# Package ‘MetricGraph’ 

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## Type Package

Title Random Fields on Metric Graphs
Version 1.3.0
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Description Facilitates creation and manipulation of metric graphs, such as street or river networks. Further facilitates operations and visualizations of data on metric graphs, and the creation of a large class of random fields and stochastic partial differential equations on such spaces. These random fields can be used for simulation, prediction and inference. In particular, linear mixed effects models including random field components can be fitted to data based on computationally efficient sparse matrix representations. Interfaces to the R packages 'INLA' and 'inlabru' are also provided, which facilitate working with Bayesian statistical models on metric graphs. The main references for the methods are Bolin, Simas and Wallin (2024) [doi:10.3150/23-BEJ1647](doi:10.3150/23-BEJ1647), Bolin, Kovacs, Kumar and Simas (2023) [doi:10.1090/mcom/3929](doi:10.1090/mcom/3929) and Bolin, Simas and Wallin (2023) [doi:10.48550/arXiv.2304.03190](doi:10.48550/arXiv.2304.03190) a
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Additional_repositories https://inla.r-inla-download.org/R/testing
BugReports https://github.com/davidbolin/MetricGraph/issues
URL https://davidbolin.github.io/MetricGraph/
Copyright The R package and code, and the main programs, were written by and are Copyright by David Bolin, Alexandre B. Simas and Jonas Wallin, and are redistributable under the GNU Public License, version 2 or later. The package also includes partial codes from another package, which was deprecated in Oct-2023, and whose codes are under the GPL-2 license. For details see the COPYRIGHTS file.

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## Description

'MetricGraph' is used for creation and manipulation of metric graphs, such as street or river networks. It also has several functions thatfacilitates operations and visualizations of data on metric graphs, and the creation of a large class of random fields and stochastic partial differential equations on such spaces. The main models are the Whittle-Matérn fields, which are specified through the fractional elliptic SPDE

$$
\left(\kappa^{2}-\Delta\right)^{\alpha / 2}(\tau u(s))=W
$$

$\kappa, \tau>0$ and $\alpha>1 / 2$ are parameters and $W$ is Gaussian white noise. It contains exact implementations of the above model for $\alpha=1$ and $\alpha=2$, and contains approximate implementations, via the finite element method, for any $\alpha>0.5$. It also implements models based on graph Laplacians and isotropic covariance functions. Several utility functions for specifying graphs, computing likelihoods, performing prediction, simulating processes, and visualizing results on metric graphs are provided. In particular, linear mixed effects models including random field components can be fitted to data based on computationally efficient sparse matrix representations. Interfaces to the R packages 'INLA' and 'inlabru' are also provided, which facilitate working with Bayesian statistical models on metric graphs.

## Details

At the heart of the package is the R6 class [metric_graph()]. This is used for specifying metric graphs, and contains various utility functions which are needed for specifying Gaussian processes on such spaces.
Linear mixed effects models are provided (see [graph_lme]) and perform predictions (see [predict.graph_lme]). The package also has interfaces for 'INLA' (see [graph_spde]), and it this interface also works with 'inlabru'.
For a more detailed introduction to the package, see the 'MetricGraph' Vignettes.

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## See Also

Useful links:

- https://davidbolin.github.io/MetricGraph/
- Report bugs at https://github.com/davidbolin/MetricGraph/issues

> augment.graph_lme Augment data with information from a graph_lme object

## Description

Augment accepts a model object and a dataset and adds information about each observation in the dataset. It includes predicted values in the .fitted column, residuals in the .resid column, and standard errors for the fitted values in a . se.fit column. It also contains the New columns always begin with a . prefix to avoid overwriting columns in the original dataset.

## Usage

```
## S3 method for class 'graph_lme'
augment(
        x,
        newdata = NULL,
        which_repl = NULL,
        sd_post_re = FALSE,
        se_fit = FALSE,
        conf_int = FALSE,
        pred_int = FALSE,
        level = 0.95,
        edge_number = "edge_number",
        distance_on_edge = "distance_on_edge",
        coord_x = "coord_x",
        coord_y = "coord_y",
        data_coords = c("PtE", "spatial"),
        normalized = FALSE,
        no_nugget = FALSE,
        check_euclidean = FALSE,
    )
```


