages about samples with NA values.
data.frame	Logical. Output as data.frame if TRUE
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.

Value

An sf or data.frame object of samples with strata attribute.

Note

If data.frame = TRUE output will be written using [write.table](#)

Author(s)

Tristan R.H. Goodbody

See Also

Other extract functions: [extract_metrics\(\)](#)

Examples

```
#--- Load sraster ---#  
r <- system.file("extdata", "sraster.tif", package = "sgsR")  
sr <- terra::rast(r)  
  
#--- load existing samples ---#  
e <- system.file("extdata", "existing.shp", package = "sgsR")  
e <- sf::st_read(e)  
  
extract_strata(  
  sraster = sr,  
  existing = e  
)
```

sample_ahels

*Adapted Hypercube Evaluation of a Legacy Sample (ahels)***Description**

Perform the adapted Hypercube Evaluation of a Legacy Sample (ahels) algorithm using existing site data and raster metrics. New samples are allocated based on quantile ratios between the existing sample and covariate dataset.

Usage

```
sample_ahels(
  mraster,
  existing,
  nQuant = 10,
  nSamp = NULL,
  threshold = 0.9,
  tolerance = 0,
  matrices = NULL,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE
)
```

Arguments

mraster	spatRaster. ALS metrics raster.
existing	sf 'POINT'. Existing plot network.
nQuant	Numeric. Number of quantiles to divide covariates and samples into. Quantiles that do not cover at least 1 percent of the area of interest will be excluded and be returned as NA.
nSamp	Numeric. Maximum number of new samples to allocate.
threshold	Numeric. Sample quantile ratio threshold. After the threshold default = 0.9 is reached, no additional samples will be added. Values close to 1 can cause the algorithm to continually loop.
tolerance	Numeric. Allowable tolerance (≤ 0.1 (10 added until the $1 - \text{tolerance}$ density is reached. If threshold is used, samples will be added until the threshold - tolerance value is reached. This parameter allows the user to define a buffer around desired quantile densities to permit the algorithm to not add additional samples if quantile density is very close to 1, or user-defined threshold.
matrices	List. Quantile and covariance matrices generated from calculate_pop(mraster = mraster, nQuant = nQuant). Both mraster & nQuant inputs must be the same to supply the covariance matrix. Supplying the matrix allows users with

	very large mrasters to pre-process the covariance matrix to avoid longer sampling processing times. If <code>matrices</code> is provided, the <code>nQuant</code> parameter is ignored and taken from the covariance matrix.
<code>plot</code>	Logical. Plots samples of type <code>existing</code> (if provided; crosses) and <code>new</code> (circles) along with <code>mraster</code> .
<code>details</code>	Logical. If <code>FALSE</code> (default) output is <code>sf</code> object of systematic samples. If <code>TRUE</code> returns a list of <code>sf</code> objects where <code>tessellation</code> is the tessellation grid for sampling, and <code>samples</code> are the systematic samples.
<code>filename</code>	Character. Path to write output samples.
<code>overwrite</code>	Logical. Choice to overwrite existing filename if it exists.

Value

Returns `sf` point object with existing samples and supplemental samples added by the `ahels` algorithm.

Note

Messages in the algorithm will state that samples have been added to under-represented quantiles. The number between square brackets that follow represent the matrix row and column respectively that can be printed using `details = TRUE`.

In some cases, generally when a single metric is used as `mraster`, sampling ratios all be ≥ 1 before the `nSamp` number of samples are allocated. The algorithm will stop in this scenario.

Special thanks to Dr. Brendan Malone for the original implementation of this algorithm.

