

Package ‘sptotal’

December 11, 2022

Type Package

Title Predicting Totals and Weighted Sums from Spatial Data

Date 2022-12-09

Version 1.0.1

Depends R (>= 3.5.0)

Description Performs predictions of totals and weighted sums, or finite population block kriging, on spatial data using the methods in Ver Hoef (2008) <[doi:10.1007/s10651-007-0035-y](https://doi.org/10.1007/s10651-007-0035-y)>. The primary outputs are an estimate of the total, mean, or weighted sum in the region, an estimated prediction variance, and a plot of the predicted and observed values. This is useful primarily to users with ecological data that are counts or densities measured on some sites in a finite area of interest. Spatial prediction for the total count or average density in the entire region can then be done using the functions in this package.

License GPL-2

Encoding UTF-8

LazyData true

RoxygenNote 7.2.1

BugReports <https://github.com/highamm/sptotal/issues>

Imports ggplot2, stats, viridis, graphics

Suggests rmarkdown, knitr, testthat, prettydoc, tibble, gstat

VignetteBuilder knitr, rmarkdown

URL <https://highamm.github.io/sptotal/index.html>

NeedsCompilation no

Author Matt Higham [cre, aut],

Jay Ver Hoef [aut],

Bryce Frank [aut],

Michael Dumelle [aut] (<<https://orcid.org/0000-0002-3393-5529>>)

Maintainer Matt Higham <mhigham@stlawu.edu>

Repository CRAN

Date/Publication 2022-12-11 22:40:02 UTC

R topics documented:

| | |
|--------------------------------------|-----------|
| AIC.slmfit | 2 |
| AKmoose_df | 3 |
| check.variogram-deprecated | 4 |
| coef.slmfit | 5 |
| corModelExponential | 5 |
| exampledataset | 6 |
| fitted.slmfit | 7 |
| geostatSim | 7 |
| get.predinfo-deprecated | 8 |
| get.predplot-deprecated | 9 |
| GR2 | 10 |
| LLtoTM | 11 |
| loglik.slmfit | 12 |
| m2LL.FPBK.nodet | 12 |
| mginv | 13 |
| plot.predict.slmfit | 14 |
| plot.slmfit | 14 |
| pointSimCSR | 15 |
| pointSimSyst | 16 |
| predict.slmfit | 17 |
| predict.stratafit | 18 |
| print.predict.slmfit | 19 |
| print.predict.stratafit | 20 |
| print.slmfit | 20 |
| print.summary.slmfit | 21 |
| residuals.slmfit | 22 |
| simdata | 23 |
| slmfit | 24 |
| sptotal | 26 |
| stratafit | 26 |
| summary.slmfit | 28 |
| summary.stratafit | 29 |
| sv | 30 |
| USlakes | 31 |
| Index | 32 |

AIC.slmfit

*Extract the AIC from a `slmfit` object for comparing models.***Description**Extract the AIC from a `slmfit` object for comparing models.

Usage

```
## S3 method for class 'slmfit'
AIC(object, ...)
```

Arguments

```
object      a slmfit object
...         further arguments passed to or from other methods.
```

Value

The AIC value of the *slmfit* object. Here, AIC is computed as 2 times the negative log-likelihood plus 2 times the number of model parameters for Maximum Likelihood (ML) and 2 times the negative log-likelihood for REML. For REML, AIC should only be used to compare two models with the same covariates but different spatial covariance structures.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
AIC(slmobj)
```

AKmoose_df

Data Set with Alaska Moose Counts.

Description

A data set that can be used with the *sptotal* package. In this example, the counts are of moose on 860 sites of equal area.

Usage

```
AKmoose_df
```

Format

A dataframe object. The data frame *AKmoose_df* contains 860 rows and 4 columns:

elev_mean The mean elevation for each site for each site
strat A stratification variable (either L or M)
surveyed Assigned a 1 if the site was surveyed and a 0 otherwise
total The total moose count on each site (NA if the site was not surveyed)
x the x-coordinate centroid of the site (TM)
y the y-coordinate centroid of the site (TM)
lon the longitudinal centroid of the site
lat the latitudinal centroid of the site

Source

Alaska Department of Fish and Game, Division of Wildlife Conservation has released this data set under the CC0 (creative commons) license. To the extent possible under law, Alaska Department of Fish and Game, Division of Wildlife Conservation waives all copyright and related or neighboring rights to An Alaskan GSPE (Geospatial Population Estimator) Survey of Moose, AKmoose.rda. This work is published from: United States.

Examples

```
data(AKmoose_df)
names(AKmoose_df)
summary(AKmoose_df)
```

check.variogram-deprecated

Plot an Empirical Semi-Variogram of Residuals

Description

check.variogram() has been deprecated: use `plot.slmfit()` instead. Plots an empirical semi-variogram of the residuals from the spatial linear model with the fitted parametric model as a curve overtop of the binned points. By default, the empirical semi-variogram only shows distances that are less than or equal to the maximum distance in the data set divided by 2. Therefore, it's possible that the REML-fitted model will not "fit" the points perfectly.

Usage

```
check.variogram(object)
```

Arguments

object is an object of class `slmfit`.

Value

a plot of the empirical semi-variogram with the fitted model overlaid.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
## Not Run
## check.variogram(slmobj)
```

| | |
|-------------|---|
| coef.slmfit | <i>Extract Model Coefficients from a <code>slmfit</code> object</i> |
|-------------|---|

Description

Extract Model Coefficients from a `slmfit` object

Usage

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

Arguments

| | |
|--------|--|
| object | a <code>slmfit</code> object |
| ... | further arguments passed to or from other methods. |

Value

a vector of fitted model coefficients.

