

# Package ‘spcosa’

June 30, 2025

**Type** Package

**Title** Spatial Coverage Sampling and Random Sampling from Compact Geographical Strata

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**Description** Spatial coverage sampling and random sampling from compact geographical strata created by k-means. See Walvoort et al. (2010) <[doi:10.1016/j.cageo.2010.04.005](https://doi.org/10.1016/j.cageo.2010.04.005)> for details.

**Depends** R (>= 4.1.0), rJava (>= 1.0-0), methods, utils

**Imports** sp (>= 1.4-6), ggplot2 (>= 3.3.0)

**Suggests** grid, RUnit (>= 0.4.32), sf (>= 1.0-12), knitr (>= 1.36), rmarkdown (>= 2.11)

**SystemRequirements** Java (>= 6)

**License** GPL (>= 3)

**URL** <https://git.wur.nl/Walvo001/spcosa>

**Collate** class\_Stratification.R class\_CompactStratification.R  
class\_CompactStratificationEqualArea.R  
class\_CompactStratificationPriorPoints.R  
class\_SamplingPattern.R class\_SamplingPatternPurposive.R  
class\_SamplingPatternCentroids.R  
class\_SamplingPatternPriorPoints.R  
class\_SamplingPatternRandom.R  
class\_SamplingPatternRandomSamplingUnits.R  
class\_SamplingPatternRandomComposite.R class\_Statistic.R  
class\_SpatialMean.R class\_SamplingVariance.R  
class\_StandardError.R class\_SpatialVariance.R  
class\_SpatialCumulativeDistributionFunction.R  
generic\_estimate.R generic\_getArea.R generic\_getRelativeArea.R  
generic\_getAttributes.R generic\_getCellSize.R  
generic\_getCentroid.R generic\_getSampleSize.R  
generic\_getNumberOfCells.R generic\_getNumberOfStrata.R  
generic\_getObjectiveFunctionValue.R generic\_stratify.R

generic\_plot.R methods\_estimate.R  
 method\_getArea-CompactStratification.R  
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 method\_getCellSize-CompactStratification.R  
 method\_getCellSize-SpatialPixels.R  
 method\_getCentroid-CompactStratification.R  
 method\_getNumberOfCells-CompactStratification.R  
 method\_getNumberOfStrata-CompactStratification.R  
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 method\_getSampleSize-SamplingPattern.R  
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 method\_initialize-CompactStratification.R  
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 method\_stratify-SpatialGrid.R method\_stratify-SpatialPixels.R  
 method\_stratify-SpatialPolygons.R methods\_plot.R  
 methods\_spsample.R methods\_setAs.R method\_show-Stratification.R  
 method\_show-SamplingPattern.R method\_show-Statistic.R onLoad.R  
 onAttach.R

**NeedsCompilation** no

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| spcosa-package | <i>Spatial Coverage Sampling and Random Sampling from Compact Geographical Strata</i> |
|----------------|---------------------------------------------------------------------------------------|

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## Description

Algorithms for spatial coverage sampling and for random sampling from compact geographical strata based on  $k$ -means.

## Details

The **spcosa**-package provides algorithms for spatial coverage sampling and for random sampling from compact geographical strata based on  $k$ -means (see *de Gruijter et al., 2006*, *Walvoort et al., 2010*, and [kmeans](#)). S4-classes and methods are available for spatial coverage sampling, random sampling from compact geographical strata, and stratified simple random sampling for composites. In case of spatial coverage sampling, existing sampling points may be taken into account. See the package [vignette](#) for more information and examples.

## Note

In order to get the **spcosa**-package running, make sure that a recent version of Java is installed.

## Author(s)

D.J.J. Walvoort, D.J. Brus, J.J. de Gruijter,  
 Maintainer: Dennis Walvoort <dennis.walvoort@wur.nl>

## References

- Brus, D. J., Spatjens, L. E. E. M., and de Gruijter, J. J. (1999). A sampling scheme for estimating the mean extractable phosphorus concentration of fields for environmental regulation. *Geoderma* 89:129-148
- de Gruijter, J. J., Brus, D. J., Bierkens, M. F. P., and Knotters, M. (2006). *Sampling for Natural Resource Monitoring* Berlin: Springer-Verlag.