Author(s)

Tristan R.H. Goodbody

References

Malone BP, Minasny B, Brungard C. 2019. Some methods to improve the utility of conditioned Latin hypercube sampling. *PeerJ* 7:e6451 DOI 10.7717/peerj.6451

See Also

Other sample functions: [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
## Not run:
#--- Load raster and existing plots---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

e <- system.file("extdata", "existing.shp", package = "sgsR")
e <- sf::st_read(e)
```

```

sample_ahels(
  mraster = mr,
  existing = e,
  plot = TRUE
)

#--- supply quantile and covariance matrices ---#
mat <- calculate_pop(mraster = mr)

sample_ahels(
  mraster = mr,
  existing = e,
  matrices = mat,
  nSamp = 300
)

## End(Not run)

```

sample_balanced

Balanced sampling

Description

Balanced raster sampling using [lcube](#) and [lpm2_kdtree](#) methods

Usage

```

sample_balanced(
  mraster,
  nSamp,
  algorithm = "lpm2_kdtree",
  p = NULL,
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  plot = FALSE,
  filename = NULL,
  overwrite = FALSE
)

```

Arguments

mraster	spatRaster. ALS metrics raster.
nSamp	Numeric. Number of desired samples.
algorithm	Character. One of <code>lpm2_kdtree</code> , <code>lcube</code> , <code>lcubestratified</code> .
p	Numeric. Vector with length equal to the number of cells in <code>mraster</code> representing the inclusion probability for each candidate sample. Default = $nSamp / N$, where N is the number of cells.

access	sf 'LINESTRING' or 'MULTILINESTRING'. Access network.
buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
plot	Logical. Plots output strata raster and visualized strata with boundary dividers.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.

Value

An sf object with nSamp samples.

Author(s)

Tristan R.H. Goodbody

References

Anton Grafström and Jonathan Liscic (2019). BalancedSampling: Balanced and Spatially Balanced Sampling. R package version 1.5.5. <https://CRAN.R-project.org/package=BalancedSampling>

Jonathan Liscic and Anton Grafström (2018). SamplingBigData: Sampling Methods for Big Data. R package version 1.0.0. <https://CRAN.R-project.org/package=SamplingBigData>

Grafström, A. Liscic, J (2018). BalancedSampling: Balanced and Spatially Balanced Sampling. R package version 1.5.4. <http://www.antongrafstrom.se/balancedsampling>

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
#--- Load raster and existing plots---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

sample_balanced(
  mraster = mr,
  nSamp = 200
)
```

sample_clhs

*Conditioned Latin Hypercube Sampling***Description**

Conditioned Latin Hypercube Sampling using [clhs](#) functionality.

Usage

```
sample_clhs(
  mraster,
  nSamp,
  iter = 10000,
  cost = NULL,
  existing = NULL,
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE,
  ...
)
```

Arguments

mraster	spatRaster. ALS metrics raster.
nSamp	Numeric. Number of desired samples.
iter	Numeric. Value giving the number of iterations within the Metropolis-Hastings process.
cost	Numeric/Character. Index or name of covariate within mraster to be used to constrain cLHS sampling. If default (NULL), a cost constraint is not used.
existing	sf 'POINT'. Existing plot network.
access	sf 'LINESTRING' or 'MULTILINESTRING'. Access network.
buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
plot	Logical. Plots output strata raster with samples.
details	Logical. If FALSE (default) output is only stratification raster. If TRUE return a list where \$details is additional stratification information and \$raster is the output stratification spatRaster.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.
...	Additional arguments for clhs sampling. See clhs .

Value

An sf object with nSamp stratified samples.

Author(s)

Tristan R.H. Goodbody

References

Minasny, B. and McBratney, A.B. 2006. A conditioned Latin hypercube method for sampling in the presence of ancillary information. *Computers and Geosciences*, 32:1378-1388.

Minasny, B. and A. B. McBratney, A.B.. 2010. Conditioned Latin Hypercube Sampling for Calibrating Soil Sensor Data to Soil Properties. In: *Proximal Soil Sensing, Progress in Soil Science*, pages 111-119.

Roudier, P., Beaudette, D.E. and Hewitt, A.E. 2012. A conditioned Latin hypercube sampling algorithm incorporating operational constraints. In: *Digital Soil Assessments and Beyond. Proceedings of the 5th Global Workshop on Digital Soil Mapping, Sydney, Australia*.