Examples

```
data(exampledataset) ## load a toy data set  
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,  
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')  
coef(slmobj)
```

| | |
|---------------------|-----------------------------------|
| corModelExponential | <i>Spatial Correlation Models</i> |
|---------------------|-----------------------------------|

Description

Note that, currently, only three of these models are implemented in the `sptotal` package: `corModelExponential()`, `corModelGaussian()`, and `corModelSpherical()`.

Usage

```
corModelExponential(distance.matrix, range)
```

```
corModelGaussian(distance.matrix, range)
```

```
corModelSpherical(distance.matrix, range)
```

Arguments

`distance.matrix` The distance matrix for sampled sites

`range` The range that determines how quickly covariance among sites tapers

Value

Correlation Matrix

Functions

- `corModelExponential()`: Exponential Correlation Structure
- `corModelGaussian()`: Gaussian Correlation Structure
- `corModelSpherical()`: Spherical Correlation Structure

exampledataset *Data Set with Uncorrelated Poisson Counts.*

Description

A toy data set that can be used with the `sptotal` package. In this example, the true counts are actually uncorrelated, the covariates are generated as uniform random variables, and the sites fall on a regular grid.

Usage

exampledataset

Format

A data frame with 40 rows and 7 variables:

counts counts, with NA values for unsampled sites

pred1 a possible predictor

pred2 a second possible predictor

xcoords coordinates on the x-axis

ycoords coordinates on the y-axis

dummyvar an extra variable

areavar Variable for the area of each plot ...

| | |
|---------------|---|
| fitted.slmfit | <i>Extract Fitted Values from an slmfit object.</i> |
|---------------|---|

Description

Extract Fitted Values from an slmfit object.

Usage

```
## S3 method for class 'slmfit'  
fitted(object, ...)
```

Arguments

object a slmfit object generated from the `slmfit()` function.
... further arguments passed to or from other methods.

Value

a vector of fitted values (estimated means)

Examples

```
data(exampldataset) ## load a toy data set  
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,  
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')  
fitted(slmobj)
```

| | |
|------------|---|
| geostatSim | <i>Simulate geostatistical data on set of given locations</i> |
|------------|---|

Description

Spatially correlated data are simulated assuming a multivariate normal random error vector. For simplicity, only "Exponential" and "Spherical" simulation options are given here.

Usage

```
geostatSim(  
  loc.data,  
  xcol = "x",  
  ycol = "y",  
  parsil = 1,  
  range = 1,  
  nugget = 0,  
  minorp = 1,
```

```

    rotate = 90,
    extrap = NULL,
    CorModel = "Exponential"
  )

```

Arguments

| | |
|----------|--|
| loc.data | data.frame with x- and y-coordinates of locations for simulated data |
| xcol | name of the column in loc.data with x-coordinates, default is "x" |
| ycol | name of the column loc.data with y-coordinates, default is "y" |
| parsil | partial sill of autocorrelation model, default = 1 |
| range | range of autocorrelation model, default = 1 |
| nugget | range of autocorrelation model, default = 0 |
| minorp | proportion of range in x direction to that of y direction for unrotated anisotropic model, default = 1 |
| rotate | rotation of anisotropic axes, default = 90 |
| extrap | extra covariance parameter |
| CorModel | autocorrelation model, default = "Exponential". Other possibilities are "Spherical". |

Value

data.frame of three columns, the original location data appended with a 3rd column of simulated geostatistical data

Author(s)

Jay Ver Hoef

Examples

```

locations <- expand.grid(1:10, 1:10)
geostatSim(locations, xcol = "Var1", ycol = "Var2",
parsil = 4, range = 20, nugget = 1, CorModel = "Exponential")

```

get.predinfo-deprecated

Display basic summary information in a tabular form.

Description

get.predinfo() has been deprecated. Information given is now provided in the basic print of a [predict.slmfit\(\)](#) object. Creates a list of tables that shows the prediction, standard error, and confidence interval for the prediction, as well as some summary information about the sample.

Usage

```
get.predinfo(x, conf_level = 0.9)
```

Arguments

`x` the output of the `predict.slmfit()` function, of class `predict.slmfit`
`conf_level` is the confidence level for a normal-based confidence interval (default = 0.90).

