Package 'spup'

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Type Package

Title Spatial Uncertainty Propagation Analysis

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Description

Uncertainty propagation analysis in spatial environmental modelling following methodology described in Heuvelink et al. (2007) <doi:10.1080/13658810601063951> and Brown and Heuvelink (2007) <doi:10.1016/j.cageo.2006.06.015>. The package provides functions

for examining the uncertainty propagation starting from input data and model parameters, via the environmental model onto model outputs. The functions include uncertainty model specification,

stochastic simulation and propagation of uncertainty using Monte Carlo (MC) techniques. Uncertain variables are described by probability distributions. Both numerical and categorical data types are handled.

Spatial auto-correlation within an attribute and cross-

correlation between attributes is accommodated for.

The MC realizations may be used as input to the environmental models called from R, or externally.

Depends R (>= 4.3.0)

Imports graphics, gstat, magrittr, methods, mvtnorm, purrr, raster, whisker

Suggests dplyr, GGally, gridExtra, knitr, png, readr, sp, testthat, sf

License GPL (>= 3)

LazyData true

VignetteBuilder knitr

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NeedsCompilation no

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check_distribution

Simple check if distribution provided in defineUM() belongs to a list of

supported distributions.

Description

Simple check if distribution provided in defineUM() belongs to a list of supported distributions.

Usage

```
check_distribution(object)
```

Arguments

object

Any R object. In defineUM() it is used to examine if selected distribution is in supported list of ditributions.

Value

TRUE or FALSE.

Author(s)

Kasia Sawicka

check_if_Spatial

Simple check if class of provided object is Spatial

Description

Simple check if class of provided object is Spatial

Usage

```
check_if_Spatial(object)
```

Arguments

object

Any R object. In defineUM() it is used to examine what type of data are delt with.

Value

TRUE or FALSE.

Author(s)

Kasia Sawicka

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crm2vgm

Converting a spatial correlogram model to a variogram model

Description

Used internally in genSample() in case of sampling by unconditional gaussian simulation.

Usage

```
crm2vgm(crm)
```

Arguments

crm

object of a class "SpatialCorrelogramModel", output of makeCRM().

Details

To assure equalfinality the sill parameter for spatially correlated random residuals is fixed and standardized to 1.

Value

An object of a class "variogramModel" extending data.frame.

Author(s)

Kasia Sawicka, Gerard Heuvelink

defineMUM

Define Mulivariate Uncertainty Model

Description

Function that uses output of defineUM() to define joint probability distribution for uncertain cross-correlated variables.

Usage

```
defineMUM(UMlist, cormatrix, ...)
```

Arguments

UMlist a list of uncertain objects creaded in defineUM().

cormatrix matrix of cross-correlations.

... additional parameters.

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Details

The cormatrix is a square matrix of correlations, dimensionally equal to the number of objects, symmetrical (transposed must be the same as original), diagonal must all be 1 all values must be <-1, +1>) and all eigenvalues must be >0. The marginal Um objects must have provided id.

Value

Object of a class "JointNumericSpatial" or "JointScalar".

Author(s)

Kasia Sawicka, Gerard Heuvelink

Examples

```
set.seed(12345)
data(OC, OC_sd, TN, TN_sd)
OC_{crm} \leftarrow makeCRM(acf0 = 0.6, range = 5000, model = "Sph")
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
class(OC UM)
TN_crm <- makeCRM(acf0 = 0.4, range = 5000, model = "Sph")
TN_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(TN, TN_sd), crm = TN_crm, id = "TN")
class(TN_UM)
soil_prop <- list(OC_UM,TN_UM)</pre>
mySpatialMUM <- defineMUM(soil_prop, matrix(c(1,0.7,0.7,1), nrow=2, ncol=2))</pre>
class(mySpatialMUM)
# scalar
scalarUM <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                      distr_param = c(1, 2), id="Var1")
scalarUM2 <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                       distr_param = c(3, 2), id="Var2")
scalarUM3 <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                       distr_param = c(10, 2.5), id="Var3")
myMUM <- defineMUM(UMlist = list(scalarUM, scalarUM2, scalarUM3),</pre>
               matrix(c(1,0.7,0.2,0.7,1,0.5,0.2,0.5,1), nrow = 3, ncol = 3))
class(myMUM)
```

defineUM

Define an uncertainty model for a single variable

Description

Function that allows to define marginal uncertainty distributions for model inputs and subsequent Monte Carlo analysis.

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Usage

```
defineUM(
  uncertain = TRUE,
  distribution = NULL,
  distr_param = NULL,
  crm = NULL,
  categories = NULL,
  cat_prob = NULL,
  id = NULL,
  ...
)
```

Arguments

uncertain "TRUE" or "FALSE", determines if specification of Uncertainty Model (UM)

is needed. Currently not in use, but provided for furture implementation of

contributions analysis.

distribution a string that specifies which distribution to sample from. Only in use for contin-

uos or discrete numerical variables. See Details for a list of supported distribu-

tions.

distr_param a vector or a list with distribution parameters. For example, for the normal

distribution in case of a spatial variable this must be a map of means and a map of standard deviations. Only in use for continuous or discrete numerical

variables.

crm a correlogram model, object of a class "SpatialCorrelogramModel", output of

makecormodel(). Can only be specified for numerical variables.

categories a vector of categories. Only in use for categorical (e.g. saved as character) or

discrete numerical variables.

cat_prob spatial data frame or raster stack; a list of probabilities for the vector of cate-

gories. Number of columns in the data frame cannot be smaller than number of categories. Only in use for categorical (e.g. saved as character) or discrete

numerical variables.

id identifier of the variable; only in use if the UM defined here is to be used in

defineUM() to construct a joint UM for numerical variables.

... additional parameters.