## Arguments

\(\left.$$
\begin{array}{ll}\text { x } & \text { A graph_lme object. } \\
\text { newdata } & \begin{array}{l}\text { A data. frame or a list containing the covariates, the edge number and the } \\
\text { distance on edge for the locations to obtain the prediction. If NULL, the fitted } \\
\text { values will be given for the original locations where the model was fitted. }\end{array} \\
\text { which_repl } & \begin{array}{l}\text { Which replicates to obtain the prediction. If NULL predictions will be obtained } \\
\text { for all replicates. Default is NULL. }\end{array} \\
\text { sd_post_re } & \begin{array}{l}\text { Logical indicating whether or not a .sd_post_re column should be added to the } \\
\text { augmented output containing the posterior standard deviations of the random } \\
\text { effects. }\end{array}
$$ <br>
Logical indicating whether or not a .se_fit column should be added to the aug- <br>

mented output containing the standard errors of the fitted values. If TRUE, the\end{array}\right]\)| posterior standard deviations of the random effects will also be returned. |
| :--- |
| conf_int |

Check if the graph used to compute the resistance distance has Euclidean edges? The graph used to compute the resistance distance has the observation locations as vertices.
... Additional arguments.

## Value

A tidyr::tibble() with columns:

- . fitted Fitted or predicted value.
- . relwrconf Lower bound of the confidence interval of the random effects, if conf_int = TRUE
- . reuprconf Upper bound of the confidence interval of the random effects, if conf_int = TRUE
- .fittedlwrpred Lower bound of the prediction interval, if conf_int = TRUE
- . fitteduprpred Upper bound of the prediction interval, if conf_int = TRUE
- . fixed Prediction of the fixed effects.
- . random Prediction of the random effects.
- . resid The ordinary residuals, that is, the difference between observed and fitted values.
- .std_resid The standardized residuals, that is, the ordinary residuals divided by the standard error of the fitted values (by the prediction standard error), if se_fit $=$ TRUE or pred_int $=$ TRUE.
- . se_fit Standard errors of fitted values, if se_fit = TRUE.
- .sd_post_re Standard deviation of the posterior mean of the random effects, if se_fit = TRUE.


## See Also

glance.graph_lme

```
bru_mapper.inla_metric_graph_spde
                        Metric graph 'inlabru' mapper
```


## Description

Metric graph 'inlabru' mapper

## Usage

bru_get_mapper.inla_metric_graph_spde(model, ...)
ibm_n.bru_mapper_inla_metric_graph_spde(mapper, ...)
ibm_values.bru_mapper_inla_metric_graph_spde(mapper, ...)
ibm_jacobian.bru_mapper_inla_metric_graph_spde(mapper, input, ...)

## Arguments

model An inla_metric_graph_spde for which to construct or extract a mapper
... Arguments passed on to other methods
mapper A bru_mapper.inla_metric_graph_spde object
input The values for which to produce a mapping matrix
drop_na.metric_graph_data
A version of tidyr::drop_na() function for datasets on metric
graphs

## Description

Applies tidyr: : drop_na() function for datasets obtained from a metric graph object.

## Usage

\#\# S3 method for class 'metric_graph_data'
drop_na(data, ...)

## Arguments

data The data list or tidyr::tibble obtained from a metric graph object.
... Additional parameters to be passed to tidyr: : drop_na().

## Value

A tidyr::tibble with the resulting selected columns.
exp_covariance Exponential covariance function

## Description

Evaluates the exponential covariance function

$$
C(h)=\sigma^{2} \exp \{-k a p p a h\}
$$

## Usage

exp_covariance(h, theta)

## Arguments

| h | Distances to evaluate the covariance function at. |
| :--- | :--- |
| theta | A vector c (sigma, kappa), where sigma is the standard deviation and kappa is <br> a range-like parameter. |

## Value

A vector with the values of the covariance function.
filter.metric_graph_data A version of dplyr: : filter() function for datasets on metric graphs

## Description

Applies dplyr: :filter() function for datasets obtained from a metric graph object.

## Usage

\#\# S3 method for class 'metric_graph_data'
filter(.data, ...)

## Arguments

$$
\begin{array}{ll}
. \text { data } & \text { The data list or tidyr: : tibble obtained from a metric graph object. } \\
\ldots & \text { Additional parameters to be passed to dplyr : : filter }() .
\end{array}
$$

## Value

A tidyr: :tibble with the resulting selected columns.
gg_df.metric_graph_spde_result
Data frame for metric_graph_spde_result objects to be used in 'ggplot2'

## Description

Returns a 'ggplot2'-friendly data-frame with the marginal posterior densities.

```
Usage
    ## S3 method for class 'metric_graph_spde_result'
    gg_df(
        result,
        parameter = result$params,
        transform = TRUE,
        restrict_x_axis = parameter,
        restrict_quantiles = list(sigma = c(0, 1), range = c(0, 1), kappa = c(0, 1), sigma =
            c(0, 1)),
    )
```


## Arguments

result A metric_graph_spde_result object.
parameter Vector. Which parameters to get the posterior density in the data.frame? The options are sigma, range or kappa.
transform Should the posterior density be given in the original scale?
restrict_x_axis
Variables to restrict the range of x axis based on quantiles.
restrict_quantiles
List of quantiles to restrict x axis.
... Not being used.