Value

a list of three tables, including

- `simptab`, which contains the prediction and its standard error,
- `confbounds`, which contains a confidence interval for the prediction, and
- `outptmat`, a table of sampling information, including the number of sites sampled, the total number of sites, the total observed response, and the observed average density (equal to the average response if all site areas are equal).

Examples

```
data(exampdataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampdataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
predobj <- predict(slmobj)
## Not Run
## get.predinfo(predobj)
```

```
get.predplot-deprecated
```

Create a default map from predictions

Description

Creates a default map for the predictions of unobserved sites. Note that all predictions are stored in a data frame in the output of `predict.slmfit()`. Therefore, if a user would like to create his or her own plot, he or she can easily do so using this data frame.

Usage

```
get.predplot(x)
```

Arguments

`x` the output of the `predict.slmfit()` function, of class `predict.slmfit`

Value

a plot with x-coordinates on the x-axis and y-coordinates on the y-axis that is coloured by predictions, with points with an X denoting that a site was sampled and filled circles denoting unsampled sites.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
predobj <- predict(slmobj)
## Not Run
## get.predplot(predobj)
```

GR2

Computes the Generalized R-squared.

Description

Computes the Generalized R-squared.

Usage

```
GR2(object)
```

Arguments

object is an object of class `slmfit`.

Value

the value for generalized R-squared

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
GR2(slmobj)
```

LLtoTM

*Convert Lat and Long to Transverse Mercator (TM)***Description**

Latitude and Longitude coordinates are converted to TM projection coordinates with a user-defined central meridian. The resulting units from applying the function are kilometers.

Usage

```
LLtoTM(cm, lat, lon, xcol = "x", ycol = "y", minx = NULL, miny = NULL)
```

Arguments

| | |
|------|---|
| cm | is the user defined central median. A common choice is the mean of the longitude values in your data set |
| lat | is the vector of latitudes |
| lon | is the vector of longitudes |
| xcol | is the name of the output TM column of x coordinates |
| ycol | is the name of the output TM column of y coordinates |
| minx | is 'NULL' by default and sets the minimum x-coordinate value to 0. This is an optional minimum value for the x-coordinate vector. |
| miny | is 'NULL' by default and sets the minimum y-coordinate value to 0. This is an optional minimum value for the y-coordinate vector. |

Details

This function should only be used if the coordinates supplied by the user are latitude and longitude. The default TM projection here specifies that both the minimum x and y-coordinate values are 0 scaled to 1 km.

Value

A list with the TM coordinates as the first component of the list. The first component of the list contains x coordinates in the first column and y coordinates in the second column. The remaining elements of the list are the cm, minx, and miny values that were input.

Examples

```
## Add transverse Mercator x and y coordinates to a data frame with
## latitude/longitude coordinates. Name these \code{xc_TM_} and \code{yc_TM_}.
exampledataset$xc_TM_ <- LLtoTM(cm = base::mean(exampledataset[, "xcoords"]),
  lat = exampledataset[, "ycoords"],
  lon = exampledataset[, "xcoords"])$xy[, 1]
exampledataset$yc_TM_ <- LLtoTM(cm = base::mean(exampledataset[, "xcoords"]),
  lat = exampledataset[, "ycoords"],
  lon = exampledataset[, "xcoords"])$xy[, 2]
```

| | |
|---------------|---|
| loglik.slmfit | <i>Extract Log-Likelihood from a fitted class slmfit object</i> |
|---------------|---|

Description

Extract Log-Likelihood from a fitted class `slmfit` object

Usage

```
loglik.slmfit(object, ...)
```

Arguments

| | |
|---------------------|---------------------------------------|
| <code>object</code> | is a class <code>slmfit</code> object |
| <code>...</code> | additional arguments |

Value

the log-likelihood of the model fit in the `slmfit` object

Examples

```
data(exampledataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
loglik.slmfit(slmobj)
```

| | |
|-----------------|--|
| m2LL.FPBK.nodet | <i>Covariance Parameter Estimation Function.</i> |
|-----------------|--|

Description

The primary purpose of `m2LL.FPBK.nodet()` is to estimate the spatial covariance parameters using REML. This is a helper function to `slmfit()`.

Usage

```
m2LL.FPBK.nodet(theta, zcol, XDesign, distmat, CorModel, estmethod)
```

Arguments

| | |
|-----------|---|
| theta | is the parameter vector of (nugget, partialsill, range) |
| zcol | is the response vector of densities |
| XDesign | is the design matrix containing the covariates used to predict animal or plant abundance (including a column of 1's for the intercept). |
| distmat | is the distance matrix of the sampled sites |
| CorModel | is the geostatistical spatial correlation model to be used. See the corModels documentation for possible models to use. |
| estmethod | is either "REML" for restricted maximum likelihood or "ML" for maximum likelihood. |

Value

A numeric output of minus 2 times the restricted log likelihood to be minimized by 'optim' to obtain spatial parameter estimates.

mginv

Constructing the generalized inverse of a matrix

Description

Computes the generalized inverse of a matrix X. This function is used in the m2LL.FPBK.nodet functions in order to estimate the spatial covariance parameters

Usage

```
mginv(X, tol = sqrt(.Machine$double.eps))
```

Arguments

| | |
|-----|---------------------------------|
| X | The matrix to be inverted |
| tol | The tolerance of the estimation |

Value

The generalized inverse matrix

```
plot.predict.slmfit    Create a default map from predictions
```

Description

Creates a default map for the predictions of unobserved sites. Note that all predictions are stored in a data frame in the output of `predict.slmfit()`. Therefore, if a user would like to create his or her own plot, they can easily do so using this data frame.