Details

If the uncertain object is a spatial object, the distribution parameters or the probabilities for categories must be provided by means of maps, for example if a spatial variable has a normal distribution, a map of means and standard deviations must be provided. If crm is provided and spatial correlation between the residuals is assumed only the normal distribution for residuals is allowed.

If no spatial correlations between residuals is assumed, allowed distributions for marginal uncertainty models are listed in Table 1.

Table 1 Parametric probability models allowed in defineUM(). For more details look up ?distribution.

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Distribution	Syntax	Parameters
beta	"beta"	shape1, shape2, ncp
binomial	"binom"	size, prob
Cauchy	"cauchy"	location, scale
chi-squared	"chisq"	df, ncp
exponential	"exp"	rate
gamma	"gamma"	shape, rate
geometric	"geom"	prob
hypergeometric	"hyper"	m, n, k
log-normal	"lnorm"	meanlog, sdlog
negative binomial	"nbinom"	size, prob, mu
normal	"norm"	mean, sd
Poisson	"pois"	lambda
Student's	"t"	df, ncp
uniform	"unif"	min, max
Weibull	"weibull"	shape, scale

Value

Object of a class "MarginalXxx" that includes all necessary information for creating realizations of the uncertain variable. If provided arguments are: type of the distribution and corresponding parameters, and corresponding parameters are spatial objects - an object of class "MarginalNumericSpatial". If provided arguments are: type of the distribution and corresponding parameters, and corresponding parameters are non-spatial objects - an object of class "MarginalNumericSpatial". If provided arguments are: categories and probabilities, and probabilities are saved in a spatial object - an object of class "MarginalCategoricalSpatial". If provided arguments are: categories and probabilities, and probabilities are saved in a non-spatial object - an object of class "MarginalCategoricalDataFrame".

Author(s)

Kasia Sawicka, Gerard Heuvelink

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```
class(scalarUM)

# define uncertainty model for two spatial cross-correlated variables
data(OC, OC_sd, TN, TN_sd)

OC_crm <- makeCRM(acf0 = 0.6, range = 1000, model = "Sph")
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
class(OC_UM)

TN_crm <- makeCRM(acf0 = 0.4, range = 1000, model = "Sph")
TN_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(TN, TN_sd), crm = TN_crm, id = "TN")
class(TN_UM)</pre>
```

dem30m

Digital Elevation Model of Zlatibor region in Serbia.

Description

A dataset containing the mean an example Digital Elevation Model.

Usage

data(dem30m)

Format

a SpatialGridDataFrame with 15000 rows and 1 variable:

Elevation Digital Elevation Model, in meters

Source

The Zlatibor dataset was kindly provided by Prof. Branislav Bajat from the University of Belgrade, Serbia.

dem30m_sd

Standard deviation of Digital Elevation Model of Zlatibor region in Serbia.

Description

A dataset containing the sd of an example Digital Elevation Model. It was calculated from dem30m using terrain funtion from raster package (opt = 'roughness').

Usage

```
data(dem30m_sd)
```

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Format

a SpatialGridDataFrame with 15000 rows and 1 variable:

Elevation_sd Standard deviation of Digital Elevation Model, in meters

Source

The Zlatibor dataset was kindly provided by Prof. Branislav Bajat from the University of Belgrade, Serbia.

distribution_sampling Sampling from a given distribution

Description

Sampling from a given distribution

Usage

distribution_sampling(n, distribution, parameters)

Arguments

n number of sampling runs

distribution A string describing selected distribution. The same as a part of the string fol-

lowing the "r" in each random variate generation function in ?distributions.

parameters vector of parameters to pass to the random variate generation function after num-

ber of observations.

Value

Sample of random deviates.

Author(s)

Kasia Sawicka

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distribution_sampling_raster

Sampling from a given distribution

Description

Only used in samplemethod "randomSampling" for MarginalNumericSpatial.

Usage

```
distribution_sampling_raster(distribution, parameters_stack)
```

Arguments

distribution

A string describing selected distribution. The same as a part of the string following the "r" in each random variate generation function in ?distributions.

parameters_stack

parameters to pass to the random variate generation function after number of observations.

Value

Sample of random deviates.

Author(s)

Kasia Sawicka

executable

Wrapper function for calling executables in R

Description

Wrapper function for calling executables in R

Usage

```
executable(filename)
```

Arguments

filename

a path with a name to the .exe file to be wrapped here.

Value

Executable output.

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Author(s)

Dennis Walvoort

find_strata

Sampling from a given distribution

Description

Sampling from a given distribution

Usage

```
find_strata(p, distribution, parameters, ...)
```

Arguments

p a vector of quantiles.

distribution a string indicating which distribution to sample from. See ?defineUM() for De-

tails.

parameters parameters to pass to the appropriate sampling funtion, e.g. mean and sd for

"norm" distribution.

... additional parameters.

Value

Strata of the distribution defined by given quantiles.

Author(s)

Kasia Sawicka, Stefan van Dam

genSample	Methods for generating Monte Carlo realizations from uncertain in-
	puts.

Description

Methods for classes: "MarginalNumericSpatial", "MarginalScalar", "MarginalCategoricalSpatial", "JointNumericSpatial", "JointScalar". Function that runs Monte Carlo simulations depending on the type of uncertain object. Facilitates unconditional Gaussian simulation of errors for spatially auto-correlated residuals, as well as random and stratified random sampling if no spatial auto-correlation is included.

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Usage