Walvoort, D., Brus, D. and de Gruijter, J. (2009). Spatial Coverage Sampling on Various Spatial Scales. *Pedometron* 26:20-22

Walvoort, D. J. J., Brus, D. J. and de Gruijter, J. J. (2010). An R package for spatial coverage sampling and random sampling from compact geographical strata by  $k$ -means. *Computers & Geosciences* 36: 1261-1267 ([doi:10.1016/j.cageo.2010.04.005](https://doi.org/10.1016/j.cageo.2010.04.005))

### See Also

[stratify](#) for stratification, [spsample](#) for sampling, and [estimate](#) for inference.

---

CompactStratification-class  
*Class "CompactStratification"*

---

### Description

A class for storing a stratification with compact strata.

### Objects from the Class

Objects can be created by calls of the form `new("CompactStratification", cells, stratumId, centroids, mssd)`. However, objects are usually created by calling [stratify](#).

### Slots

**cells:** Object of class "[sp::SpatialPixels](#)", representing the area to be partitioned.  
**stratumId:** Object of class "integer", indicating to which stratum each cell in cells belong.  
**centroids:** Object of class "[sp::SpatialPoints](#)", representing the centers of gravity of each stratum.  
**mssd:** Object of class "numeric", representing the mean squared shortest distance.

### Extends

Class "[Stratification](#)", directly.

### Methods

**coerce** signature(`from` = "CompactStratification", `to` = "data.frame"): coerces to "[data.frame](#)".  
**coerce** signature(`from` = "CompactStratification", `to` = "SpatialPixels"): coerces to "[SpatialPixels](#)".  
**coerce** signature(`from` = "CompactStratification", `to` = "SpatialPixelsDataFrame"): coerces to "[sp::SpatialPixelsDataFrame](#)".  
**estimate** signature(`statistic` = "SamplingVariance", `stratification` = "CompactStratification", `samplingPattern` = "SamplingPatternRandomSamplingUnits", `data` = "data.frame"): estimates the sampling variance. See "[SamplingVariance](#)" for more details.

- estimate** signature(statistic = "SpatialCumulativeDistributionFunction", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial cumulative distribution function (SCDF). See "[SpatialCumulativeDistributionFunction](#)" for more details.
- estimate** signature(statistic = "SpatialMean", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial mean. See "[SpatialMean](#)" for more details.
- estimate** signature(statistic = "SpatialVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial variance. See "[SpatialVariance](#)" for more details.
- estimate** signature(statistic = "StandardError", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the standard error of the spatial mean. See "[StandardError](#)" for more details.
- estimate** signature(statistic = "character", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates statistic, one of spatial mean, spatial variance, SCDF, sampling variance, or standard error.
- getArea** signature(object = "CompactStratification"): returns the area of each stratum.
- getCentroid** signature(object = "CompactStratification"): returns the center of gravity of each stratum.
- getNumberOfStrata** signature(object = "CompactStratification"): returns the number of strata.
- getObjectiveFunctionValue** signature(object = "CompactStratification"): extracts the mean squared shortest distance.
- getRelativeArea** signature(object = "CompactStratification"): returns the relative area of each stratum. The sum of the relative areas equals one.
- plot** signature(x = "CompactStratification", y = "missing"): plots stratification x.
- plot** signature(x = "CompactStratification", y = "SamplingPattern"): plots sampling pattern y on top of stratification x.
- plot** signature(x = "CompactStratification", y = "SamplingPatternPriorPoints"): plots sampling pattern y on top of stratification x.
- plot** signature(x = "CompactStratification", y = "SamplingPatternRandomComposite"): plots sampling pattern y on top of stratification x.
- spsample** signature(x = "CompactStratification", n = "missing", type = "missing"): returns the centers of gravity of each stratum.
- spsample** signature(x = "CompactStratification", n = "numeric", type = "missing"): randomly selects n sampling points in each stratum.

### Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

CompactStratificationEqualArea-class

Class "*CompactStratificationEqualArea*"

---

## Description

A class for storing a stratification with compact strata of equal size.