Usage

```
## S3 method for class 'predict.slmfit'
plot(x, ...)
```

Arguments

```
x          the output of the predict.slmfit() function, of class predict.slmfit
...        further arguments passed to or from other methods.
```

Value

a plot with x-coordinates on the x-axis and y-coordinates on the y-axis that is coloured by predictions, with points with an X denoting that a site was sampled and filled circles denoting unsampled sites.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
predobj <- predict(slmobj)
plot(predobj)
```

```
plot.slmfit    Plot an Empirical Semi-Variogram of Residuals
```

Description

Plots an empirical semi-variogram of the residuals from the spatial linear model with the fitted parametric model as a curve overtop of the binned points. By default, the empirical semi-variogram only shows distances that are less than or equal to the maximum distance in the data set divided by 2. Therefore, it's possible that the REML-fitted model will not "fit" the points perfectly.

Usage

```
## S3 method for class 'slmfit'
plot(x, ...)
```

Arguments

`x` is an object of class `slmfit`.
`...` further arguments passed to or from other methods.

Value

a plot of the empirical semi-variogram with the fitted model overlaid.

Examples

```
data(exampledataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
plot(slmobj)

data(exampledataset) ## load a toy data set
exampledataset$strata <- c(rep("A", 19), rep("B", 21))
strataobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset, stratacol = "strata",
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
plot(strataobj[[1]])
```

pointSimCSR

simulate completely spatially random point patterns.

Description

simulates a completely spatially random point patterns. This function is only used in simulating data sets.

Usage

```
pointSimCSR(
  npoints = 100,
  lower_x_lim = 0,
  upper_x_lim = 1,
  lower_y_lim = 0,
  upper_y_lim = 1
)
```

Arguments

`npoints` number of points to add that are completely spatially random (CSR), default = 100
`lower_x_lim` left limit of boundary, default = 0
`upper_x_lim` right limit of boundary, default = 1
`lower_y_lim` lower limit of boundary, default = 0
`upper_y_lim` upper limit of boundary, default = 1

Value

data.frame of two columns, x-coordinate in the first, and y-coordinate in the second.

Author(s)

Jay Ver Hoef

pointSimSyst

Creates a systematic grid of points.

Description

Creates a systematic grid of points. This function is only used in simulating data sets.

Usage

```
pointSimSyst(  
  nrow = 10,  
  ncol = 10,  
  lower_x_lim = 0,  
  upper_x_lim = 1,  
  lower_y_lim = 0,  
  upper_y_lim = 1  
)
```

Arguments

| | |
|-------------|--|
| nrow | the number of rows in the systematic grid, default is 10 |
| ncol | the number of cols in the systematic grid, default is 10 |
| lower_x_lim | the lower limit for x-coordinate, default is 0 |
| upper_x_lim | the upper limit for x-coordinate, default is 1 |
| lower_y_lim | the lower limit for y-coordinate, default is 0 |
| upper_y_lim | the upper limit for y-coordinate, default is 1 |

Value

A data.frame with x- and y-coordinates of simulated locations

Author(s)

Jay Ver Hoef

predict.slmfit *Perform Finite Population Block Kriging*

Description

Uses an object of class `slmfit` from the `slmfit()` function to predict the response on the unsampled sites. The column of the data set that has the response should have numeric values for the observed response on the sampled sites and 'NA' for any site that was not sampled. Note that there is no `newdata` argument to `predict.slmfit()`: any point in space for which a prediction is needed should be included in the original data set in `slmfit()` with the response variable as NA.

Usage

```
## S3 method for class 'slmfit'
predict(object, wtscol = NULL, conf_level = 0.9, ...)
```

Arguments

| | |
|-------------------------|---|
| <code>object</code> | is an object generated from <code>slmfit()</code> |
| <code>wtscol</code> | is the name of the column that contains the weights for prediction. The default setting predicts the population total |
| <code>conf_level</code> | is the confidence level for a prediction interval, 0.90 by default |
| <code>...</code> | further arguments passed to or from other methods. |

Value

a list with

- the estimated population total
- the estimated prediction variance
- a data frame containing
 1. x-coordinates
 2. y-coordinates
 3. density predictions
 4. count predictions
 5. site-by-site density prediction variances
 6. site-by-site count prediction variances
 7. indicator variable for whether or not the each site was sampled
 8. estimated mean for each site
 9. area of each site
- vector with estimated covariance parameters
- the formula used to fit the model in `slmfit()`
- the confidence level
- the confidence interval bounds

Examples