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
#--- Load raster and existing plots---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

e <- system.file("extdata", "existing.shp", package = "sgsR")
e <- sf::st_read(e)

a <- system.file("extdata", "access.shp", package = "sgsR")
ac <- sf::st_read(a)

sample_clhs(
  mraster = mr,
  nSamp = 200,
  plot = TRUE,
  iter = 100
)

sample_clhs(
  mraster = mr,
  nSamp = 400,
  existing = e,
  iter = 250,
  details = TRUE
)
```

sample_existing	<i>Sample existing</i>
-----------------	------------------------

Description

Sub-sample an existing sample. Four sampling methods are available: clhs, balanced, srs and strat.

Usage

```
sample_existing(
  existing,
  nSamp,
  raster = NULL,
  type = "clhs",
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE,
  ...
)
```

Arguments

existing	sf 'POINT'. Existing plot network.
nSamp	Numeric. Number of desired samples.
raster	SpatRaster. Raster to guide the location of the samples. If type = "clhs" this raster can also be used to define the population distributions to be used for sampling.
type	Character. A string indicating the type of sampling method to use. Possible values are "clhs", "balanced", "srs" and "strat".
access	sf. Road access network - must be lines.
buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
details	Logical. If FALSE (default) output is sf object of systematic samples. If TRUE returns a list of sf objects where tessellation is the tessellation grid for sampling, and samples are the systematic samples.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.
...	Additional arguments for the sampling method selected.

Value

An sf object of samples or a list object if details = TRUE

Note

When type = "clhs" or type = "balanced" all attributes in existing will be used for sampling. Remove attributes not indented for sampling' prior to using this algorithm.

Author(s)

Tristan R.H. Goodbody

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

#--- generate an existing sample adn extract metrics ---#
e <- sample_systematic(raster = mr, cellsize = 200)
e <- extract_metrics(existing = e, mraster = mr)

#--- perform clhs (default) sub-sampling ---#
sample_existing(
  existing = e,
  nSamp = 50
)

#--- perform balanced sub-sampling ---#
sample_existing(
  existing = e,
  nSamp = 50,
  type = "balanced"
)

#--- perform simple random sub-sampling ---#
sample_existing(
  existing = e,
  nSamp = 50,
  type = "srs"
)
```

sample_nc	<i>Nearest centroid (NC) sampling</i>
-----------	---------------------------------------

Description

Sampling using the nearest centroid (NC) approach described in Melville & Stone (2016).

Usage

```
sample_nc(
  mraster,
  nSamp,
  k = 1,
  iter = 500,
  algorithm = "Lloyd",
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE
)
```

Arguments

<code>mraster</code>	spatRaster. ALS metrics raster.
<code>nSamp</code>	Numeric. Number of desired samples.
<code>k</code>	Numeric. The number of nearest neighbours to take for each k-means center. When $k = 1$ (default), the output number of samples will match <code>nSamp</code> . Increases to k results in a multiplicative result total number of samples $nSamp * k$.
<code>iter</code>	Numeric. The maximum number of kmeans iterations allowed.
<code>algorithm</code>	Character. Lloyd (default) or MacQueen kmeans algorithms.
<code>access</code>	sf 'LINESTRING' or 'MULTILINESTRING'. Access network.
<code>buff_inner</code>	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
<code>buff_outer</code>	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
<code>plot</code>	Logical. Plot <code>mraster</code> with allocated samples.
<code>details</code>	Logical. If FALSE (default) output is only stratification raster. If TRUE return a list where <code>\$details</code> is additional stratification information and <code>\$raster</code> is the output stratification spatRaster.
<code>filename</code>	Character. Path to write stratified raster to disc.
<code>overwrite</code>	Logical. Specify whether filename should be overwritten on disc.

Value

An sf object with nSamp randomly sampled points.

Note

When details = TRUE, a list is returned where:

1. samples output nearest centroid samples with kcenter attribute linking to associated kmeans centers.
2. kmeans is a list output of the [kmeans](#) function
3. centers Un-scaled kmeans center values for each layer in mraster with kcenter attribute to link with the same attribute in samples.
4. kplot is a ggplot scatterplot object visualizing the kmeans centers and associated nearest neighbor samples.