## Value

A data.frame containing the posterior densities.

```
glance.graph_lme Glance at a graph_lme object
```


## Description

Glance accepts a graph_lme object and returns a tidyr: :tibble() with exactly one row of model summaries. The summaries are the square root of the estimated variance of the measurement error, residual degrees of freedom, AIC, BIC, log-likelihood, the type of latent model used in the fit and the total number of observations.

## Usage

```
## S3 method for class 'graph_lme'
```

    glance (x, ...)
    
## Arguments

| x | A graph_lme object. |
| :--- | :--- |
| $\ldots$ | Additional arguments. Currently not used. |

## Value

A tidyr::tibble() with exactly one row and columns:

- nobs Number of observations used.
- sigma the square root of the estimated residual variance
- logLik The log-likelihood of the model.
- AIC Akaike's Information Criterion for the model.
- BIC Bayesian Information Criterion for the model.
- deviance Deviance of the model.
- df.residual Residual degrees of freedom.
- model. type Type of latent model fitted.


## See Also

augment.graph_lme

```
graph_bru_process_data
```

Prepare data frames or data lists to be used with 'inlabru' in metric graphs

## Description

Prepare data frames or data lists to be used with 'inlabru' in metric graphs

## Usage

```
    graph_bru_process_data(
        data,
        edge_number = "edge_number",
        distance_on_edge = "distance_on_edge",
        loc = "loc"
    )
```


## Arguments

data A data.frame or a list containing the covariates, the edge number and the distance on edge for the locations to obtain the prediction.
edge_number Name of the variable that contains the edge number, the default is edge_number.
distance_on_edge
Name of the variable that contains the distance on edge, the default is distance_on_edge.
loc character. Name of the locations to be used in 'inlabru' component.

## Value

A list containing the processed data to be used in a user-friendly manner by 'inlabru'.

```
graph_components Connected components of metric graph
```


## Description

Class representing connected components of a metric graph.

## Details

A list of metric_graph objects (representing the different connected components in the full graph) created from vertex and edge matrices, or from an $\mathrm{sp}::$ SpatialLines object where each line is representing and edge. For more details, see the vignette: vignette("metric_graph", package = "MetricGraph")

## Value

Object of R6Class for creating metric graph components.

## Public fields

graphs List of the graphs representing the connected components.
$n$ The number of graphs.
sizes Number of vertices for each of the graphs.
lengths Total edge lengths for each of the graphs. Create metric graphs for connected components

## Methods

## Public methods:

- graph_components\$new()
- graph_components\$get_largest()
- graph_components\$plot()
- graph_components\$clone()


## Method new():

Usage:
graph_components\$new( edges = NULL, $\mathrm{V}=\mathrm{NULL}$, E = NULL, by_length = TRUE, edge_weights = NULL, ..., lines = deprecated()
)

## Arguments:

edges A list containing coordinates as $m \times 2$ matrices (that is, of matrix type) or $m \times 2$ data frames (data.frame type) of sequence of points connected by straightlines. Alternatively, you can also prove an object of type SpatialLinesDataFrame or SpatialLines (from sp package) or MULTILINESTRING (from sf package).
$\mathrm{V} \mathrm{n} \times 2$ matrix with Euclidean coordinates of the n vertices.
$\mathrm{E} m \times 2$ matrix where each row represents an edge.
by_length Sort the components by total edge length? If FALSE, the components are sorted by the number of vertices.
edge_weights Either a number, a numerical vector with length given by the number of edges, providing the edge weights, or a data.frame with the number of rows being equal to the number of edges, where
... Additional arguments used when specifying the graphs
lines [Deprecated] Use edges instead.
vertex_unit The unit in which the vertices are specified. The options are 'degrees' (the great circle distance in km ), ' km ', 'm' and 'miles'. The default is NULL, which means no unit. However, if you set length_unit, you need to set vertex_unit.
length_unit The unit in which the lengths will be computed. The options are ' km ', ' m ' and 'miles'. The default is vertex_unit. Observe that if vertex_unit is NULL, length_unit can only be NULL. If vertex_unit is 'degrees', then the default value for length_unit is 'km'.
longlat If TRUE, then it is assumed that the coordinates are given. in Longitude/Latitude and that distances should be computed in meters. It takes precedence over vertex_unit and length_unit, and is equivalent to vertex_unit = 'degrees' and length_unit = 'm'.
tolerance Vertices that are closer than this number are merged when constructing the graph $($ default $=1 \mathrm{e}-10)$. If longlat $=$ TRUE, the tolerance is given in km.