```
data(exampledataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
predict(slmobj)
```

predict.stratafit *Perform Finite Population Block Kriging*

Description

Uses an object of class `stratafit` from the `stratafit()` function to predict the response on the unsampled sites for separate strata. The column of the data set that has the response should have numeric values for the observed response on the sampled sites and 'NA' for any site that was not sampled. Note that there is no `newdata` argument to `predict.stratafit()`: any point in space for which a prediction is needed should be included in the original data set in `stratafit()` with the response variable as NA.

Usage

```
## S3 method for class 'stratafit'
predict(object, wtscol = NULL, conf_level = 0.9, ...)
```

Arguments

| | |
|---------------------------|---|
| <code>object</code> | is an object generated from <code>stratafit()</code> |
| <code>wtscol</code> | is the name of the column that contains the weights for prediction. The default setting predicts the population total |
| <code>conf_level</code> , | by default, 0.90, this is the desired confidence level for a prediction interval |
| <code>...</code> | further arguments passed to or from other methods. |

Value

a list with

- the estimated population total
- the estimated prediction variance
- a data frame containing
 1. x-coordinates
 2. y-coordinates
 3. density predictions
 4. count predictions
 5. site-by-site density prediction variances
 6. site-by-site count prediction variances
 7. indicator variable for whether or not the each site was sampled

- 8. estimated mean for each site
- 9. area of each site
- vector with estimated covariance parameters
- the formula used to fit the model in `slmfit()`

Examples

```
data(exampledataset) ## load a toy data set
exampledataset$strata <- c(rep("A", 19), rep("B", 21))
strataobj <- stratafit(formula = counts ~ pred1 + pred2,
  data = exampledataset, stratacol = "strata",
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
predict(strataobj)
```

`print.predict.slmfit` *Prints a short summary for the `predict.slmfit()` function.*

Description

This function uses the object that is output from `predict.slmfit()` of class `predict.slmfit`.

Usage

```
## S3 method for class 'predict.slmfit'
print(x, digits = max(3L, getOption("digits") - 3L), ...)
```

Arguments

| | |
|---------------------|---|
| <code>x</code> | is a prediction object generated from <code>predict.slmfit()</code> |
| <code>digits</code> | is the number of digits to be displayed in the model output |
| <code>...</code> | further arguments passed to or from other methods. |

Examples

```
data(exampledataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
print(predict(slmobj), digits = 4)
```

```
print.predict.stratafit
```

Prints a short summary for the `predict.stratafit()` function.

Description

This function uses the object that is output from `predict.stratafit()` of class `predict.stratafit..`

Usage

```
## S3 method for class 'predict.stratafit'
print(x, digits = max(3L, getOption("digits") - 3L), ...)
```

Arguments

| | |
|---------------------|--|
| <code>x</code> | is a prediction object generated from <code>predict.stratafit()</code> |
| <code>digits</code> | is the number of digits to be displayed in the model output |
| <code>...</code> | further arguments passed to or from other methods. |

Value

a list with

- a table of predictions, standard errors, and confidence intervals for each stratum and for the total.

Examples

```
data(exampledataset) ## load a toy data set
exampledataset$strata <- c(rep("A", 19), rep("B", 21))
strataobj <- stratafit(formula = counts ~ pred1 + pred2,
  data = exampledataset, stratacol = "strata",
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
predict(strataobj)
```

```
print.slmfit
```

Prints the fitted coefficient table of a fitted spatial linear model.

Description

This function uses the object that is output from `slmfit()` of class `slmfit.`

Usage

```
## S3 method for class 'slmfit'
print(x, digits = max(3L, getOption("digits") - 3L), ...)
```

Arguments

`x` is an object generated from `slmfit()`
`digits` is the number of digits to be displayed in the model output
`...` further arguments passed to or from other methods.

Value

a list with

- model formula
- summary statistics for the residuals.
- a table of fixed effects estimates and associated standard errors.
- estimated spatial covariance parameter estimates.
- generalized r-squared value.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
print(slmobj)
```

`print.summary.slmfit` *Prints the summary of a fitted spatial linear model.*

Description

This function uses the object that is output from `summary.slmfit()`.

Usage

```
## S3 method for class 'summary.slmfit'
print(
  x,
  digits = max(3L, getOption("digits") - 3L),
  signif.stars = getOption("show.signif.stars"),
  ...
)
```

Arguments

`x` is an summary object generated from `summary.slmfit()`
`digits` is the number of digits to be displayed in the model output
`signif.stars` is an option to show which predictors are significant.
`...` further arguments passed to or from other methods.

Value

a list with

- model formula
- summary statistics for the residuals.
- a table of fixed effects estimates and associated standard errors.
- estimated spatial covariance parameter estimates.
- generalized r-squared value.