```
genSample(
   UMobject,
   n,
   samplemethod,
   p = 0,
   asList = TRUE,
   debug.level = 1,
   ...
)
```

Arguments

UMobject an uncertain object to sample from, output of defineUM() or defineMUM(). integer, number of Monte Carlo realizations. a string, "ugs", "randomSampling", "stratifiedSampling", "lhs" ("lhs" currently samplemethod not in use). A vector of quantiles. Optional. Only required if sample method is "stratifiedp Sampling" or "lhs". logical. If asList = TRUE returns list of all samples as a list. If asList = FALSE asList returns samples in a format of distribution parameters in UMobject. debug.level integer; set gstat internal debug level, see below for useful values. If set to -1 (or any negative value), a progress counter is printed. Additional parameters that may be passed, e.g. in the "ugs" method. See exam-

Details

Sampling methods:

ples.

"ugs" Unconditional Gaussian simulation of spatially auto-correlated and/or cross-correlated errors.

"randomSampling" Sampling multivariate distribution using eigenvalue decomposition (based on 'mvtnorm' package).

"stratifiedSampling" Number of samples (n) must be dividable by the number of quantiles to assure that each quantile is evenly represented.

"**!hs**" Not implemented yet. Sampling method for at least two uncertain inputs. The uncertain object is then a list of two or more. It uses a stratified sampling method to generate inputs for the latin hypercube algorithm.

NOTE. Version 1.3-1 includes bug fixing related to derivation of cross-correlation matrix for multivariate uncertainty propagation analysis.

Value

A Monte Carlo sample of the variables of interest. If asList = TRUE returns list of all samples as lists.

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Author(s)

Kasia Sawicka, Stefan van Dam, Gerard Heuvelink

```
set.seed(12345)
### ------ "MarginalNumericSpatial" ------
# load data
data(dem30m, dem30m_sd)
# "ugs" method example
dem_crm <- makeCRM(acf0 = 0.78, range = 321, model = "Exp")
demUM <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                   distr_param = c(dem30m, dem30m_sd), crm = dem_crm)
# toy example
dem_sample <- genSample(UMobject = demUM, n = 2, samplemethod = "ugs", nmax = 4, asList = FALSE)</pre>
str(dem_sample)
# any meaningful Monte Carlo analysis should have normally much larger number of runs
## Not run:
dem_sample <- genSample(UMobject = demUM, n = 100, samplemethod = "ugs", nmax = 20, asList = FALSE)</pre>
str(dem_sample)
## End(Not run)
# "startifiedSampling" method example
demUM <- defineUM(uncertain = TRUE, distribution = "norm", distr_param = c(dem30m, dem30m_sd))</pre>
# tov example
dem_sample <- genSample(UMobject = demUM, n = 5, samplemethod = "stratifiedSampling", p = 0:5/5)</pre>
# any meaningful Monte Carlo analysis should have normally much larger number of runs
## Not run:
dem_sample <- genSample(UMobject = demUM, n = 100, samplemethod = "stratifiedSampling", p = 0:5/5)</pre>
str(dem_sample)
## End(Not run)
# Examples with rasters
# (raster with auto-correlation)
data(OC, OC_sd)
OC_crm <- makeCRM(acf0 = 0.6, range = 1000, model = "Sph")
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
class(OC_UM)
# toy example
some_sample <- genSample(OC_UM, n = 2, "ugs", n = 4)
# any meaningful Monte Carlo analysis should have normally much larger number of runs
## Not run:
some_sample <- genSample(OC_UM, n = 50, "ugs", nmax = 24)</pre>
some_sample
```

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```
## End(Not run)
### ------ "MarginalScalar" ------
# example with normal distribution
scalarUM <- defineUM(uncertain = TRUE, distribution = "norm", distr_param = c(10, 1))</pre>
scalar_sample <- genSample(scalarUM, n = 10, samplemethod = "randomSampling")</pre>
### ----- "MarginalCategoricalSpatial" -----
# load data
data(woon)
woonUM <- defineUM(TRUE, categories = c(1,2,3), cat_prob = woon[, c(4:6)])
woon_sample <- genSample(woonUM, 10, asList = FALSE)</pre>
class(woon_sample)
str(woon_sample@data)
### ------ "JointNumericSpatial" -----
# load data
data(OC, OC_sd, TN, TN_sd)
# define marginal UMs
OC_{crm} \leftarrow makeCRM(acf0 = 0.6, range = 1000, model = "Sph")
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
TN_crm \leftarrow makeCRM(acf0 = 0.4, range = 1000, model = "Sph")
TN_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(TN, TN_sd), crm = TN_crm, id = "TN")
# define joint UM
soil_prop <- list(OC_UM, TN_UM)</pre>
mySpatialMUM <- defineMUM(soil_prop, matrix(c(1,0.7,0.7,1), nrow=2, ncol=2))</pre>
class(mySpatialMUM)
# sample - "ugs" method
# toy example
my_cross_sample <- genSample(mySpatialMUM, n = 2, "ugs", nmax = 4, asList = TRUE)</pre>
class(my_cross_sample)
# any meaningful Monte Carlo analysis should have normally much larger number of runs
my_cross_sample <- genSample(mySpatialMUM, n = 100, "ugs", nmax = 24, asList = TRUE)
class(my_cross_sample)
## End(Not run)
### ------ "JointScalar" ------
scalarUM <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                    distr_param = c(1, 2), id="Var1")
scalarUM2 <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                     distr_param = c(3, 2), id="Var2")
scalarUM3 <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                     distr_param = c(10, 2.5), id="Var3")
myMUM <- defineMUM(UMlist = list(scalarUM, scalarUM2, scalarUM3),</pre>
```

```
matrix(c(1,0.7,0.2,0.7,1,0.5,0.2,0.5,1),\ nrow = 3,\ ncol = 3)) my\_sample <- \ genSample(myMUM,\ n = 5,\ samplemethod = "randomSampling",\ asList = FALSE) my\_sample
```

genSample.JointNumericSpatial

Generating Monte Carlo sample from a list of uncertain objects that are cross-correlated.

