

Package ‘smile’

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Title Spatial Misalignment: Interpolation, Linkage, and Estimation

Version 1.0.0

Description Provides functions to estimate, predict and interpolate areal data. For estimation and prediction we assume areal data is an average of an underlying continuous spatial process.

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Encoding UTF-8

LazyData true

Roxygen list(markdown = TRUE)

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SystemRequirements C++11, GDAL ($\geq 2.0.1$), GEOS ($\geq 3.4.0$), PROJ ($\geq 4.8.0$)

LinkingTo Rcpp,
RcppArmadillo

Imports numDeriv,
Rcpp,
sf,
mvtnorm,
stats

Depends R (≥ 3.5)

URL <https://lcgodoy.me/smile/>, <https://github.com/lcgodoy/smile/>

BugReports <https://github.com/lcgodoy/smile/issues/>

Suggests knitr,
rmarkdown,
ggplot2,
graphics

VignetteBuilder knitr

Language en-US

R topics documented:

AI	2
find_phi	3
fit_spm	3
goodness_of_fit	5
liv_lsoa	6
liv_msoa	6
nyc_comd	7
nyc_surv	8
predict_spm	8
sf_to_spm	9
summary_spm_fit	10
vdl	11
vdl_var	11
Index	13

AI	<i>Areal Interpolation</i>
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Description

Areal Interpolation

Usage

```
ai(source, target, vars)

ai_var(source, target, vars, vars_var, var_method = "CS")
```

Arguments

source	a sf object - source spatial data.
target	a sf object - target spatial data.
vars	a character representing the variables (observed at the source) to be estimated at the target data.
vars_var	a scalar of type character representing the name of the variable in the source dataset that stores the variances of the variable to be estimated at the target data.
var_method	a character representing the method to approximate the variance of the AI estimates. Possible values are "CS" (Cauchy-Schwartz) or "MI" (Moran's I).

Value

the target (of type sf) with estimates of the variables observed at the source data.

find_phi	<i>Find phi parameter for the Exponential spatial auto-correlation function</i>
----------	---

Description

Function designed to find the phi parameter such that the correlation between points within a given distance d is at most a given value.

Usage

```
find_phi(d, kappa = 0.5, range = c(1e-04, 1), cut = 0.05)
```

Arguments

<code>d</code>	maximum distance for spatial dependence equal to cut.
<code>kappa</code>	smoothness parameter associated with the Matern cov. function.
<code>range</code>	Minimum and maximum distance to be considered.
<code>cut</code>	Spatial correlation at a distance d .

Value

real number

fit_spm	<i>Fitting an underlying continuous process to areal data</i>
---------	---

Description

Fitting an underlying continuous process to areal data

Usage

```
fit_spm(x, ...)

## S3 method for class 'spm'
fit_spm(
  x,
  model,
  theta_st,
  kappa = NULL,
  apply_exp = FALSE,
  opt_method = "Nelder-Mead",
  control_opt = list(),
  comp_hess = TRUE,
```

```

    ...
)

fit_spm2(x, model, kappa, comp_hess = TRUE, phi_min, phi_max, nphi = 10)

```

Arguments

<code>x</code>	an object of type <code>spm</code> . Note that, the dimension of <code>theta_st</code> depends on the 2 factors. 1) the number of variables being analyzed, and 2) if the input is a <code>spm</code> object.
<code>...</code>	additionnal parameters, either passed to <code>optim</code> .
<code>model</code>	a character scalar indicating the family of the covariance function to be used. The options are <code>c("matern", "pexp", "gaussian", "spherical")</code> .
<code>theta_st</code>	a numeric (named) vector containing the initial parameters.
<code>kappa</code>	a numeric value indicating either the κ paramater from the Matern covariance function (controlling the process differentiability), or the "pexp" for the Powered Exponential family. If the model chosen by the user is Matern and kappa is not informed, it is automatically set to .5. On the other hand, if the user choses the Powered Exponential family and do not inform kappa, then it is set to 1. In both cases, the covariance function becomes the so covalled exponential covariance function.
<code>apply_exp</code>	a logical scalar indicating wheter the parameters that cannot assume negative values should be exponentiate or not.
<code>opt_method</code>	a character scalar indicating the optimization algorithm to be used. For details, see <code>optim</code> .
<code>control_opt</code>	a named list containing the control arguments for the optimization algorithm to be used. For details, see <code>optim</code> .
<code>comp_hess</code>	a boolean indicating whether the Hessian matrix should be computed.
<code>phi_min</code>	a numeric scalar representing the minimum <i>phi</i> value to look for.
<code>phi_max</code>	a numeric scalar representing the maximum <i>phi</i> value to look for.
<code>nphi</code>	a numeric scalar indicating the number of values to compute a grid-search over <i>phi</i> .