Author(s)

Tristan R.H. Goodbody

References

G. Melville & C. Stone (2016) Optimising nearest neighbour information—a simple, efficient sampling strategy for forestry plot imputation using remotely sensed data, *Australian Forestry*, 79:3, 217-228, DOI: 10.1080/00049158.2016.1218265

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
#--- Load raster and access files ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

#--- perform simple random sampling ---#
sample_nc(
  mraster = mr,
  nSamp = 5,
)
```

 sample_srs

Simple random sampling

Description

Randomly sample within a stratification raster extent.

Usage

```
sample_srs(
  raster,
  nSamp,
  mindist = NULL,
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  plot = FALSE,
  filename = NULL,
  overwrite = FALSE
)
```

Arguments

raster	spatRaster. Raster to be used for random sampling.
nSamp	Numeric. Number of desired samples.
mindist	Numeric. Minimum allowable distance between selected samples. Default = NULL.
access	sf 'LINESTRING' or 'MULTILINESTRING'. Access network.
buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
plot	Logical. Plots output strata raster with samples.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.

Value

An sf object with nSamp randomly sampled points.

Author(s)

Tristan R.H. Goodbody & Martin Queinnec

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
#--- Load raster and access files ---#
r <- system.file("extdata", "sraster.tif", package = "sgsR")
sr <- terra::rast(r)

a <- system.file("extdata", "access.shp", package = "sgsR")
ac <- sf::st_read(a)

#--- perform simple random sampling ---#
sample_srs(
  raster = sr,
  nSamp = 200,
)
```

sample_strat

Stratified sampling

Description

Sampling based on a stratified raster.

Usage

```
sample_strat(
  sraster,
  nSamp,
  allocation = "prop",
  method = "Queinnec",
  weights = NULL,
  force = FALSE,
  mraster = NULL,
  mindist = NULL,
  existing = NULL,
  include = FALSE,
  remove = FALSE,
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  wrow = 3,
  wcol = 3,
  plot = FALSE,
  details = FALSE,
```

```

    filename = NULL,
    overwrite = FALSE
  )

```

Arguments

sraster	spatRaster. Stratification raster to be used for sampling.
nSamp	Numeric. Number of desired samples. existing, include and force influence this value.
allocation	Character. Allocation algorithm to be used. Either prop (default) for proportional allocation, optim for optimal allocation (equal sampling cost), equal for equal number of samples (defined by nSamp) for each strata, or "manual" for user defined strata weights defined using weights.
method	Character. Sampling design approach "Queinnec" (default) or "random". "Queinnec" method is described in notes below. "random" performs traditional stratified random sampling where probability to sample each cell within each stratum is equal assuming default parameters for mindist. existing, include, remove are ignored when method = "random".
weights	Numeric. Only applicable when allocation = "manual". Vector of weights where sum(weights) == 1. Vector length must be equal to the number of unique strata where the first numeric value corresponds to stratum 1, second stratum 2 etc.
force	Logical. Default = FALSE - force nSamp to be exactly the user defined value in cases where nSamp and sraster strata count are not equally divisible. Additional samples often need to be allocated or removed based on rounding differences resulting from proportional differences between nSamp and strata coverages in sraster. In these instances samples are either added to strata with the lowest number of samples or are removed from strata with the highest number of samples. Has no effect when existing is provided.
mraster	spatRaster. ALS metric raster. Required when allocation = optim.
mindist	Numeric. Minimum allowable distance between selected samples. Default = NULL.
existing	sf 'POINT' or data.frame. Existing plot network.
include	Logical. If TRUE include existing plots in nSamp total.
remove	Logical. If TRUE randomly remove samples from over represented strata to meet allocated sample numbers. Used only when existing and include are both TRUE.
access	sf 'LINESTRING' or 'MULTILINESTRING'. Access network.
buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
wrow	Numeric. Number of row in the focal window (default = 3).
wcol	Numeric. Number of columns in the focal window (default = 3).

plot	Logical. Plots samples of type ‘existing’ (if provided; crosses) and ‘new’ (circles) along with sraster.
details	Logical. If FALSE (default) output is sf object of stratified samples. If TRUE return a list where \$details additional sampling information and \$raster is an sf object of stratified samples.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.