Description

Uncertain objects are described by joint PDF or a list from independent objects. Sampling can be done via three different sampling methods:

Usage

```
## $3 method for class 'JointNumericSpatial'
genSample(
   UMobject,
   n,
   samplemethod,
   p = 0,
   asList = TRUE,
   debug.level = 1,
   ...
)
```

Arguments

UMobject	object of a class JointNumericSpatial. Output of defineMUM().
n	Integer. Number of Monte Carlo realizations.
samplemethod	"ugs" for spatially cross-correlated errors, "randomSampling" for joint PDF of non-spatial variables, "lhs" if no correlation of errors is considered.
p	A vector of quantiles. Optional. Only required if sample method is "lhs".
asList	Logical. If TRUE return sample in a form of a list, if FALSE returnsample in a format of distribution parameters.
debug.level	integer; set gstat internal debug level, see below for useful values. If set to -1 (or any negative value), a progress counter is printed.
•••	Additional parameters that may be passed, e.g. in the "ugs" method. See examples.

Details

- "ugs" Unconditional gaussian simulation of spatially cross-correlated errors.
- "randomSampling" Sampling multivariate distribution using eigenvalue decomposition (based on 'mvtnorm' package).
- "**!hs**" Not implemented yet. Sampling method for at least two uncertain inputs. The uncertain object is then a list of two or more. It uses startified sampling method to generate the inputs for the latin hypercude algorithm, hence number of samples (n) must be dividable by the number of quantiles to assure each quantile is evenly represented.

NOTE. Version 1.3-1 includes bug fixing related to derivation of cross-correlation matrix for multivariate uncertainty propagation analysis.

Value

A Monte Carlo sample of the variables of interest. If asList = TRUE returns list of all samples as lists.

Author(s)

Kasia Sawicka, Stefan van Dam, Gerard Heuvelink

```
set.seed(12345)
# "ugs" method example
# load data
data(OC, OC_sd, TN, TN_sd)
# Test for SpatialGridDataFrames
OC <- as(OC, 'SpatialGridDataFrame')</pre>
TN <- as(TN, 'SpatialGridDataFrame')
OC_sd <- as(OC_sd, 'SpatialGridDataFrame')</pre>
TN_sd <- as(TN_sd, 'SpatialGridDataFrame')</pre>
# define marginal UMs
OC_crm <- makeCRM(acf0 = 0.6, range = 5000, model = "Sph")
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
TN_crm <- makeCRM(acf0 = 0.4, range = 5000, model = "Sph")
TN_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(TN, TN_sd), crm = TN_crm, id = "TN")
# define joint UM
soil_prop <- list(OC_UM, TN_UM)</pre>
mySpatialMUM <- defineMUM(soil_prop, matrix(c(1,0.7,0.7,1), nrow=2, ncol=2))</pre>
# sample - "ugs" method
# toy example
my_cross_sample <- genSample(mySpatialMUM, n = 3, "ugs", nmax = 24, asList = TRUE)
class(my_cross_sample)
## Not run:
my_cross_sample <- genSample(mySpatialMUM, n = 50, "ugs", nmax = 24, asList = TRUE)
```

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```
class(my_cross_sample)
## End(Not run)
```

```
genSample.JointScalar Generating sample from cross-correlated variables described by a scalar.
```

Description

Generating sample from cross-correlated variables described by a scalar.

Usage

```
## S3 method for class 'JointScalar'
genSample(UMobject, n, samplemethod, p = 0, asList = TRUE, ...)
```

Arguments

UMobject of a class JointScalar created using defineMUM.R

n integer; number of Monte Carlo runs

samplemethod "randomSampling" or "lhs".

p a vector of quantiles. Optional. Only required if sample method is "lhs".

asList logical. If asList = TRUE returns list of all samples as a list. If asList = FALSE

returns samples in a format of distribution parameters in UMobject.

... Additional parameters.

Value

Monte Carlo sample of cross-correlated scalar variables.

Author(s)

Kasia Sawicka, Gerard Heuvelink

```
\label{eq:distr_param} \begin{array}{l} \text{distr_param = c(10, 2.5), id="Var3")} \\ \text{myMUM <- defineMUM(UMlist = list(scalarUM, scalarUM2, scalarUM3),} \\ \text{matrix}(c(1,0.7,0.2,0.7,1,0.5,0.2,0.5,1), nrow = 3, ncol = 3)) \\ \text{my\_sample <- genSample}(\text{myMUM, n = 10, samplemethod = "randomSampling", asList = FALSE)} \\ \text{my\_sample} \end{array}
```

 ${\tt genSample.MarginalCategoricalSpatial}$

Generating Monte Carlo sample from an uncertain object of a class 'MarginalCategoricalSpatial'

Description

Generating Monte Carlo sample from an uncertain object of a class 'MarginalCategoricalSpatial'

Usage

```
## S3 method for class 'MarginalCategoricalSpatial'
genSample(UMobject, n, samplemethod, p = 0, asList = TRUE, ...)
```

Arguments

UMobject uncertain object defined using defineUM().

n Integer. Number of Monte Carlo realizations.

samplemethod not in use for categorical variables.

p not in use for categorical variables.

asList logical. If asList = TRUE returns list of all samples as a list. If asList = FALSE

returns samples in a format of distribution parameters in UMobject.

... additional parameters

Value

A Monte Carlo sample of a categorical spatial variable.

Author(s)

Kasia Sawicka

```
set.seed(12345)
# load data
data(woon)
woonUM <- defineUM(TRUE, categories = c(1,2,3), cat_prob = woon[, c(4:6)])
woon_sample <- genSample(woonUM, 10, asList = FALSE)</pre>
```