## Objects from the Class

Objects can be created by calls of the form `new("CompactStratificationEqualArea", cells, stratumId, centroids, mssd)`. However, objects are usually created by calling `stratify`.

## Slots

`cells`: Object of class "`sp::SpatialPixels`", representing the area to be partitioned.

`stratumId`: Object of class "`integer`", indicating to which stratum each cell in `cells` belong.

`centroids`: Object of class "`sp::SpatialPoints`", representing the centers of gravity of each stratum.

`mssd`: Object of class "`numeric`", representing the mean squared shortest distance.

## Extends

Class "`CompactStratification`", directly. Class "`Stratification`", by class "`CompactStratification`", distance 2.

## Methods

**estimate** signature(`statistic` = "`SamplingVariance`", `stratification` = "`CompactStratificationEqualArea`", `samplingPattern` = "`SamplingPatternRandomComposite`", `data` = "`data.frame`"): estimates the sampling variance. See "`SamplingVariance`" for more details.

**estimate** signature(`statistic` = "`SpatialMean`", `stratification` = "`CompactStratificationEqualArea`", `samplingPattern` = "`SamplingPatternRandomComposite`", `data` = "`data.frame`"): estimates the spatial mean. See "`SpatialMean`" for more details.

**spsample** signature(`x` = "`CompactStratificationEqualArea`", `n` = "`missing`", `type` = "`missing`"): returns the centers of gravity of each stratum.

**spsample** signature(`x` = "`CompactStratificationEqualArea`", `n` = "`numeric`", `type` = "`missing`"): randomly selects `n` sampling points in each stratum.

**spsample** signature(`x` = "`CompactStratificationEqualArea`", `n` = "`numeric`", `type` = "`character`"): randomly selects `n` sampling points in each stratum. if `type` = "`composite`", stratified simple random sampling of `n` composites.

## Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

CompactStratificationPriorPoints-class

Class "*CompactStratificationPriorPoints*"

---

## Description

A class for storing a stratification with compact strata, given prior sampling locations.

## Objects from the Class

Objects can be created by calls of the form `new("CompactStratificationPriorPoints", cells, stratumId, centroids, mssd, priorPoints)`. However, objects are usually created by calling [stratify](#).

## Slots

**priorPoints:** Object of class "[sp::SpatialPoints](#)", containing the coordinates of the existing locations.

**cells:** Object of class "[sp::SpatialPixels](#)", representing the area to be partitioned.

**stratumId:** Object of class "integer", indicating to which stratum each cell in `cells` belong.

**centroids:** Object of class "[sp::SpatialPoints](#)", representing the centers of gravity of each stratum.

**mssd:** Object of class "numeric", representing the mean squared shortest distance.

## Extends

Class "[CompactStratification](#)", directly. Class "[Stratification](#)", by class "CompactStratification", distance 2.

## Methods

**spsample** signature(`x = "CompactStratificationPriorPoints"`, `n = "missing"`, `type = "missing"`):  
returns the centers of gravity of strata *without* prior points in addition to the prior points.

## Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

## Description

Methods for estimating statistics given a spatial sample.

## Methods

**statistic = "character", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates one of the following statistics, depending on the value of argument **statistic**:  
 spatial mean, spatial variance, sampling variance, standard error, or scdf. See the  
 examples below for details.

**statistic = "character", stratification = "CompactStratificationEqualArea", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates one of the following statistics, depending on the value of argument **statistic**:  
 spatial mean, sampling variance, or standard error.

**statistic = "SamplingVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates the sampling variance. See "[SamplingVariance](#)" for more details.

**statistic = "StandardError", stratification = "CompactStratificationEqualArea", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates the standard error of the spatial mean. See "[StandardError](#)" for more details.

**statistic = "SpatialCumulativeDistributionFunction", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates the spatial cumulative distribution function (SCDF). See "[SamplingPatternRandomSamplingUnits](#)"  
 for more details.

**statistic = "SpatialMean", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates the spatial mean. See "[SpatialMean](#)" for more details.

**statistic = "SpatialVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits"**  
 estimates the spatial variance. See "[SpatialVariance](#)" for more details.