Examples

```
data(exampledataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
print(summary(slmobj))
```

residuals.slmfit

Extract Model Residuals from an slmfit object.

Description

Extract Model Residuals from an slmfit object.

Usage

```
## S3 method for class 'slmfit'
residuals(object, type = "raw", cross.validation = FALSE, ...)
```

Arguments

| | |
|------------------|--|
| object | a slmfit object generated from the <code>slmfit()</code> function. |
| type | residual type: "raw" (the default) or "normalized" |
| cross.validation | a logical (TRUE or FALSE) that indicates whether the residuals computed should be found using leave one out cross-validation. Set to FALSE by default. |
| ... | further arguments passed to or from other methods. |

Value

a vector of residuals, consisting of each observed response/density minus the estimated mean, or, in the case of cross-validation, the observed response/density minus the leave-one-out-cross-validation prediction.

Examples

```
data(exampledataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampledataset,
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
residuals(slmobj)
residuals(slmobj, cross.validation = TRUE)
```

simdata

Simulated Spatially Autocorrelated Data.

Description

A simulated data set that can be used with the `sptotal` package.

Usage

```
simdata
```

Format

A data frame object including:

x The x-coordinate for each site

y The y-coordinate for each site

X1 Simulated independent variable to be used as a predictor

X2 Simulated independent variable to be used as a predictor

X3 Simulated independent variable to be used as a predictor

X4 Simulated independent variable to be used as a predictor

X5 Simulated independent variable to be used as a predictor

X6 Simulated spatially correlated random variable to be used as a predictor

X7 Simulated spatially correlated random variable to be used as a predictor

F1 Simulated factor variable to be used as a predictor

F2 Simulated factor variable to be used as a predictor

Z The simulated response variable.

wts1 Prediction weights if estimating an overall mean

wts2 Prediction weights for estimating a total over a subset of 25 contiguous plots

Examples

```
data(simdata)
names(simdata)
summary(simdata)
```

slmfit

Fits a Spatial Linear Model

Description

Estimates regression coefficients and spatial autocorrelation parameters, given spatial coordinates and a model formula.

Usage

```
slmfit(
  formula,
  data,
  xcoordcol,
  ycoordcol,
  areacol = NULL,
  stratacol = NULL,
  CorModel = "Exponential",
  estmethod = "REML",
  covestimates = c(NA, NA, NA)
)
```

Arguments

| | |
|--------------|---|
| formula | is an R linear model formula specifying the response variable as well as covariates for predicting the response on the unsampled sites. |
| data | is a data frame or tibble with the response column, the covariates to be used for the block kriging, and the spatial coordinates for all of the sites. Alternatively, data can be an sp Spatial Points Data Frame or sf object with POINT geometry. |
| xcoordcol | is the name of the column in the data frame with x coordinates or longitudinal coordinates |
| ycoordcol | is the name of the column in the data frame with y coordinates or latitudinal coordinates |
| areacol | is the name of the column with the areas of the sites. By default, we assume that all sites have equal area, in which case a vector of 1's is used as the areas. |
| stratacol | is the name of the the column with the stratification variable, if strata are to be fit separately, with different covariance parameter estimates. |
| CorModel | is the covariance structure. By default, CorModel is Exponential but other options include the Spherical and Gaussian. |
| estmethod | is either the default "REML" for restricted maximum likelihood to estimate the covariance parameters and regression coefficients or "ML" to estimate the covariance parameters and regression coefficients. This argument can also be set to "None", in which case covestimates must be provided. |
| covestimates | is an optional vector of covariance parameter estimates (nugget, partial sill, range). If these are given and estmethod = "None", the the provided vector are treated as the estimators to create the covariance structure. |

Value

a list of class `slmfit` with

- the spatial covariance estimates
- the regression coefficient estimates
- the covariance matrix of the fixed effects
- minus two times the log-likelihood of the model
- the names of the predictors
- the sample size
- the name of the covariance model used
- a vector of residuals
- the design matrix
- a vector of the sampled densities
- a list containing
 1. formula, the model formula
 2. data, the data set input as the data argument
 3. xcoordcol, the name of the x-coordinate column
 4. ycoordcol, the name of the y-coordinate column
 5. estmethod, either REML or ML
 6. CorModel, the correlation model used
 7. estimated covariance matrix of all sites
 8. Inverted covariance matrix on the sampled sites
 9. the vector of areas.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
summary(slmobj)
```