```
class(woon_sample)
str(woon_sample@data)
woon_sample <- genSample(woonUM, 10)</pre>
class(woon_sample)
# analyse probability of having snow
# load data
data(dem30m, dem30m_sd)
# generate dummy probabilities for categories "snow" and "no snow"
dem30m$snow_prob <- NA
dem30m$snow_prob[dem30m$Elevation > 1000] <- 0.75</pre>
dem30m$snow_prob[dem30m$Elevation <= 1000] <- 0.25</pre>
dem30m$no_snow_prob <- 1 - dem30m$snow_prob</pre>
summary(dem30m@data)
snowUM <- defineUM(uncertain = TRUE, categories = c("snow", "no snow"), cat_prob = dem30m[2:3])</pre>
class(snowUM)
snow_sample <- genSample(snowUM, 10, asList = FALSE)</pre>
head(snow_sample@data)
```

genSample.MarginalNumericSpatial

Generating Monte Carlo sample from an uncertain object of a class 'MarginalNumericSpatial'

Description

Function that runs Monte Carlo simulations depending on the type of uncertain object. Facilitates unconditional gausian simulation of errors for spatially auto-correlated residulas, and random sampling, stratified sampling if no spatial auto-correlation is included.

Usage

```
## S3 method for class 'MarginalNumericSpatial'
genSample(
   UMobject,
   n,
   samplemethod,
   p = 0,
   asList = TRUE,
   debug.level = 1,
   ...
)
```

Arguments

UMobject

uncertain object defined using defineUM().

n	Integer. Number of Monte Carlo realizations.
samplemethod	"ugs" for spatially correlated errors, "randomSampling" and "stratifiedSampling" if no spatial correlation of errors is considered.
p	A vector of quantiles. Optional. Only required if sample method is "stratified-Sampling" or "lhs".
asList	logical. If asList = TRUE returns list of all samples as a list. If asList = FALSE returns samples in a format of distribution parameters in UMobject.
debug.level	integer; set gstat internal debug level, see below for useful values. If set to -1 (or any negative value), a progress counter is printed.
	Additional parameters that may be passed, e.g. in the "ugs" method. See examples.

Details

"ugs" Unconditional gaussian simulation of spatially auto-correlated errors.

"stratifiedSampling" Number of samples (n) must be dividable by the number of quantiles to assure each quantile is evenly represented.

"**lhs**" Sampling method for at least two uncertain inputs. The uncertain.object is then a list of two or more. It uses startified sampling method to generate the inputs for the latin hypercude algorithm, hence the p is restricted as above.

Value

A Monte Carlo sample of uncertain input of a class of distribution parameters.

Author(s)

Kasia Sawicka, Stefan van Dam, Gerard Heuvelink

```
# "startifiedSampling" method example
demUM <- defineUM(uncertain = TRUE, distribution = "norm", distr_param = c(dem30m, dem30m_sd))</pre>
# toy example
dem_sample <- genSample(UMobject = demUM, n = 5, samplemethod = "stratifiedSampling", p = 0:5/5)
## Not run:
dem_sample <- genSample(UMobject = demUM, n = 50, samplemethod = "stratifiedSampling", p = 0:5/5)
str(dem_sample)
## End(Not run)
# Examples with rasters
# (raster with auto-correlation)
data(OC, OC_sd)
OC_crm <- makeCRM(acf0 = 0.6, range = 1000, model = "Sph")
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
class(OC_UM)
# toy example
some_sample <- genSample(OC_UM, n = 3, "ugs", nmax=6)</pre>
some_sample
## Not run:
some_sample <- genSample(OC_UM, n = 50, "ugs", nmax=20)</pre>
some_sample
## End(Not run)
```

genSample.MarginalScalar

Generating Monte Carlo sample from an uncertain object of a class 'MarginalScalar'

Description

Function that runs Monte Carlo simulations for MarginalScalar class objects.

Usage

```
## S3 method for class 'MarginalScalar'
genSample(UMobject, n, samplemethod, p = 0, asList = TRUE, ...)
```

Arguments

UMobject uncertain object defined using defineUM().

n Integer. Number of Monte Carlo realizations.
samplemethod "randomSampling" or "stratifiedSampling".

p A vector of quantiles. Optional. Only required if sample method is "stratified-Sampling".

22 list_depth

asList logical. If asList = TRUE returns list of all samples as a list. If asList = FALSE returns samples in a format of distribution parameters in UMobject.

Additional parameters.

Details

"stratifiedSampling" Number of samples (n) must be dividable by the number of quantiles to assure each quantile is evenly represented.

Value

A Monte Carlo sample of uncertain input of a class of distribution parameters.

Author(s)

Kasia Sawicka

Examples

```
set.seed(12345)
# Example 1
scalarUM <- defineUM(uncertain = TRUE, distribution = "norm", distr_param = c(10, 1))
scalar_sample <- genSample(scalarUM, n = 10, samplemethod = "randomSampling")

# Example 2
scalarUM <- defineUM(uncertain = TRUE, distribution = "beta", distr_param = c(10, 1, 2))
scalar_sample <- genSample(scalarUM, n = 10, samplemethod = "stratifiedSampling", p = 0:5/5)</pre>
```

list_depth

Function to find the level of list nesting

Description

Function to find the level of list nesting

Usage

```
list_depth(List)
```

Arguments

List

an object of class 'list'.

Value

```
an integer; level of list nesting
```

makeCRM 23

Author(s)

Kasia Sawicka

Examples

```
a <- list(1,2)
list_depth(a)

a <- list(list(1, 2), 3)
list_depth(a)</pre>
```

makeCRM

Defining a spatial correlogram model

Description

Function that generates a spatial correlogram model, an object of class "SpatialCorrelogramModel".

Usage