## Examples

```
# Note: the example below requires the 'sf'-package.
if (require(sf)) {
  # read vector representation of the "Mijdrecht" area
  shp <- as(st_read(
    dsn = system.file("maps", package = "spcosa"),
    layer = "mijdrecht"), "Spatial")

  # stratify into 30 strata
  myStratification <- stratify(shp, nStrata = 30, nTry = 10, verbose = TRUE)

  # random sampling of two sampling units per stratum
  mySamplingPattern <- spsample(myStratification, n = 2)

  # plot sampling pattern
  plot(myStratification, mySamplingPattern)
```

```

# simulate data
# (in real world cases these data have to be obtained by field work etc.)
myData <- as(mySamplingPattern, "data.frame")
myData$observation <- rnorm(n = nrow(myData), mean = 10, sd = 1)

# design-based inference
estimate("spatial mean", myStratification, mySamplingPattern, myData["observation"])
estimate("sampling variance", myStratification, mySamplingPattern, myData["observation"])
estimate("standard error", myStratification, mySamplingPattern, myData["observation"])
estimate("spatial variance", myStratification, mySamplingPattern, myData["observation"])
estimate("scdf", myStratification, mySamplingPattern, myData["observation"])
}

```

---

getArea-methods

---

*Extract the Area of an Object*


---

## Description

Methods for extracting the area of objects.

## Methods

**object = "CompactStratification"** returns the area of each stratum.

## See Also

[getRelativeArea](#)

---

getCentroid-methods

---

*Extract Centroids*


---

## Description

Methods for extracting centroids

## Methods

**object = "CompactStratification"** returns the centers of gravity of each stratum.

---

getNumberOfStrata-methods

*Extract the Number of Strata in an Object*

---

### Description

Methods for extracting the number of strata of objects.

### Methods

**object = "CompactStratification"** returns the number of strata in a compact stratification.

---

getObjectiveFunctionValue-methods

*Extract the Objective Function Value of an Object*

---

### Description

Methods for extracting the objective function value

### Methods

**object = "CompactStratification"** extracts the mean squared shortest distance.

---

getRelativeArea-methods

*Extract the Relative Area of an Object*

---

### Description

Methods for extracting relative areas of objects. The total area equals unity.

### Methods

**object = "CompactStratification"** returns the relative area of each stratum. The sum of the relative areas equals 1.

### See Also

[getArea](#)

---

getSampleSize-methods *Extract the sample size of an object*

---

### Description

Methods for extracting the sample size.

### Methods

**object = "SamplingPattern"** returns the sample size.

**object = "SamplingPatternRandomComposite"** returns the number of composites

---

plot-methods *Visualizing Compact Stratifications and Sampling Patterns*

---

### Description

The plot method can be used to visualize compact stratifications and sampling patterns. Since it has been built on top of the **ggplot2** package, functions provided by this package can be used to modify the plots.

### Methods

**x = "CompactStratification", y = "missing"** plots stratification x.

**x = "CompactStratification", y = "SamplingPattern"** plots sampling pattern y on top of stratification x.

**x = "CompactStratification", y = "SamplingPatternPriorPoints"** plots sampling pattern y on top of stratification x.

**x = "CompactStratification", y = "SamplingPatternRandomComposite"** plots sampling pattern y on top of stratification x.

**x = "SamplingPattern", y = "missing"** plots sampling pattern x.

**x = "SamplingPatternPriorPoints", y = "missing"** plots sampling pattern x.

**x = "SamplingPatternRandomComposite", y = "missing"** plots sampling pattern x.

### See Also

**ggplot2**-package

---

SamplingPattern-class    *Class "SamplingPattern"*

---

### Description

A class for storing a sampling pattern.

### Objects from the Class

Objects can be created by calls of the form `new("SamplingPattern", ...)`. However, objects are usually created by calling `spsample`.

### Slots

**sample:** Object of class "`sp::SpatialPoints`", containing the sampling locations.

### Methods

**coerce** signature(from = "SamplingPattern", to = "data.frame"): coerces to "data.frame".

**coerce** signature(from = "SamplingPattern", to = "SpatialPoints"): coerces to "`sp::SpatialPoints`".

**getSampleSize** signature(object = "SamplingPattern"): returns the sample size.

**plot** signature(x = "CompactStratification", y = "SamplingPattern"): plots sampling pattern y on top of stratification x.