```
data(exampldataset) ## load a toy data set
exampldataset$strata <- c(rep("A", 19), rep("B", 21))
strataobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset, stratacol = "strata",
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
summary(strataobj)
```

| | |
|---------|---|
| sptotal | <i>sptotal: A package used for performing Finite Population Block Kriging (FPBK) on polygonal count data.</i> |
|---------|---|

Description

The package provides an option to perform FPBK on counts assuming perfect detection of counts on the sites that were in the survey sample. The functions in the package use methods in (Ver Hoef, 2008, <doi:10.1007/s10651-007-0035-y>)

Details

sptotal Main Functions:

`slmfit` fits a spatial linear model to the response on the observed/sampled sites. The function `check.variogram` can be used to construct an empirical variogram of the residuals of the spatial linear model.

`predict.slmfit` uses the spatial linear model fit from `slmfit` and finite population block kriging to predict the response at unobserved locations. A prediction for the total response as well as a prediction variance are given by default.

`get.predinfo` and `get.predplot` take the resulting object from `predict.slmfit` to construct (1) summary information, including the prediction, prediction variance, and a prediction interval as well as (2) a plot of the site-wise predictions.

Most of the remaining functions in the package are either helper functions or extra optional functions to extract various specific things from an `slmfit` object, such as residuals, AIC, log-likelihood, etc.

See the Vignette for more details: `browseVignettes("sptotal")` Reference for Mathematical Details:

Ver Hoef, Jay M. "Spatial methods for plot-based sampling of wildlife populations." *A Environmental and Ecological Statistics* 15, no. 1 (2008): 3-13.

| | |
|-----------|--|
| stratafit | <i>Fits a Separate Spatial Linear Model for Each Stratum</i> |
|-----------|--|

Description

Estimates regression coefficients and spatial autocorrelation parameters, given spatial coordinates, a model formula, and a stratification variable. Arguments are the same here as they are for `slmfit()`, with an extra argument for `stratacol`, the name of the stratification column. Note that stratum can either be incorporated as a covariate in `slmfit()`, in which case the errors have the same spatial covariance, or, models with differing spatial covariances for the errors can be fit to each level of stratum, as is done here in `stratafit()`.

Usage

```
stratafit(
  formula,
  data,
  xcoordcol,
  ycoordcol,
  stratacol = NULL,
  areacol = NULL,
  CorModel = "Exponential",
  estmethod = "REML"
)
```

Arguments

| | |
|-----------|---|
| formula | is an R linear model formula specifying the response variable as well as covariates for predicting the response on the unsampled sites. |
| data | is the data set with the response column, the covariates to be used for the block kriging, and the spatial coordinates for all of the sites. |
| xcoordcol | is the name of the column in the data frame with x coordinates or longitudinal coordinates |
| ycoordcol | is the name of the column in the data frame with y coordinates or latitudinal coordinates |
| stratacol | is the name of the stratification column |
| areacol | is the name of the column with the areas of the sites. By default, we assume that all sites have equal area, in which case a vector of 1's is used as the areas. |
| CorModel | is the covariance structure. By default, CorModel is Exponential but other options include the Spherical and Gaussian. |
| estmethod | is either the default "REML" for restricted maximum likelihood to estimate the covariance parameters and regression coefficients or "ML" to estimate the covariance parameters and regression coefficients. |

Value

a list of class `s1mfit` with

- the spatial covariance estimates
- the regression coefficient estimates
- the covariance matrix of the fixed effects
- minus two times the log-likelihood of the model
- the names of the predictors
- the sample size
- the name of the covariance model used
- a vector of residuals
- the design matrix

- a vector of the sampled densities
- a list containing
 1. formula, the model formula
 2. data, the data set input as the data argument
 3. xcoordcol, the name of the x-coordinate column
 4. ycoordcol, the name of the y-coordinate column
 5. estmethod, either REML or ML
 6. CorModel, the correlation model used
 7. estimated covariance matrix of all sites
 8. Inverted covariance matrix on the sampled sites
 9. the vector of areas.

Examples

```
data(exampldataset) ## load a toy data set
exampldataset$strata <- c(rep("A", 19), rep("B", 21))
strataobj <- stratafit(formula = counts ~ pred1 + pred2,
  data = exampldataset, stratacol = "strata",
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
summary(strataobj)
```

summary.slmfit

Summarizes a fitted spatial linear model.

Description

In conjunction with `print.summary.slmfit()`, the output looks similar to output from R's standard `lm()` function.

Usage

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

Arguments

`object` is an object generated from `slmfit()` of class `slmfit`.
`...` further arguments passed to or from other methods.

Value

a list with

- model formula
- a table of fixed effects estimates and associated standard errors
- estimated spatial covariance parameter estimates
- residuals
- generalized r-squared.

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
summary(slmobj)
```

| | |
|-------------------|--|
| summary.stratafit | <i>Summarizes a fitted spatial linear model with a stratification variable..</i> |
|-------------------|--|

Description

If a model is fitted with `stratafit()`, then this summary function produces summary output for each level of the stratification variable in the same style as the `summary.slmfit()` function.

Usage

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

Arguments

| | |
|--------|--|
| object | is an object generated from <code>slmfit()</code> of class <code>slmfit</code> . |
| ... | further arguments passed to or from other methods. |

Value

a list with

- model formula
- a table of fixed effects estimates and associated standard errors
- estimated spatial covariance parameter estimates
- residuals
- generalized r-squared.