Value

An sf object with nSamp stratified samples.

Note

The sampling is performed in 2 stages when method = "Queinnec":

1. Rule 1 - Sample within grouped stratum pixels defined within the wrow, wcol parameters
2. Rule 2 - If no samples exist to satisfy Rule 1 individual stratum pixels are sampled.

The rule applied to allocate each sample is defined in the rule attribute of output samples.

existing may contain samples that fall in sraster cells that are ‘NA’. If this occurs and include = TRUE, ‘NA’ samples are separated during sampling and re-appended at the end of the sampling process.

If the sraster provided contains factor values, the algorithm will automatically convert these into the numeric factor levels and perform sampling using those values. The categories (factor values) will be extracted and appended to the algorithm output as the ‘category’ attribute.

Author(s)

Tristan R.H. Goodbody & Martin Queinnec

References

Queinnec, M., White, J. C., & Coops, N. C. (2021). Comparing airborne and spaceborne photon-counting LiDAR canopy structural estimates across different boreal forest types. *Remote Sensing of Environment*, 262 (August 2020), 112510. <https://doi.org/10.1016/j.rse.2021.112510>

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_sys_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```

#--- Load raster and access files ---#
r <- system.file("extdata", "sraster.tif", package = "sgsR")
sr <- terra::rast(r)

```

```
#--- perform stratified sampling random sampling ---#
sraster <- sample_strat(
  sraster = sr,
  nSamp = 50
)
```

sample_systematic *Systematic sampling*

Description

Systematic sampling with random start point and translation within a square or hexagonal tessellation.

Usage

```
sample_systematic(
  raster,
  cellsize,
  square = TRUE,
  location = "centers",
  force = FALSE,
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  plot = FALSE,
  filename = NULL,
  overwrite = FALSE,
  details = FALSE,
  ...
)
```

Arguments

raster	spatRaster. Raster used to define extent of fishnet grid.
cellsize	Numeric. Desired cellsize for tessellation.
square	Logical. Tessellation shape. Default is regular square grid, if FALSE hexagons are used.
location	Character. Sample location within tessellation. Default = "centers") returns samples at tessellation centers, "corners" - corners of tessellation are returned, "random" - samples are randomly located within tessellations.
force	Logical. Only applies when location = "random". If TRUE, random samples are forced to fall in areas where raster does not have NA values. This will considerably slow processing.
access	sf. Road access network - must be lines.

buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
plot	Logical. Plots output strata raster with samples.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.
details	Logical. If FALSE (default) output is sf object of systematic samples. If TRUE returns a list of sf objects where tessellation is the tessellation grid for sampling, and samples are the systematic samples.
...	Additional arguments for <code>st_make_grid</code> . Options include <code>offset</code> to offset grid by providing lower left coordinates.

Value

An sf object with sampled points over a tessellation.

Note

Specifying `location = "random"` can result in tessellations with no samples. This results from raster have NA values at the random location chosen. Using `force = TRUE` removes areas of NA from sampling entirely, but considerably slows processing speeds. Thanks to R. Hijmans for help in debugging and providing suggestions for this script.

Author(s)

Tristan R.H. Goodbody, Lukas Winiwarter

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_sys_strat\(\)](#)

Examples

```

#--- Load raster and access files ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)
#--- perform grid sampling ---#
sample_systematic(
  raster = mr,
  cellsize = 1000
)

sample_systematic(
  raster = mr,
  cellsize = 1000,
  location = "corners",
  plot = TRUE

```

```

)

sample_systematic(
  raster = mr,
  cellsize = 1000,
  square = FALSE,
  location = "random",
  plot = TRUE
)

```

sample_sys_strat	<i>Systematic stratified sampling</i>
------------------	---------------------------------------

Description

Systematic stratified sampling with random start point and translation within a square or hexagonal tessellation for each stratum.

Usage