**plot** signature(x = "SamplingPattern", y = "missing"): plots sampling pattern x.

**show** signature(object = "SamplingPattern"): prints object on the output device.

### Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingPatternCentroids-class  
                                   *Class "SamplingPatternCentroids"*

---

### Description

A class for storing a sampling pattern, where the sampling locations are the centers of gravity of each stratum.

### Objects from the Class

Objects can be created by calls of the form `new("SamplingPatternCentroids", ...)`. However, objects are usually created by calling `spsample`.

**Slots**

sample: Object of class "[sp::SpatialPoints](#)", containing the sampling locations

**Extends**

Class "[SamplingPatternPurposive](#)", directly. Class "[SamplingPattern](#)", by class "SamplingPatternPurposive", distance 2.

**Methods**

No methods defined with class "SamplingPatternCentroids" in the signature.

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingPatternPriorPoints-class

*Class "SamplingPatternPriorPoints"*

---

**Description**

A class for storing a sampling pattern consisting of existing points and new points. The new points are the centers of gravity of their stratum.

**Objects from the Class**

Objects can be created by calls of the form `new("SamplingPatternPriorPoints", ...)`. However, objects are usually created by calling [spsample](#).

**Slots**

isPriorPoint: Object of class "logical", which is TRUE is the location is a prior point, and FALSE if it is not.

sample: Object of class "[sp::SpatialPoints](#)", containing the sampling locations

**Extends**

Class "[SamplingPatternPurposive](#)", directly. Class "[SamplingPattern](#)", by class "SamplingPatternPurposive", distance 2.

**Methods**

**plot** signature(x = "CompactStratification", y = "SamplingPatternPriorPoints"): plots sampling pattern y on top of stratification x.

**plot** signature(x = "SamplingPatternPriorPoints", y = "missing"): plots sampling pattern x.

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingPatternPurposive-class

*Class "SamplingPatternPurposive"*

---

**Description**

An ancestor class for storing purposive sampling patterns.

**Objects from the Class**

Objects can be created by calls of the form `new("SamplingPatternPurposive", ...)`.

**Slots**

sample: Object of class "`sp::SpatialPoints`", containing the sampling locations

**Extends**

Class "`SamplingPattern`", directly.

**Methods**

No methods defined with class "SamplingPatternPurposive" in the signature.

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingPatternRandom-class

*Class "SamplingPatternRandom"*

---

**Description**

An ancestor class for storing random sampling patterns.

**Objects from the Class**

Objects can be created by calls of the form `new("SamplingPatternRandom", ...)`.

**Slots**

sample: Object of class "`sp::SpatialPoints`", containing the sampling locations

**Extends**

Class "[SamplingPattern](#)", directly.

**Methods**

No methods defined with class "SamplingPatternRandom" in the signature.

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingPatternRandomComposite-class

*Class "SamplingPatternRandomComposite"*

---

**Description**

A class for storing composites obtained by random sampling.

**Objects from the Class**

Objects can be created by calls of the form `new("SamplingPatternRandomComposite", ...)`. However, objects are usually created by calling `spsample`.

**Slots**

`composite`: Object of class "integer", indicating to which composite sample a sampling unit belongs.

`sample`: Object of class "`sp::SpatialPoints`", containing the sampling locations.

**Extends**

Class "[SamplingPatternRandom](#)", directly. Class "[SamplingPattern](#)", by class "SamplingPatternRandom", distance 2.

**Methods**

**coerce** signature(from = "SamplingPatternRandomComposite", to = "data.frame"): coerces to "data.frame".

**coerce** signature(from = "SamplingPatternRandomComposite", to = "SpatialPointsDataFrame"): coerces to "`sp::SpatialPointsDataFrame`".

**estimate** signature(statistic = "SamplingVariance", stratification = "CompactStratificationEqualArea", samplingPattern = "SamplingPatternRandomComposite", data = "data.frame"): estimates the sampling variance. See "[SamplingVariance](#)" for more details.