Returns: A graph_components object.

Method get_largest(): Returns the largest component in the graph.
Usage:
graph_components\$get_largest()
Returns: A metric_graph object.

Method plot(): Plots all components.
Usage:
graph_components\$plot(edge_colors = NULL, vertex_colors = NULL, ...)

## Arguments:

edge_colors A 3 x nc matrix with RGB values for the edge colors to be used when plotting each graph.
vertex_colors A 3 x nc matrix with RGB values for the edge colors to be used when plotting each graph.
... Additional arguments for plotting the individual graphs.
Returns: A ggplot object.

Method clone(): The objects of this class are cloneable with this method.
Usage:
graph_components\$clone(deep = FALSE)
Arguments:
deep Whether to make a deep clone.

## Examples

```
    library(sp)
    edge1 <- rbind(c(0, 0), c(1, 0))
    edge2 <- rbind(c(1, 0), c(2, 0))
    edge3 <- rbind(c(1, 1), c(2, 1))
    edges <- list(edge1, edge2, edge3)
    graphs <- graph_components$new(edges)
    graphs$plot()
```

    graph_data_spde Data extraction for 'spde' models
    
## Description

Extracts data from metric graphs to be used by 'INLA' and 'inlabru'.

## Usage

```
graph_data_spde(
        graph_spde,
        name = "field",
        repl = NULL,
        group \(=\) NULL,
        group_col = NULL,
        only_pred = FALSE,
        loc_name = NULL,
        tibble = FALSE,
        drop_na = FALSE,
        drop_all_na = TRUE,
        loc = deprecated()
    )
```


## Arguments

graph_spde
name
loc_name
repl Which replicates? If there is no replicates, one can set repl to NULL. If one wants all replicates, then one sets to repl to .all.
group Which groups? If there is no groups, one can set group to NULL. If one wants all groups, then one sets to group to .all.
group_col Which "column" of the data contains the group variable?
only_pred Should only return the data. frame to the prediction data?
An inla_metric_graph_spde object built with the graph_spde() function.
A character string with the base name of the effect.

Character with the name of the location variable to be used in 'inlabru' prediction.

| tibble | Should the data be returned as a tidyr: : tibble? |
| :--- | :--- |
| drop_na | Should the rows with at least one NA for one of the columns be removed? DE- <br> FAULT is FALSE. This option is turned to FALSE if only_pred is TRUE. |
| drop_all_na | Should the rows with all variables being NA be removed? DEFAULT is TRUE. <br> This option is turned to FALSE if only_pred is TRUE. |
| loc | [Deprecated] Use loc_name instead. |

## Value

An 'INLA' and 'inlabru' friendly list with the data.

| graph_lgcp | Simulation of log-Gaussian Cox processes driven by Whittle-Matérn <br> fields on metric graphs |
| :--- | :--- |

## Description

Simulation of log-Gaussian Cox processes driven by Whittle-Matérn fields on metric graphs

## Usage

graph_lgcp( $n=1$, intercept $=0$, sigma, range, alpha, graph)

## Arguments

| n | Number of samples. |
| :--- | :--- |
| intercept | Mean value of the Gaussian process. |
| sigma | Parameter for marginal standard deviations. |
| range | Parameter for practical correlation range. |
| alpha | Smoothness parameter (1 or 2). |
| graph | A metric_graph object. |

## Value

List with Gaussian process sample and simulated points.

## Description

Fitting linear mixed effects model in metric graphs. The random effects can be Gaussian WhittleMatern fields, discrete Gaussian Markov random fields based on the graph Laplacian, as well as Gaussian random fields with isotropic covariance functions.