```

sample_sys_strat(
  sraster,
  cellsize,
  square = TRUE,
  location = "centers",
  force = FALSE,
  access = NULL,
  buff_inner = NULL,
  buff_outer = NULL,
  plot = FALSE,
  filename = NULL,
  overwrite = FALSE,
  details = FALSE
)

```

Arguments

sraster	spatRaster. Stratified raster with name "strata".
cellsize	Numeric. Desired cellsize for tessellation.
square	Logical. Tessellation shape. Default is regular square grid, if FALSE hexagons are used.
location	Character. Sample location within tessellation. Default = "centers") returns samples at tessellation centers, "corners" - corners of tessellation are returned, "random" - samples are randomly located within tessellations.

force	Logical. Only applies when location = "random". If TRUE, random samples are forced to fall in areas where raster does not have NA values. This will considerably slow processing.
access	sf. Road access network - must be lines.
buff_inner	Numeric. Inner buffer boundary specifying distance from access where plots cannot be sampled.
buff_outer	Numeric. Outer buffer boundary specifying distance from access where plots can be sampled.
plot	Logical. Plots output strata raster with samples.
filename	Character. Path to write output samples.
overwrite	Logical. Choice to overwrite existing filename if it exists.
details	Logical. If FALSE (default) output is sf object of systematic samples. If TRUE returns a list of sf objects where tessellation is the tessellation grid for sampling, and samples are the systematic samples.

Value

An sf object with sampled points over unique tessellations.

Note

Specifying location = "random" can result in tessellations with no samples. This results from raster have NA values at the random location chosen. Using force = TRUE removes areas of NA from sampling entirely, but considerably slows processing speeds. Thanks to R. Hijmans for help in debugging and providing suggestions for this script.

All stratum are sampled using random tessellation start points and translations.

Author(s)

Tristan R.H. Goodbody

See Also

Other sample functions: [sample_ahels\(\)](#), [sample_balanced\(\)](#), [sample_clhs\(\)](#), [sample_existing\(\)](#), [sample_nc\(\)](#), [sample_srs\(\)](#), [sample_strat\(\)](#), [sample_systematic\(\)](#)

Examples

```
#--- Load raster and access files ---#
r <- system.file("extdata", "sraster.tif", package = "sgsR")
sr <- terra::rast(r)

#--- perform grid sampling ---#
sample_sys_strat(
  sraster = sr,
  cellsize = 1000
)
```

```

sample_sys_strat(
  sraster = sr,
  cellsize = 1000,
  square = FALSE,
  location = "corners"
)

```

strat_breaks

Breaks stratification

Description

Stratify metrics raster using user defined breaks

Usage

```

strat_breaks(
  mraster,
  breaks,
  map = FALSE,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE
)

```

Arguments

mraster	Spatraster. Raster to stratify. Layers in mraster must match the number of breaks vectors provided.
breaks	Numeric. Vector of breakpoints for each layer of mraster. If mraster has multiple layers, breaks must be a list with an equal number of objects.
map	Logical. Map individual stratified layers to a combined stratification. Will output a multi-layer SpatRaster with individual stratifications for each mraster layer and an additional mapped stratification named "strata".
plot	Logical. Plots output strata raster and visualized strata with boundary dividers.
details	Logical. If FALSE (default) output is only stratification raster. If TRUE return a list where \$details is additional stratification information and \$raster is the output stratification spatRaster.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.

Value

Returns an output stratification spatRaster or a list when details = TRUE.

When a list is returned:

1. raster is a stratified spatRaster based on quantiles. If stack = TRUE will be the number of layers of mraster plus the final output
2. breaks is a list output of breaks
3. plot is a ggplot histogram object showing distribution(s) and break point(s).

Author(s)

Tristan R.H. Goodbody

See Also

Other stratify functions: [strat_kmeans\(\)](#), [strat_map\(\)](#), [strat_poly\(\)](#), [strat_quantiles\(\)](#)

Examples

```
#--- Load raster ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

#--- create vector breaks ---#
br.zq90 <- c(3, 5, 11, 18)
br.pz2 <- c(20, 40, 60, 80)

strat_breaks(
  mraster = mr$zq90,
  breaks = br.zq90
)

strat_breaks(
  mraster = mr[[1:2]],
  breaks = list(br.zq90, br.pz2),
  details = TRUE
)
```

strat_kmeans

k-means stratification

Description

Stratify metrics raster using [kmeans](#) algorithm

Usage