**estimate** signature(statistic = "SpatialMean", stratification = "CompactStratificationEqualArea", samplingPattern = "SamplingPatternRandomComposite", data = "data.frame"): estimates the spatial mean. See "[SpatialMean](#)" for more details.

- getSampleSize** signature(object = "SamplingPatternRandomComposite"): returns the sample size per stratum.
- plot** signature(x = "CompactStratification", y = "SamplingPatternRandomComposite"): plots sampling pattern y on top of stratification x.
- plot** signature(x = "SamplingPatternRandomComposite", y = "missing"): plots sampling pattern x.

### Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingPatternRandomSamplingUnits-class

*Class "SamplingPatternRandomSamplingUnits"*

---

### Description

A class for storing sampling units obtained by random sampling.

### Objects from the Class

Objects can be created by calls of the form `new("SamplingPatternRandomSamplingUnits", ...)`. However, objects are usually created by calling `spsample`.

### Slots

**sample:** Object of class "`sp::SpatialPoints`", containing the sampling locations.

### Extends

Class "`SamplingPatternRandom`", directly. Class "`SamplingPattern`", by class "`SamplingPatternRandom`", distance 2.

### Methods

- estimate** signature(statistic = "SamplingVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the sampling variance. See "`SamplingVariance`" for more details.
- estimate** signature(statistic = "SpatialCumulativeDistributionFunction", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial cumulative distribution function (SCDF). See "`SamplingPatternRandomSamplingUnits`" for more details.
- estimate** signature(statistic = "SpatialMean", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial mean. See "`SpatialMean`" for more details.

**estimate** signature(statistic = "SpatialVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial variance. See "[SpatialVariance](#)" for more details.

**estimate** signature(statistic = "StandardError", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the standard error of the spatial mean. See "[StandardError](#)" for more details.

**estimate** signature(statistic = "character", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates statistic, *i.e.*, "spatial mean", "spatial variance", "sampling variance", "standard error", SCDF.

### Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

SamplingVariance-class

*Class "SamplingVariance"*

---

### Description

The sampling variance is estimated by means of Equation 7.14 in *de Gruijter et al., (2006)*.

### Objects from the Class

Objects can be created by calls of the form `new("SamplingVariance", ...)`.

### Slots

**description:** Object of class "character" A description op the statistic.

### Extends

Class "[Statistic](#)", directly.

### Methods

**estimate** signature(statistic = "SamplingVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the sampling variance, given a stratification, a sampling pattern and data.

**estimate** signature(statistic = "SamplingVariance", stratification = "CompactStratificationEqualArea", samplingPattern = "SamplingPatternRandomComposite", data = "data.frame"): estimates the sampling variance, given a stratification, a sampling pattern and data.

### Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

## References

de Gruijter, J. J., Brus, D. J., Bierkens, M. F. P., and Knotters, M. (2006) *Sampling for Natural Resource Monitoring* Berlin: Springer-Verlag.

---

SpatialCumulativeDistributionFunction-class

Class "SpatialCumulativeDistributionFunction"

---

## Description

The spatial cumulative distribution function (SCDF) is estimated by applying Equation 7.13 in *de Gruijter et al., (2006)* to indicator transformations of the data. See also page 83 of *de Gruijter et al., (2006)*.

## Objects from the Class

Objects can be created by calls of the form `new("SpatialCumulativeDistributionFunction", ...)`.

## Slots

**description:** Object of class "character" A description op the statistic.

## Extends

Class "[Statistic](#)", directly.

## Methods

**estimate** signature(statistic = "SpatialCumulativeDistributionFunction", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial cumulative distribution function (SCDF), given a stratification, a sampling pattern and data.

## Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

## References

de Gruijter, J. J., Brus, D. J., Bierkens, M. F. P., and Knotters, M. (2006) *Sampling for Natural Resource Monitoring* Berlin: Springer-Verlag.

---

|                   |                     |
|-------------------|---------------------|
| SpatialMean-class | Class "SpatialMean" |
|-------------------|---------------------|

---

## Description

The spatial mean is estimated by means of Equation 7.13 in *de Gruijter et al., (2006)*.