## Usage

graph_lme( formula, graph,
model = list(type = "linearModel"),
which_repl = NULL,
optim_method = "L-BFGS-B",
possible_methods = c("Nelder-Mead", "L-BFGS-B"),
model_options = list(),
$B C=0$,
previous_fit = NULL,
fix_coeff = FALSE,
parallel = FALSE,
n_cores = parallel: : detectCores() - 1,
optim_controls = list(),
improve_hessian = FALSE,
hessian_args = list(),
check_euclidean = TRUE
)

## Arguments

formula Formula object describing the relation between the response variables and the fixed effects.
graph A metric_graph object.
model The random effects model that will be used (it also includes the option of not having any random effects). It can be either a character, whose options are ' 1 m ', for linear models without random effects; 'WM1' and 'WM2' for WhittleMatern models with $\alpha=1$ and 2, with exact precision matrices, respectively; 'WM' for Whittle-Matern models where one also estimates the smoothness parameter via finite-element method; 'isoExp' for a model with isotropic exponential covariance; 'GL1' and 'GL2' for a SPDE model based on graph Laplacian with $\alpha=1$ and 2, respectively. 'WMD1' is the directed Whittle-Matern with $\alpha=1$. There is also the option to provide it as a list containing the elements type, which can be linearModel, WhittleMatern, graphLaplacian or isoCov. linearModel corresponds to a linear model without random effects.

For WhittleMatern models, that is, if the list contains type = 'WhittleMatern', one can choose between a finite element approximation of the precision matrix by adding fem = TRUE to the list, or to use the exact precision matrix (by setting fem = FALSE). If fem is FALSE, there is also the parameter alpha, to determine the order of the SPDE, which is either 1 or 2. If fem is TRUE and alpha is not specified, then the default value of alpha= 1 will be used. If fem is TRUE and one does not specify alpha, it will be estimated from the data. However, if one wants to have alpha fixed to some value, the user can specify either alpha or nu in the list. See the vignettes for examples. Finally, for type 'WhittleMatern', there is an optional argument, rspde_order, that chooses the order of the rational approximation. By default rspde_order is 2 . Finally, if one wants to fit a nonstationary model, then fem necessarily needs to be TRUE, and one needs to also supply the matrices B. tau and B.kappa or B.range and B. sigma. For graph-Laplacian models, the list must also contain a parameter alpha (which is 1 by default). For isoCov models, the list must contain a parameter cov_function, containing the covariance function. The function accepts a string input for the following covariance functions: 'exp_covariance', 'WM1', 'WM2', 'GL1', 'GL2'. For another covariance function, the function itself must be provided as the cov_function argument. The default is 'exp_covariance', the exponential covariance. We also have covariance-based versions of the Whittle-Matern and graph Laplacian models, however they are much slower, they are the following (string) values for 'cov_function': 'alpha1' and 'alpha2' for Whittle-Matern fields, and 'GL1' and 'GL2' for graph Laplacian models. Finally, for Whittle-Matern models, there is an additional parameter version, which can be either 1 or 2 , to tell which version of the likelihood should be used. Version is 1 by default.
which_repl Vector or list containing which replicates to consider in the model. If NULL all replicates will be considered.
optim_method The method to be used with optim function.
possible_methods
Which methods to try in case the optimization fails or the hessian is not positive definite. The options are 'Nelder-Mead', 'L-BFGS-B', 'BFGS', 'CG' and 'SANN'. By default only 'Nelder-Mead' and 'L-BFGS-B' are considered.
model_options A list containing additional options to be used in the model. Currently, it is possible to fix parameters during the estimation or change the starting values of the parameters. The general structure of the elements of the list is fix_parname and start_parname, where parname stands for the name of the parameter. If fix_parname is not NULL, then the model with be fitted with the parname being fixed at the value that was passed. If start_parname is not NULL, the model will be fitted using the value passed as starting value for parname. the For 'WM' models, the possible elements of the list are: fix_sigma_e, start_sigma_e, fix_nu, start_nu, fix_sigma, start_sigma, fix_range, start_range. Alternatively, one can use fix_sigma_e, start_sigma_e, fix_nu, start_nu, fix_tau, start_tau, fix_kappa, start_kappa. For 'WM1', 'WM2', 'isoExp', 'GL1' and 'GL2' models, the possible elements of the list are fix_sigma_e, start_sigma_e, fix_sigma, start_sigma, fix_range, start_range. Alternatively, one can use fix_sigma_e, start_sigma_e, fix_tau, start_tau, fix_kappa, start_kappa. For 'isoCov' models, the possible values are fix_sigma_e, start_sigma_e, fix_par_vec, start_par_vec. Observe that contrary to the
other models, for 'isoCov' models, both fix_par_vec and start_par_vec should be given as vectors of the size of the dimension of the vector for the input of the covariance function passed to the 'isoCov' model. Furthermore, for 'isoCov' models, fix_par_vec is a logical vector, indicating which parameters to be fixed, and the values will be kept fixed to the values given to start_par_vec, one can also use fix_sigma_e and start_sigma_e for controlling the std. deviation of the measurement error.