```

strat_kmeans(
  mraster,
  nStrata,
  iter = 500,
  algorithm = "Lloyd",
  center = TRUE,
  scale = TRUE,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE,
  ...
)

```

Arguments

mraster	spatRaster. ALS metrics raster.
nStrata	Numeric. Number of desired strata.
iter	Numeric. The maximum number of iterations allowed.
algorithm	Character. "Lloyd" (default) or "MacQueen" algorithms.
center	Logical. Value indicating whether the variables should be shifted to be zero centered.
scale	Logical. Value indicating whether the variables should be scaled to have unit variance.
plot	Logical. Plots output strata raster and visualized strata with boundary dividers.
details	Logical. If FALSE (default) output is only stratification raster. If TRUE return a list where \$details is additional stratification information and \$raster is the output stratification spatRaster.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.
...	Additional arguments to be passed to kmeans function.

Value

output stratification spatRaster, or a list when details = TRUE.

Author(s)

Tristan R.H. Goodbody

See Also

Other stratify functions: [strat_breaks\(\)](#), [strat_map\(\)](#), [strat_poly\(\)](#), [strat_quantiles\(\)](#)

Examples

```

#--- Load raster and access files ---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

#--- perform stratification using k-means ---#
kmeans <- strat_kmeans(
  mraster = mr,
  nStrata = 5
)

kmeans <- strat_kmeans(
  mraster = mr,
  nStrata = 5,
  iter = 1000,
  algorithm = "MacQueen",
  details = TRUE
)

```

strat_map

*Map a raster stack of a list of rasters***Description**

Map stratified rasters to a combined stratification.

Usage

```

strat_map(
  sraster,
  stack = FALSE,
  filename = NULL,
  overwrite = FALSE,
  plot = FALSE,
  details = FALSE
)

```

Arguments

sraster	spatRaster or list. Stratification raster stack or list of rasters. If sraster is of class list, then it is internally converted into a raster stack.
stack	Logical. Default = FALSE. If TRUE, inputs and output will be stacked: strata_1, strata_2, ..., strata.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.
plot	Logical. Plots output strata raster and visualized strata with boundary dividers.

details Logical. If FALSE (default) output is a mapped stratified spatRaster object. If TRUE return a list where \$outRaster is the mapped stratified raster, and \$lookup is the lookup table for the stratification.

Value

A spatRaster object.

Mapping

The mapping algorithm will take the stratification from sraster and combine it with overlying strata values across all layers. This will result in a strata attribute where the values from all inputs are combined.

i.e.

If strata_1 = 1 and strata_2 = 1 then strata = 11.

If strata_1 = 2 and strata_2 = 14 then strata = 214.

If strata_1 = "A" and strata_2 = 14 then strata = "A14".

Author(s)

Tristan R.H. Goodbody, Tommaso Trotto, Robert Hijmans

See Also

Other stratify functions: [strat_breaks\(\)](#), [strat_kmeans\(\)](#), [strat_poly\(\)](#), [strat_quantiles\(\)](#)

Examples

```
#--- load input metrics rasters ---#
raster <- system.file("extdata", "sraster.tif", package = "sgsR")
sraster <- terra::rast(raster)

#--- read polygon coverage ---#
poly <- system.file("extdata", "inventory_polygons.shp", package = "sgsR")
fri <- sf::st_read(poly)

#--- stratify polygon coverage ---#
#--- specify polygon attribute to stratify ---#

attribute <- "NUTRIENTS"

#--- specify features within attribute & how they should be grouped ---#
#--- as a single vector ---#

features <- c("poor", "rich", "medium")

srasterfri <- strat_poly(
  poly = fri,
  attribute = attribute,
  features = features,
```



```

    raster = sraster
  )

  #--- map srasters with raster stack ---#
  stack <- c(srasterfri, sraster)
  strat_map(
    sraster = stack
  )

  #--- map sraster with list of rasters ---#
  rast_list <- list(srasterfri, sraster)
  strat_map(
    sraster = rast_list,
    stack = TRUE,
    details = TRUE
  )

```

strat_poly

Stratify using polygons

Description

Stratify based on polygon coverage attributes and features.

Usage