## Objects from the Class

Objects can be created by calls of the form `new("SpatialMean", ...)`.

## Slots

**description:** Object of class "character" A description op the statistic.

## Extends

Class "[Statistic](#)", directly.

## Methods

**estimate** signature(statistic = "SpatialMean", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial mean, given a stratification, a sampling pattern and data.

**estimate** signature(statistic = "SpatialMean", stratification = "CompactStratificationEqualArea", samplingPattern = "SamplingPatternRandomComposite", data = "data.frame"): estimates the spatial mean, given a stratification, a sampling pattern and data.

## Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

## References

de Gruijter, J. J., Brus, D. J., Bierkens, M. F. P., and Kotters, M. (2006) *Sampling for Natural Resource Monitoring* Berlin: Springer-Verlag.

---

SpatialVariance-class    *Class "SpatialVariance"*

---

### Description

The spatial variance is estimated by means of Equation 7.16 in *de Gruijter et al., (2006)*.

### Objects from the Class

Objects can be created by calls of the form `new("SpatialVariance", ...)`.

### Slots

**description:** Object of class "character" A description op the statistic.

### Extends

Class "**Statistic**", directly.

### Methods

**estimate** signature(statistic = "SpatialVariance", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the spatial variance, given a stratification, a sampling pattern and data.

### Author(s)

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

### References

de Gruijter, J. J., Brus, D. J., Bierkens, M. F. P., and Kotters, M. (2006) *Sampling for Natural Resource Monitoring* Berlin: Springer-Verlag.

---

spsample-methods            *Spatial Sampling of Compact Strata*

---

### Description

Methods for sampling in compact strata.

## Methods

**x = "CompactStratification", n = "missing", type = "missing"** samples the centroids of each stratum.

**x = "CompactStratification", n = "numeric", type = "missing"** stratified simple random sampling with  $n$  samples per stratum.

**x = "CompactStratificationEqualArea", n = "numeric", type = "character"** if type = "composite", stratified simple random sampling of  $n$  composites.

**x = "CompactStratificationPriorPoints", n = "missing", type = "missing"** spatial infill sampling

## See Also

[stratify](#) for stratification, [spsample](#) for other types of spatial sampling, and [estimate](#) for inference.

## Examples

```
# Note: the example below requires the 'sf'-package.
if (require(sf)) {

  # read a vector representation of the `Farmsum` field
  shpFarmsum <- as(st_read(
    dsn = system.file("maps", package = "spcosa"),
    layer = "farmsum"), "Spatial")

  # stratify `Farmsum` into 50 strata
  # NB: increase argument 'nTry' to get better results
  set.seed(314)
  myStratification <- stratify(shpFarmsum, nStrata = 50, nTry = 1)

  # sample two sampling units per stratum
  mySamplingPattern <- spsample(myStratification, n = 2)

  # plot the resulting sampling pattern on
  # top of the stratification
  plot(myStratification, mySamplingPattern)

}
```

---

|                     |                       |
|---------------------|-----------------------|
| StandardError-class | Class "StandardError" |
|---------------------|-----------------------|

---

## Description

The standard error is estimated by means of the square root of Equation 7.14 in *de Gruijter et al., (2006)*.

## Objects from the Class

Objects can be created by calls of the form `new("StandardError", ...)`.

**Slots**

**description:** Object of class "character" A description op the statistic.

**Extends**

Class "[SamplingVariance](#)", directly. Class "[Statistic](#)", by class "SamplingVariance", distance 2.

**Methods**

**estimate** signature(statistic = "StandardError", stratification = "CompactStratification", samplingPattern = "SamplingPatternRandomSamplingUnits", data = "data.frame"): estimates the standard error, given a stratification, a sampling pattern and data.

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

**References**

de Gruijter, J. J., Brus, D. J., Bierkens, M. F. P., and Kotters, M. (2006) *Sampling for Natural Resource Monitoring* Berlin: Springer-Verlag.

---

Statistic-class

Class "Statistic"

---

**Description**

A superclass (ancestor class) for statistics to estimate.

**Objects from the Class**

A virtual Class: No objects may be created from it.