BC For WhittleMatern models, decides which boundary condition to use $(0,1)$. Here, 0 is Neumann boundary conditions and 1 specifies stationary boundary conditions.
previous_fit An object of class graph_lme. Use the fitted coefficients as starting values.
fix_coeff If using a previous fit, should all coefficients be fixed at the starting values?
parallel logical. Indicating whether to use optimParallel() or not.
$n_{\text {_cores }} \quad$ Number of cores to be used if parallel is true.
optim_controls Additional controls to be passed to optim() or optimParallel().
improve_hessian
Should a more precise estimate of the hessian be obtained? Turning on might increase the overall time.
hessian_args List of controls to be used if improve_hessian is TRUE. The list can contain the arguments to be passed to the method.args argument in the hessian function. See the help of the hessian function in 'numDeriv' package for details. Observet that it only accepts the "Richardson" method for now, the method "complex" is not supported.
check_euclidean
Check if the graph used to compute the resistance distance has Euclidean edges? The graph used to compute the resistance distance has the observation locations as vertices.

## Value

A list containing the fitted model.

```
graph_spde
```

'INLA' implementation of Whittle-Matérn fields for metric graphs

## Description

This function creates an 'INLA' object that can be used in 'INLA' or 'inlabru' to fit Whittle-Matérn fields on metric graphs.

## Usage

```
graph_spde(
    graph_object,
    alpha = 1,
    stationary_endpoints = "all",
    parameterization = c("matern", "spde"),
    start_range = NULL,
    prior_range = NULL,
    start_kappa = NULL,
    start_sigma = NULL,
    prior_kappa = NULL,
    prior_sigma = NULL,
    shared_lib = "detect",
    debug = FALSE
)
```


## Arguments

graph_object A metric_graph object.
alpha The order of the SPDE.
stationary_endpoints
Which vertices of degree 1 should contain stationary boundary conditions?
parameterization
Which parameterization to be used? The options are 'matern' (sigma and range) and 'spde' (sigma and kappa).
start_range Starting value for range parameter.
prior_range a list containing the elements meanlog and sdlog, that is, the mean and standard deviation of the range parameter on the $\log$ scale. Will not be used if prior.kappa is non-null.
start_kappa Starting value for kappa.
start_sigma Starting value for sigma.
prior_kappa a list containing the elements meanlog and sdlog, that is, the mean and standard deviation of kappa on the log scale.
prior_sigma a list containing the elements meanlog and sdlog, that is, the mean and standard deviation of sigma on the $\log$ scale.
shared_lib Which shared lib to use for the cgeneric implementation? If "detect", it will check if the shared lib exists locally, in which case it will use it. Otherwise it will use 'INLA's shared library. If 'INLA', it will use the shared lib from 'INLA's installation. If 'MetricGraph', then it will use the local installation (does not work if your installation is from CRAN). Otherwise, you can directly supply the path of the .so (or .dll) file.
debug Should debug be displayed?

## Details

This function is used to construct a Matern SPDE model on a metric graph. The latent field $u$ is the solution of the SPDE

$$
\left(\kappa^{2}-\Delta\right)^{\alpha} u=\sigma W
$$

where $W$ is Gaussian white noise on the metric graph. This model implements exactly the cases in which $\alpha=1$ or $\alpha=2$. For a finite element approximation for general $\alpha$ we refer the reader to the 'rSPDE' package and to the Whittle-Matérn fields with general smoothness vignette.
We also have the alternative parameterization $\rho=\frac{\sqrt{8(\alpha-0.5)}}{\kappa}$, which can be interpreted as a range parameter.
Let $\kappa_{0}$ and $\sigma_{0}$ be the starting values for $\kappa$ and $\sigma$, we write $\sigma=\exp \left\{\theta_{1}\right\}$ and $\kappa=\exp \left\{\theta_{2}\right\}$. We assume priors on $\theta_{1}$ and $\theta_{2}$ to be normally distributed with mean, respectively, $\log \left(\sigma_{0}\right)$ and $\log \left(\kappa_{0}\right)$, and variance 10. Similarly, if we let $\rho_{0}$ be the starting value for $\rho$, then we write $\rho=\exp \left\{\theta_{2}\right\}$ and assume a normal prior for $\theta_{2}$, with mean $\log \left(\rho_{0}\right)$ and variance 10 .