Details

This function uses the `optim` function optimization algorithms to find the Maximum Likelihood estimators, and their standard errors, from a model adapted from. The function allows the user to input the control parameters from the `optim` function through the argument `control_opt`, which is a named list. Additionally, the one can input lower and upper boundaries for the optimization problem, as well as the preferred optimization algorithm (as long as it is available for `optim`). The preferred algorithm is selected by the argument `opt_method`. In addition to the control of the optimization, the user can select a covariance function among the following: Matern, Exponential, Powered Exponential, Gaussian, and Spherical. The parameter `apply_exp` is a logical scalar such that, if set to `TRUE`, the `exp` function is applied to the nonnegative parameters, allowing the optimization algorithm to search for all the parameters over the real numbers.

The model assumes $Y(\mathbf{s}) = \mu + S(\mathbf{s})$ at the point level. Where $S \sim GP(0, \sigma^2 C(\lVert \mathbf{s} - \mathbf{s}_2 \rVert; \theta))$. Further, the observed data is supposed to be $Y(B) = \lVert B \rVert^{-1} \int_B Y(\mathbf{s}) \, d\mathbf{s}$.

Value

a `spm_fit` object.

<code>goodness_of_fit</code>	<i>Akaike's (and Bayesian) An Information Criterion for <code>spm_fit</code> objects.</i>
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Description

Akaike's (and Bayesian) An Information Criterion for `spm_fit` objects.

Usage

```
## S3 method for class 'spm_fit'
AIC(object, ..., k = 2)

## S3 method for class 'spm_fit'
BIC(object, ...)
```

Arguments

<code>object</code>	a <code>spm_fit</code> object.
<code>...</code>	optionally more fitted model objects.
<code>k</code>	numeric, the <i>penalty</i> per parameter to be used; the default ' <code>k = 2</code> ' is the classical AIC. (for compatibility with <code>stats::AIC</code> .)

Value

a numeric scalar corresponding to the goodness of fit measure.

liv_lsoa	<i>Liverpool Lower Super Output Area.</i>
----------	---

Description

A dataset containing containing the LSOA's for Liverpool along with estimates for Index of Multiple Deprivation. Data taken from [Johnson et al. 2020](#)

Usage

```
liv_lsoa
```

Format

A sf data frame with 298 rows and 6 variables:

lsoa11cd LSOA code

lsoa11cd LSOA name

male Male population

female Female population

imdscore Index of Multiple Deprivation

area LMSOA area, in km^2

Details

The data was projected to EPSG 27700 and units changed to km

Source

<https://ij-healthgeographics.biomedcentral.com/articles/10.1186/s12942-020-00200-w>

liv_msoa	<i>Liverpool Middle Super Output Area.</i>
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Description

A dataset containing containing the MSOA's for Liverpool along with estimates for Life Expectancy at Birth. Data taken from [Johnson et al. 2020](#)

Usage

```
liv_msoa
```

Format

A sf data frame with 61 rows and 4 variables:

msoa11cd MSOA code

msoa11cd MSOA name

lev_est Estimated life expectancy at birth, in years

area MSOA area, in km^2

Details

The data was projected to EPSG 27700 and units changed to km

Source

<https://ij-healthgeographics.biomedcentral.com/articles/10.1186/s12942-020-00200-w>

nyc_comd	<i>New York City community districts spatial geometries</i>
----------	---

Description

A dataset containing containing the CD's for New York City.

Usage

nyc_comd

Format

A sf data frame with 71 rows and 3 variables:

boro_cd unique identifier

shape_area Shape Area

shape_length Shape Length

est median income estimated using areal interpolation

se_est standard error associated with the estimates

Details

The data is project using EPSG 4326.

nyc_surv	<i>New York City survey data.</i>
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Description

A dataset containing the census tracts for New York City along with estimates for median income and a margin of error for this estimates.

Usage

```
nyc_surv
```

Format

A sf data frame with 2128 rows and 5 variables:

GEOID unique identifier

NAME census tract name

variable variable estimated

estimate median income estimate

moe median income estimate margin of error

Details

The data is project using EPSG 4326.

predict_spm	<i>Prediction over the same or a different set of regions (or points).</i>
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Description

Realizes predictions that can be useful when researchers are interested in predict a variable observed in one political division of a city (or state) on another division of the same region.