**Slots**

**description:** A description op the statistic

**Methods**

**show** signature(object = "Statistic"): prints the statistic

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

---

Stratification-class    *Class "Stratification"*


---

**Description**

Virtual class to store a spatial stratification.

**Objects from the Class**

A virtual Class: No objects may be created from it.

**Methods**

**show** signature(object = "Stratification"): a method for printing objects of class Stratification

**Author(s)**

Dennis J. J. Walvoort <dennis.walvoort@wur.nl>, D.J. Brus, J.J. de Gruijter

**Examples**

```
showClass("Stratification")
```

---

stratify-methods    *Stratification*


---

**Description**

Methods for partitioning a spatial object into compact strata by means of  $k$ -means. The objective function to minimize is the mean squared shortest distance (MSSD). Optionally, the strata may be forced to be of equal size. This facilitates field work in case of stratified simple random sampling for composites. Another option is spatial infill sampling, a variant of spatial coverage sampling where existing sampling points are taken into account. Use nTry > 1, to reduce the risk of ending up in an unfavorable local optimum. Better results will generally be obtained by increasing the ratio nGridCells/nStrata and by increasing nTry.

**Usage**

```
## S4 method for signature 'SpatialPixels'
stratify(object, nStrata, priorPoints = NULL, maxIterations = 1000, nTry = 1,
  equalArea = FALSE, verbose = getOption("verbose"))
## S4 method for signature 'SpatialGrid'
stratify(object, nStrata, priorPoints = NULL, maxIterations = 1000, nTry = 1,
  equalArea = FALSE, verbose = getOption("verbose"))
## S4 method for signature 'SpatialPolygons'
stratify(object, nStrata, priorPoints = NULL, maxIterations = 1000, nTry = 1,
  nGridCells = 2500, cellSize, equalArea = FALSE, verbose = getOption("verbose"))
```

## Arguments

|               |                                                                                                                                                                                                                                           |
|---------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| object        | an object of class " <code>sp::SpatialPixels</code> ", " <code>sp::SpatialGrid</code> " or " <code>sp::SpatialPolygons</code> "                                                                                                           |
| nStrata       | number of strata ( <code>nStrata &gt;= 1</code> ).                                                                                                                                                                                        |
| priorPoints   | object of class " <code>sp::SpatialPoints</code> ", containing the prior (i.e., existing) points                                                                                                                                          |
| maxIterations | maximum number of iterations.                                                                                                                                                                                                             |
| nTry          | the stratify method will try <code>nTry</code> initial configurations and will keep the best solution in order to reduce the risk of ending up with an unfavorable solution.                                                              |
| nGridCells    | in case object is an instance of class " <code>sp::SpatialPolygons</code> ", the approximate number of grid cells to be used for discretizing the vector map in object.                                                                   |
| cellSize      | in case object is an instance of class " <code>sp::SpatialPolygons</code> ", the cell size to be used for discretizing the vector map in object. Note that <code>cellsize</code> takes precedence over argument <code>nGridCells</code> . |
| equalArea     | If FALSE the algorithm results in compact strata. If TRUE, the algorithm results in compact strata of equal size.                                                                                                                         |
| verbose       | if TRUE, progress information and intermediate results will be printed to the output device.                                                                                                                                              |

## Methods

**object = "SpatialPixels"** Stratify a raster representation of the study area.

**object = "SpatialPolygons"** Stratify a vector representation of the study area.

## Note

When the projection attribute of a map is set to EPSG:4326 (lat/lon), **great circle distances** will be used for stratification. Otherwise, **Euclidean distances** will be used.

## References

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## See Also

`spsample` for sampling, and `estimate` for inference.

**Examples**

```
# Note: the example below requires the 'sf'-package
if (require(sf)) {

  # read a vector representation of the `Farmsum` field
  shpFarmsum <- as(st_read(
    dsn = system.file("maps", package = "spcosa"),
    layer = "farmsum"), "Spatial")

  # stratify `Farmsum` into 50 strata
  # NB: increase argument 'nTry' to get better results
  set.seed(314)
  myStratification <- stratify(shpFarmsum, nStrata = 50, nTry = 1)

  # plot the resulting stratification
  plot(myStratification)

}
```

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