```
makeCRM(
  acf0 = 1,
  range = NA,
  model,
  anis,
  kappa = 0.5,
  add.to,
  covtable,
  Err = 0
)
```

Arguments

acf0	Aurocorrelation function value at distance near 0. Default is 1. Must fall in interval [0,1].
range	Range parameter of the correlogram model component.
model	Model type, e.g. "Exp", "Sph", "Gau", "Mat" that vgm() accepts. See ?gstat::vgm() for more #' details.
anis	Anisotropy parameters. See ?gstat::vgm() for more details.
kappa	Smoothness parameter for the Matern class of variogram models. See ?gstat::vgm() for more $\#$ ' details.
add.to	See ?gstat::vgm() (currently not in use)
covtable	See ?gstat::vgm() (currently not in use)
Err	Numeric. See ?gstat::vgm() for more details.

24 mean_MC_sgdf

Details

For the spatial variables allowed autocorrelation functions are listed in Table 4.1 of the gstat manual. Spatial correlation assumes stationarity, i.e. correlation depends only on the separation distance between points in space. Anisotropy is allowed. No nested models are allowed in the current version.

Value

An object of a class "SpatialCorrelogramModel". This is a list collating provided arguments.

Author(s)

Kasia Sawicka, Gerard Heuvelink

Examples

```
mycormodel <- makeCRM(acf0 = 0.8, range = 300, model = "Exp")
str(mycormodel)</pre>
```

 $mean_MC_sgdf$

mean() function for MC sample saved in a SpatialGridDataFrame

Description

Calculates mean from MC realizations for each location in a map.

Usage

```
mean_MC_sgdf(realizations, ...)
```

Arguments

```
realizations MC sample saved in SpatialGridDataFrame.
... additional parameters.
```

Value

SpatialGridDataFrame; a mean of a MC sample.

Author(s)

Kasia Sawicka

OC 25

Examples

OC.

Soil organic carbon content in a south area (33 x 33km) of lake Alaotra in Madagascar.

Description

A dataset containing the mean of soil OC content from 0-30 cm layer.

Usage

data(OC)

Format

a RasterLayer with dimensions: 134, 135, 18090 (nrow, ncol, ncell), resolution: 250, 250 (x, y).

Source

ISRIC soilgrid information. HENGL, T., MENDES DE JESUS, J., HEUVELINK, G. B. M., RUIPEREZ GONZALEZ, M., KILIBARDA, M., BLAGOTIC, A., SHANGGUAN, W., WRIGHT, M. N., GENG, X., BAUER-MARSCHALLINGER, B., GUEVARA, M. A., VARGAS, R., MACMILLAN, R. A., BATJES, N. H., LEENAARS, J. G. B., RIBEIRO, E., WHEELER, I., MANTEL, S. & KEMPEN, B. 2017. SoilGrids250m: Global gridded soil information based on machine learning. PLOS ONE, 12, e0169748.

OC_sd

Standard deviation of soil organic carbon content in a south area (33 x 33km) of lake Alaotra in Madagascar.

Description

A dataset containing the standard deviation of soil OC content from 0-30 cm layer.

Usage

```
data(OC_sd)
```

Format

a RasterLayer with dimensions: 134, 135, 18090 (nrow, ncol, ncell), resolution: 250, 250 (x, y).

Source

ISRIC soilgrid information. HENGL, T., MENDES DE JESUS, J., HEUVELINK, G. B. M., RUIPEREZ GONZALEZ, M., KILIBARDA, M., BLAGOTIC, A., SHANGGUAN, W., WRIGHT, M. N., GENG, X., BAUER-MARSCHALLINGER, B., GUEVARA, M. A., VARGAS, R., MACMILLAN, R. A., BATJES, N. H., LEENAARS, J. G. B., RIBEIRO, E., WHEELER, I., MANTEL, S. & KEMPEN, B. 2017. SoilGrids250m: Global gridded soil information based on machine learning. PLOS ONE, 12, e0169748.

```
plot.SpatialCorrelogramModel
```

Plots correlogram model

Description

Plots correlogram model

Usage

```
## S3 method for class 'SpatialCorrelogramModel'
plot(
    x,
    distance = 1,
    ylim = c(0, 1),
    xlab = "Distance",
    ylab = "Correlation",
    ...
)
```

print.template 27

Arguments

Χ	Object of class "SpatialCorrelogramModel" as created by makeCRM().
distance	minimum distance between locations (unit should correspond with the unit of the range parameter in $makeCRM()$).
ylim	the y limits of the plot.
xlab	a title for the x axis.
ylab	a title for the y axis.
	additional parameters.

Value

plot of correlogram model

Author(s)

Kasia Sawicka, Gerard Heuvelink

Examples

```
mycormodel <- makeCRM(acf0 = 0.8, range = 300, model = "Exp")
plot(mycormodel, distance = 1)</pre>
```

print.template

Print method for class "template."

Description

Print method for class "template."

Usage

```
## S3 method for class 'template' print(x, ...)
```

Arguments

x Object of class "template".... additional parameters.

Value

Template file content.

Author(s)

Dennis Walvoort

28 propagate

propagate

Propagation function

Description

A function that runs a model repeatedly with Monte Carlo samples of uncertain inputs.

Usage

```
propagate(realizations, model, n, ...)
```

Arguments

realizations a list where each element is a single Monte Carlo realizations if only one pa-

rameter/variable is considered uncertain; a list of such lists if more than one

parameter/variable is considered uncertain.

model model that is written as a function in R.

n number of Monte Carlo Runs.

... any further arguments that the model takes.

Value

Model output Monte Carlo realizations.

Author(s)

Kasia Sawicka

```
set.seed(12345)
## continuous spatial data example with a single variable
# load data
data(dem30m, dem30m_sd)

# Slope model
Slope <- function(DEM, ...) {
   require(raster)
   require(purr)
   demraster <-
        DEM %>%
        raster()
   demraster %>%
        terrain(opt = 'slope', ...) %>%
        as("SpatialGridDataFrame")
}
```

propagate 29