Usage

```
predict_spm(x, ...)
```

```
## S3 method for class 'spm_fit'
```

```
predict_spm(x, .aggregate = TRUE, ...)
```

```
## S3 method for class 'sf'
```

```
predict_spm(x, spm_obj, .aggregate = TRUE, n_pts, type, ...)
```


Arguments

<code>x</code>	a sf object such that its geometris are either points or polygons.
<code>...</code>	additional parameters
<code>.aggregate</code>	logical. Should the predictions be aggregated? In case the input is only a "fit" object, the aggregation is made over the polygons on which the original data was observed. In case the input x is composed by sf POLYGONS, the aggregation is made over this new partition of the study region.
<code>spm_obj</code>	an object of either class <code>spm_fit</code> or <code>mspm_fit</code>
<code>n_pts</code>	a numeric scalar standing for number of points to form a grid over the whole region to make the predictions
<code>type</code>	character type of grid to be generated. See <code>st_sample</code> in the package sf.

Value

an object of class `spm_pred`

<code>sf_to_spm</code>	<i>single sf to spm</i>
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Description

Transforming a sf into a spm object (Internal use)

Usage

```
single_sf_to_spm(
  sf_obj,
  n_pts,
  type = "regular",
  by_polygon = FALSE,
  poly_ids = NULL,
  var_ids = NULL
)

sf_to_spm(
  sf_obj,
  n_pts,
  type = "regular",
  by_polygon = FALSE,
  poly_ids = NULL,
  var_ids = NULL
)
```

Arguments

sf_obj	a sf object s.t. its geometries are polygons.
n_pts	a numeric scalar representing the number of points to create a grid in the study region on which the polygons in sf_obj is observed. Alternatively, it can be a vector of the same length as nrow(sf_obj). In this case, it generates the given number of points for each polygon in sf_obj.
type	a character indicating the type of grid to be generated. The options are c("random", "regular", "hexag"). For more details, see st_sample in the sf package.
by_polygon	a logical indicating wheter we should generate n_pts by polygon or for the n_pts for the whole study region.
poly_ids	a character vector informing the name of the variable in sf_obj that represents the polygons unique identifiers. In case this is not informed, we assume the id of the polygons are given by their row numbers.
var_ids	a scalar or vector of type character indicating the (numerical) variables that are going to be analyzed.

Value

a list.

summary_spm_fit	<i>summarizing_spm_fit</i>
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Description

summarizing_spm_fit

Usage

```
summary_spm_fit(x, sig = 0.05)
```

Arguments

x	a spm_fit object
sig	significance level

vdl	<i>Voronoi Data Linkage</i>
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Description

Reminder, have to create an example.

Usage

```
vdl(coords_sf, areal_sf, vars, buff)
```

Arguments

coords_sf	sf POINT target dataset.
areal_sf	sf POLYGON source dataset.
vars	a character representing the variables (observed at the source - polygon) to be estimated at the target data.
buff	scalar numeric. Mostly for internal use.

Value

a sf object for the coords_sf spatial data set.

vdl_var	<i>Voronoi Data Linkage - Single variable and variance</i>
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Description

Reminder, have to create an example.

Usage

```
vdl_var(coords_sf, areal_sf, res_var, variance, var_method = "CS", buff)
```

Arguments

coords_sf	sf POINT target dataset.
areal_sf	sf POLYGON source dataset.
res_var	a character - the name of the variable in the areal_sf to be estimated in the coords_sf.
variance	a character - the name of the variable variance in the areal_sf to be estimated in the coords_sf.
var_method	a character representing the method to approximate the variance of the AI estimates. Possible values are "CS" (Cauchy-Schwartz) or "MI" (Moran's I).
buff	scalar numeric. Mostly for internal use.

Value

a sf object, containing the `id_coords` variable and the `list_vars` for the `coords_sf` spatial data set.

Index

* datasets

liv_lsoa, [6](#)

liv_msoa, [6](#)

nyc_comd, [7](#)

nyc_surv, [8](#)

AI, [2](#)

ai (AI), [2](#)

ai_var (AI), [2](#)

AIC.spm_fit (goodness_of_fit), [5](#)

BIC.spm_fit (goodness_of_fit), [5](#)

find_phi, [3](#)

fit_spm, [3](#)

fit_spm2 (fit_spm), [3](#)

goodness_of_fit, [5](#)

liv_lsoa, [6](#)

liv_msoa, [6](#)

nyc_comd, [7](#)

nyc_surv, [8](#)

predict_spm, [8](#)

sf_to_spm, [9](#)

single_sf_to_spm (sf_to_spm), [9](#)

summary_spm_fit, [10](#)

vd1, [11](#)

vd1_var, [11](#)