## Value

An 'INLA' object.

```
graph_spde_basis Observation/prediction matrices for 'SPDE' models
```


## Description

Constructs observation/prediction weight matrices for metric graph models.

## Usage

graph_spde_basis(graph_spde, repl = NULL, drop_na = FALSE, drop_all_na = TRUE)

## Arguments

| graph_spde | An inla_metric_graph_spde object built with the graph_spde() function. |
| :--- | :--- |
| repl | Which replicates? If there is no replicates, or to use all replicates, one can set to <br> NULL. |
| drop_na | Should the rows with at least one NA for one of the columns be removed? DE- <br> FAULT is FALSE. |
| drop_all_na | Should the rows with all variables being NA be removed? DEFAULT is TRUE. |

## Value

The observation matrix.

## Description

Constructs observation/prediction weight matrices for metric graph models.

## Usage

graph_spde_make_A(graph_spde, repl = NULL)

## Arguments

graph_spde An inla_metric_graph_spde object built with the graph_spde() function.
repl Which replicates? If there is no replicates, or to use all replicates, one can set to NULL.

## Value

The observation matrix.

## Description

Computes appropriate starting values for optimization of Gaussian random field models on metric graphs.

## Usage

```
graph_starting_values(
        graph,
    model = c("alpha1", "alpha2", "isoExp", "GL1", "GL2"),
    data = TRUE,
    data_name = NULL,
    range_par = FALSE,
    nu = FALSE,
    manual_data = NULL,
    like_format = FALSE,
    log_scale = FALSE,
    model_options = list(),
    rec_tau = TRUE
)
```


## Arguments

| graph | A metric_graph object. |
| :--- | :--- |
| model | Type of model, "alpha1", "alpha2", "isoExp", "GL1", and "GL2" are supported. |
| data | Should the data be used to obtain improved starting values? |
| data_name | The name of the response variable in graph\$data. |
| range_par | Should an initial value for range parameter be returned instead of for kappa? |
| nu | Should an initial value for nu be returned? |
| manual_data | A vector (or matrix) of response variables. |
| like_format | Should the starting values be returned with sigma.e as the last element? This is <br> the format for the likelihood constructor from the 'rSPDE' package. |
| log_scale | Should the initial values be returned in log scale? |
| model_options | List object containing the model options. |
| rec_tau | Should a starting value for the reciprocal of tau be given? |

Value
A vector, c(start_sigma_e, start_sigma, start_kappa)

## Description

Create lines for package name

## Usage

logo_lines()

## Value

SpatialLines object with package name.
make_Q_euler Space-time precision operator Euler discretization

## Description

The precision matrix for all vertices for space-time field

## Usage

make_Q_euler(graph, t, kappa, rho, gamma, alpha, beta, sigma, theta = 1)

## Arguments

| graph | A metric_graph object. |
| :--- | :--- |
| t | Vector of time points. |
| kappa | Spatial range parameter. |
| rho | Drift parameter. |
| gamma | Temporal range parameter. |
| alpha | Smoothness parameter (integer) for spatial operator. |
| beta | Smoothness parameter (integer) for Q-Wiener process. |
| sigma | Variance parameter. |
| theta | Parameter theta for the Euler scheme. |

## Value

Precision matrix.

```
make_Q_spacetime Space-time precision operator discretization
```


## Description

The precision matrix for all vertices for space-time field.

## Usage

make_Q_spacetime(graph, t, kappa, rho, gamma, alpha, beta, sigma)

## Arguments

| graph | A metric_graph object. |
| :--- | :--- |
| t | Vector of time points. |
| kappa | Spatial range parameter. |
| rho | Drift parameter. |
| gamma | Temporal range parameter. |
| alpha | Smoothness parameter (integer) for spatial operator. |
| beta | Smoothness parameter (integer) for Q-Wiener process. |
| sigma | Variance parameter. |

## Value

Precision matrix.

```
metric_graph Metric graph
```


## Description

Class representing a general metric graph.

## Details

A graph object created from vertex and edge matrices, or from an $\mathrm{sp}:$ : SpatialLines object where each line is representing and edge. For more details, see the vignette: vignette("metric_graph", package = "MetricGraph")

## Value

Object of R6Class for creating metric graphs.