```
# uncertainty propagation
dem_crm <- makeCRM(acf0 = 0.78, range = 321, model = "Exp")</pre>
demUM <- defineUM(uncertain = TRUE, distribution = "norm",</pre>
                    distr_param = c(dem30m, dem30m_sd), crm = dem_crm)
# toy example
dem_sample <- genSample(UMobject = demUM, n = 3, samplemethod = "ugs", nmax = 20)
slope_sample <- propagate(dem_sample, model = Slope, n = 3)</pre>
dem_sample <- genSample(UMobject = demUM, n = 50, samplemethod = "ugs", nmax = 20)
slope_sample <- propagate(dem_sample, model = Slope, n = 50)</pre>
## End(Not run)
## categorical spatial data example
# load data
data(woon)
# tax model
tax <- function(building_Function) {</pre>
 building_Function$tax2pay <- NA</pre>
 building_Function$tax2pay[building_Function$Function == 1] <- 1000</pre>
 building_Function$tax2pay[building_Function$Function == 2] <- 10000</pre>
 building_Function$tax2pay[building_Function$Function == 3] <- 10</pre>
 total_tax <- sum(building_Function$tax2pay)</pre>
 total_tax
}
# uncertainty propagation
woonUM <- defineUM(TRUE, categories = c(1,2,3), cat_prob = woon[, c(4:6)])
woon_sample <- genSample(woonUM, 10)</pre>
class(woon_sample)
tax # the model takes SpatialGridDataFrame with a column called "Function"
for (i in 1:10) names(woon_sample[[i]]) <- "Function"</pre>
tax_uncert <- propagate(realizations = woon_sample, n = 10, model = tax)</pre>
tax_uncert <- unlist(tax_uncert)</pre>
summary(tax_uncert)
## cross-correlated example
# load data
data(OC, OC_sd, TN, TN_sd)
# C/N model
C_N_model_raster <- function(OC, TN) {</pre>
 OC/TN
}
# define marginal UMs
OC_crm <- makeCRM(acf0 = 0.6, range = 1000, model = "Sph")</pre>
OC_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(OC, OC_sd), crm = OC_crm, id = "OC")
TN_crm <- makeCRM(acf0 = 0.4, range = 1000, model = "Sph")</pre>
TN_UM <- defineUM(TRUE, distribution = "norm", distr_param = c(TN, TN_sd), crm = TN_crm, id = "TN")
# define joint UM
```

quantile_MC_sgdf

```
mySpatialMUM <- defineMUM(list(OC_UM, TN_UM), matrix(c(1,0.7,0.7,1), nrow=2, ncol=2))
# sample - "ugs" method
# toy example
my_cross_sample <- genSample(mySpatialMUM, n = 3, "ugs", nmax = 24)
class(my_cross_sample)
# run propagation
CN_sample <- propagate(realizations = my_cross_sample, model = C_N_model_raster, n = 3)
CN_sample
## Not run:
my_cross_sample <- genSample(mySpatialMUM, 50, "ugs", nmax = 24)
class(my_cross_sample)
# run propagation
CN_sample <- propagate(realizations = my_cross_sample, model = C_N_model_raster, n = 50)
CN_sample
## End(Not run)</pre>
```

quantile_MC_sgdf

quantile() function for MC sample saved in a SpatialGridDataFrame

Description

Calculates mean from MC realizations for each location in a map.

Usage

```
quantile_MC_sgdf(realizations, ...)
```

Arguments

realizations MC sample saved in SpatialGridDataFrame.
... additional parameters.

Value

SpatialGridDataFrame; quantiles of a MC sample

Author(s)

Kasia Sawicka

render 31

Examples

render

Rendering template

Description

Rendering is the process of replacing the tags in moustaches by text. For this, we provide a set of render-methods. See the 'whisker' package (or https://mustache.github.io) for more information.

Usage

```
render(x, ...)
```

Arguments

```
x an object of class "character" or "template".... additional parameters.
```

Value

Rendered character template or a file on disk.

Author(s)

Dennis Walvoort

```
require(magrittr)
require(whisker)
# render character string
my_template <- "Hello {{name}}. How are you doing?"
my_template %>%
  render(name = "Winnie the Pooh")
```

32 render.character

```
# render table
my_template <- c(
    "| x | y |",
    "|--|--|",
    "{{#MY_TABLE}}",
    "| {{X}} | {{Y}} |",
    "{{/MY_TABLE}}")
my_table <- data.frame(X = 1:5, Y = letters[1:5])
my_table
my_template %>%
render(MY_TABLE = unname(rowSplit(my_table))) %>%
cat
```

render.character

Render method for "character" class.

Description

Rendering is the process of replacing the tags in moustaches by text.

Usage

```
## S3 method for class 'character' render(x, \ldots)
```

Arguments

x an object of class "character".... additional parameters.

Value

Rendered character template.

Author(s)

Dennis Walvoort

```
require(magrittr)
require(whisker)
# render character string
my_template <- "Hello {{name}}. How are you doing?"
my_template %>%
  render(name = "Winnie the Pooh")
```

render.template 33

```
# render table
my_template <- c(
    "| x | y |",
    "|---|---|",
    "{{#MY_TABLE}}",
    "| {{X}} | {{Y}} |",
    "{{/MY_TABLE}}")
my_table <- data.frame(X = 1:5, Y = letters[1:5])
my_table
my_template %>%
render(MY_TABLE = unname(rowSplit(my_table))) %>%
cat
```

render.template

Render method for "template" class.

Description

Rendering is the process of replacing the tags in moustaches by text.

Usage