Examples

```
data(exampldataset) ## load a toy data set
exampldataset$strata <- c(rep("A", 25), rep("B", 15))
strataobj <- stratafit(formula = counts ~ pred1 + pred2,
  data = exampldataset, stratacol = "strata",
  xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
summary(strataobj)
```

Description

Compute the empirical semivariogram for a data set with specified x and y spatial coordinates and residuals.

Usage

```
sv(data, xcoordcol, ycoordcol, residcol, bins = 15, cutoff = NULL, ...)
```

Arguments

| | |
|------------------------|--|
| <code>data</code> | A data frame or tibble that contains variables for the x coordinates, y coordinates, and residuals. |
| <code>xcoordcol</code> | is the name of the column in the data frame with x coordinates or longitudinal coordinates |
| <code>ycoordcol</code> | is the name of the column in the data frame with y coordinates or latitudinal coordinates |
| <code>residcol</code> | is the name of the column in the data frame with residuals. |
| <code>bins</code> | Number of equally spaced semivariogram bins. The default is 15. |
| <code>cutoff</code> | The maximum spatial distance to be considered. The default is half of the maximum observed distance in the data frame. |
| <code>...</code> | Additional arguments to be used by <code>stats::dist()</code> for spatial distance calculations. |

Value

A data frame with the average distance in each bin (`dist`), the semivariance (`gamma`), and the number of unique pairs in each bin (`np`)

Examples

```
data(exampldataset) ## load a toy data set
slmobj <- slmfit(formula = counts ~ pred1 + pred2, data = exampldataset,
xcoordcol = 'xcoords', ycoordcol = 'ycoords', areacol = 'areavar')
sampleddataset <- na.omit(exampldataset)
svexample <- data.frame(
  xcoords = sampleddataset$xcoords,
  ycoords = sampleddataset$ycoords,
  resids = residuals(slmobj)
)
svdata <- sv(svexample, "xcoords", "ycoords", "resids")
```

USlakes

Dissolved Organic Carbon in U.S. Lakes

Description

These data contain dissolved organic carbon (DOC) in National Lakes Data from the U.S. Environmental Protection Agency

Usage

USlakes

Format

A data frame with 1206 rows and 9 variables:

XCOORD x-coordinate from US Contiguous Albers Equal Area Conic projection

YCOORD y-coordinate from US Contiguous Albers Equal Area Conic projection

DOC_RESULT Analyte value, in mg/L, for Dissolved Organic Carbon

ELEVATION Elevation at lake coordinates (LAT_DD_N83, LON_DD_N83) from NHD Digital Elevation Map layer

FCIBIG_LIT Fish cover: index of fish cover due to large structures in the littoral zone

RVFCGNDBARE_RIP riparian zone and vegetation: fraction of ground lacking cover in the riparian zone

RVFCGNDWOODY_RIP riparian zone and vegetation: fraction of ground cover by woody vegetation in the riparian zone

RVFPUNDWOODY_RIP riparian zone and vegetation: fraction of understory with nonwoody cover present in the riparian zone

UID A unique lake identifier in the EPA lake survey databases

Source

[National Aquatic Resource Surveys](#) webpage. We combined [site data](#), [DOC data](#), and [habitat metrics](#) to create a data set of 1206 lakes in the conterminous United States.

Examples

```
data(USlakes)
names(USlakes)
summary(USlakes)
```

Index

* datasets

- AKmoose_df, 3
 - exampledataset, 6
 - simdata, 23
 - USlakes, 31
- AIC.slmfit, 2
- AKmoose_df, 3
- check.variogram, 26
- check.variogram
(check.variogram-deprecated), 4
- check.variogram-deprecated, 4
- coef.slmfit, 5
- corModelExponential, 5
- corModelGaussian (corModelExponential),
5
- corModelSpherical
(corModelExponential), 5
- exampledataset, 6
- fitted.slmfit, 7
- geostatSim, 7
- get.predinfo, 26
- get.predinfo (get.predinfo-deprecated),
8
- get.predinfo-deprecated, 8
- get.predplot, 26
- get.predplot (get.predplot-deprecated),
9
- get.predplot-deprecated, 9
- GR2, 10
- LLtoTM, 11
- loglik.slmfit, 12
- m2LL.FPBK.nodet, 12
- mginv, 13
- plot.predict.slmfit, 14
- plot.slmfit, 4, 14
- pointSimCSR, 15
- pointSimSyst, 16
- predict.slmfit, 8, 9, 14, 17, 19, 26
- predict.stratafit, 18, 20
- print.predict.slmfit, 19
- print.predict.stratafit, 20
- print.slmfit, 20
- print.summary.slmfit, 21
- residuals.slmfit, 22
- simdata, 23
- slmfit, 2–5, 7, 15, 17, 20–22, 24, 26, 28, 29
- sptotal, 26
- stratafit, 18, 26, 29
- summary.slmfit, 21, 28, 29
- summary.stratafit, 29
- sv, 30
- USlakes, 31