```

strat_poly(
  poly,
  attribute,
  features,
  raster,
  filename = NULL,
  overwrite = FALSE,
  plot = FALSE,
  details = FALSE
)

```

Arguments

poly	sf. Input polygon coverage. e.g. - forest resources inventory coverage.
attribute	Character. Name of attribute within poly that will be stratified.
features	Vector / list of vectors. Features within attribute to guide stratification.
raster	spatRaster. Raster template to enable polygon to raster conversion.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.
plot	Logical. Plots output spatRaster.

details Logical. If FALSE (default) output is spatRaster object of stratified polygon attributes. If TRUE return a list where \$outRaster is the stratified attributes, \$lookUp is the lookup table for the stratification, and poly is the defined polygon attribute with corresponding features / strata

Value

A spatRaster object.

Author(s)

Tristan R.H. Goodbody

See Also

Other stratify functions: [strat_breaks\(\)](#), [strat_kmeans\(\)](#), [strat_map\(\)](#), [strat_quantiles\(\)](#)

Examples

```
#--- load input metrics raster ---#
raster <- system.file("extdata", "sraster.tif", package = "sgsR")
sraster <- terra::rast(raster)

#--- read polygon coverage ---#
poly <- system.file("extdata", "inventory_polygons.shp", package = "sgsR")
fri <- sf::st_read(poly)

#--- stratify polygon coverage ---#
#--- specify polygon attribute to stratify ---#

attribute <- "NUTRIENTS"

#--- specify features within attribute & how they should be grouped ---#
#--- as a single vector ---#

features <- c("poor", "rich", "medium")

srasterpoly <- strat_poly(
  poly = fri,
  attribute = attribute,
  features = features,
  raster = sraster
)

#--- or as multiple lists ---#

g1 <- "poor"
g2 <- c("rich", "medium")

features <- list(g1, g2)

srasterpoly <- strat_poly(
```

```

    poly = fri,
    attribute = attribute,
    features = features,
    raster = sraster,
    details = TRUE
  )

```

strat_quantiles *Quantiles stratification*

Description

Stratify metric raster using metric quantiles.

Usage

```

strat_quantiles(
  mraster,
  nStrata,
  map = FALSE,
  plot = FALSE,
  details = FALSE,
  filename = NULL,
  overwrite = FALSE
)

```

Arguments

mraster	spatRaster. ALS metrics raster.
nStrata	Numeric. A positive integer representing the number of desired classes or a numeric vector of probabilities with values between 0-1. If mraster has multiple layers, nStrata must be a list with an equal number of objects.
map	Logical. Map individual stratified layers to a combined stratification. Will output a multi-layer SpatRaster with individual stratifications for each mraster layer and an additional mapped stratification named "strata".
plot	Logical. Plots output strata raster and visualized strata with boundary dividers.
details	Logical. If FALSE (default) output is only stratification raster. If TRUE return a list where \$details is additional stratification information and \$raster is the output stratification spatRaster.
filename	Character. Path to write stratified raster to disc.
overwrite	Logical. Specify whether filename should be overwritten on disc.

Value

Returns an output stratification spatRaster or a list when details = TRUE.

When a list is returned:

1. details lookUp table for stratification(s).
2. raster is a stratified spatRaster based on quantiles
3. plot is a ggplot histogram / scatter plot object (depends on whether metric2 was supplied). Histogram shows distribution and break points.

Author(s)

Tristan R.H. Goodbody

See Also

Other stratify functions: [strat_breaks\(\)](#), [strat_kmeans\(\)](#), [strat_map\(\)](#), [strat_poly\(\)](#)

Examples

```
#--- Load raster and existing plots---#
r <- system.file("extdata", "mraster.tif", package = "sgsR")
mr <- terra::rast(r)

strat_quantiles(
  mraster = mr$q90,
  nStrata = 4
)

strat_quantiles(
  mraster = mr[[1:2]],
  nStrata = list(c(0.2, 0.4, 0.8), 3),
  map = TRUE
)
```

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