```
## S3 method for class 'template' render(x, \ldots)
```

Arguments

x an object of class "template", a model input file with additional extension ".template".

... additional parameters.

Value

Rendered template file.

Author(s)

Dennis Walvoort

sd_MC_sgdf

sd_MC_sgdf

sd() function for MC sample saved in a SpatialGridDataFrame

Description

Calculates sd from MC realizations for each location in a map.

Usage

```
sd_MC_sgdf(realizations, ...)
```

Arguments

```
realizations MC sample saved in a SpatialGridDataFrame.
... additional parameters.
```

Value

SpatialGridDataFrame; a sd of a MC sample.

Author(s)

Kasia Sawicka

spup–pkg

spup - Package for spatial uncertainty propagation

Description

Facilitates uncertainty propagation analysis using Monte Carlo methods. In particular, provides functions that allow to do uncertainty analysis with spatial variables/models.

Author(s)

Kasia Sawicka

stratsamp

Stratified sampling for spatial variables

Description

Stratified sampling for spatial variables

Usage

```
stratsamp(n, distribution, parameters, p)
```

Arguments

n sample size per stratum.

 $\mbox{distribution} \quad \mbox{ a string, distribution type to sample from.}$

parameters given distribution parameters.

p a vector of quantiles.

Value

Sample of spatial variable. Matrix with n rows and length(p)-1 columns.

Author(s)

Stefan van Dam, Kasia Sawicka

36 TN

template

Constructor for class "template".

Description

Class that stores all templates with model inputs. The aim of this class is to: 1. organise model input files; 2. perform some checks.

Usage

```
template(filenames)
```

Arguments

filenames

a string, a name of the model input file.

Details

A template is a model input file with: 1. the additional extension '.template'. 2. input that needs to be modified is replaced by mustache-style tags.

Value

An object of a class "template".

Author(s)

Dennis Walvoort

TN

Soil total nitrogen content in a south area (33 x 33km) of lake Alaotra in Madagascar.

Description

A dataset containing the mean of soil TN content from 0-30 cm layer.

Usage

data(TN)

Format

a RasterLayer with dimensions: 134, 135, 18090 (nrow, ncol, ncell), resolution: 250, 250 (x, y).

TN_sd 37

Source

ISRIC soilgrid information. HENGL, T., MENDES DE JESUS, J., HEUVELINK, G. B. M., RUIPEREZ GONZALEZ, M., KILIBARDA, M., BLAGOTIC, A., SHANGGUAN, W., WRIGHT, M. N., GENG, X., BAUER-MARSCHALLINGER, B., GUEVARA, M. A., VARGAS, R., MACMILLAN, R. A., BATJES, N. H., LEENAARS, J. G. B., RIBEIRO, E., WHEELER, I., MANTEL, S. & KEMPEN, B. 2017. SoilGrids250m: Global gridded soil information based on machine learning. PLOS ONE, 12, e0169748.

TN_sd

Standard deviation of soil total nitrogen content in a south area (33 x 33km) of lake Alaotra in Madagascar.

Description

A dataset containing the standard deviation of soil TN content from 0-30 cm layer.

Usage

data(TN_sd)

Format

a RasterLayer with dimensions: 134, 135, 18090 (nrow, ncol, ncell), resolution: 250, 250 (x, y).

Source

ISRIC soilgrid information. HENGL, T., MENDES DE JESUS, J., HEUVELINK, G. B. M., RUIPEREZ GONZALEZ, M., KILIBARDA, M., BLAGOTIC, A., SHANGGUAN, W., WRIGHT, M. N., GENG, X., BAUER-MARSCHALLINGER, B., GUEVARA, M. A., VARGAS, R., MACMILLAN, R. A., BATJES, N. H., LEENAARS, J. G. B., RIBEIRO, E., WHEELER, I., MANTEL, S. & KEMPEN, B. 2017. SoilGrids250m: Global gridded soil information based on machine learning. PLOS ONE, 12, e0169748.

varcov

Calculate variance covariance matrix

Description

Calculate variance covariance matrix

Usage

varcov(sd_vector, cormat)

38 var_MC_sgdf

Arguments

sd_vector vector of standard deviations.

cormat correlation matrix.

Value

Variance-covariance matrix.

Author(s)

Kasia Sawicka

Examples

```
vc <- varcov(c(1,2,3), matrix(c(1,0.7,0.2,0.7,1,0.5,0.2,0.5,1), nrow = 3, ncol = 3)) vc
```

 var_MC_sgdf

var() function for MC sample saved in a SpatialGridDataFrame

Description

Calculates var from MC realizations for each location in a map.

Usage

```
var_MC_sgdf(realizations, ...)
```

Arguments

 $\label{eq:mc} \mbox{mC sample saved in SpatialGridDataFrame}.$

... additional parameters.

Value

SpatialGridDataFrame; a variance of a MC sample.

Author(s)

Kasia Sawicka

vgm2crm 39

Examples

vgm2crm

Convert vgm to crm

Description

Convert vgm to crm

Usage

```
vgm2crm(vgm, psill, nugget, range, model, kappa = 0.5, Err = 0)
```

Arguments

vgm	See ?vgm
psill	See ?vgm
nugget	See ?vgm
range	See ?vgm
model	See ?vgm
kappa	See ?vgm
Err	See ?vgm

Value

Spatial correlogram model - standardised parameters of spatial variogram model

Author(s)

Kasia Sawicka

40 woon

woon

Neighbourhood in Rotterdam.

Description

The 'woon' object is a SpatialPolygonDataFrame where each building is represented by one polygon.

Usage

data(woon)

Format

a SpatialPolygonDataFrame with 723 polygons and 7 variables:

vbos number of addresses present in the building

woonareash residential area, in percent

Function assigned category depending on vbos and woonareash - for residential is 1, for offcie is 2, for other is 3

residential probability that the building is residential

office probability that the building is an office

other probability that the building has other function

check check if probabilities sum to 1

Source

Kadaster, NL.

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