## Public fields

V Matrix with positions in Euclidean space of the vertices of the graph.
$n \vee$ The number of vertices.
$E$ Matrix with the edges of the graph, where each row represents an edge, $\mathrm{E}[\mathrm{i}, 1]$ is the vertex at the start of the ith edge and $\mathrm{E}[\mathrm{i}, 2]$ is the vertex at the end of the edge.
$n E$ The number of edges.
edge_lengths Vector with the lengths of the edges in the graph.
C Constraint matrix used to set Kirchhoff constraints.
CoB Change-of-basis object used for Kirchhoff constraints.
PtV Vector with the indices of the vertices which are observation locations.
mesh Mesh object used for plotting.
edges The coordinates of the edges in the graph.
vertices The coordinates of the vertices in the graph, along with several attributes.
geo_dist Geodesic distances between the vertices in the graph.
res_dist Resistance distances between the observation locations.
Laplacian The weighted graph Laplacian of the vertices in the graph. The weights are given by the edge lengths.
characteristics List with various characteristics of the graph.

## Methods

## Public methods:

- metric_graph\$new()
- metric_graph\$set_edge_weights()
- metric_graph\$get_edge_weights()
- metric_graph\$get_vertices_incomp_dir()
- metric_graph\$summary()
- metric_graph\$print()
- metric_graph\$compute_characteristics()
- metric_graph\$check_euclidean()
- metric_graph\$check_distance_consistency()
- metric_graph\$compute_geodist()
- metric_graph\$compute_geodist_PtE()
- metric_graph\$compute_geodist_mesh()
- metric_graph\$compute_resdist()
- metric_graph\$compute_resdist_PtE()
- metric_graph\$get_degrees()
- metric_graph\$compute_PtE_edges()
- metric_graph\$compute_resdist_mesh()
- metric_graph\$compute_laplacian()
- metric_graph\$prune_vertices()
- metric_graph\$get_groups()
- metric_graph\$get_PtE()
- metric_graph\$get_edge_lengths()
- metric_graph\$get_locations()
- metric_graph\$observation_to_vertex()
- metric_graph\$edgeweight_to_data()
- metric_graph\$get_mesh_locations()
- metric_graph\$clear_observations()
- metric_graph\$process_data()
- metric_graph\$add_observations()
- metric_graph\$mutate()

```
- metric_graph$drop_na()
- metric_graph$select()
- metric_graph$filter()
- metric_graph$summarise()
- metric_graph$get_data()
- metric_graph$buildDirectionalConstraints()
- metric_graph$buildC()
- metric_graph$build_mesh()
- metric_graph$compute_fem()
- metric_graph$mesh_A()
- metric_graph$fem_basis()
- metric_graph$VtEfirst()
- metric_graph$plot()
- metric_graph$plot_connections()
- metric_graph$is_tree()
- metric_graph$plot_function()
- metric_graph$plot_movie()
- metric_graph$add_mesh_observations()
- metric_graph$get_initial_graph()
- metric_graph$coordinates()
- metric_graph$clone()
```

Method new(): Create a new metric_graph object.

```
Usage:
metric_graph$new(
    edges = NULL,
    V = NULL,
    E = NULL,
    vertex_unit = NULL,
    length_unit = vertex_unit,
    edge_weights = 1,
    kirchhoff_weights = NULL,
    longlat = FALSE,
    crs = NULL,
    proj4string = NULL,
    which_longlat = "sp",
    project = FALSE,
    project_data = FALSE,
    which_projection = "Winkel tripel",
    tolerance = list(vertex_vertex = 0.001, vertex_edge = 0.001, edge_edge = 0),
    check_connected = TRUE,
    remove_deg2 = FALSE,
    merge_close_vertices = TRUE,
    factor_merge_close_vertices = 1,
    remove_circles = TRUE,
```

```
    verbose = 1,
    lines = deprecated()
)
```

Arguments:
edges A list containing coordinates as $m \times 2$ matrices (that is, of matrix type) or $m \times 2$ data frames (data.frame type) of sequence of points connected by straightlines. Alternatively, you can also prove an object of type SpatialLinesDataFrame or SpatialLines (from sp package) or MULTILINESTRING (from sf package).
V nx 2 matrix with Euclidean coordinates of the n vertices.
$\mathrm{E} m \times 2$ matrix where each row represents one of the $m$ edges.
vertex_unit The unit in which the vertices are specified. The options are 'degrees' (the great circle distance in km), 'km', 'm' and 'miles'. The default is NULL, which means no unit. However, if you set length_unit, you need to set vertex_unit.
length_unit The unit in which the lengths will be computed. The options are 'km', 'm' and 'miles'. The default is vertex_unit. Observe that if vertex_unit is NULL, length_unit can only be NULL. If vertex_unit is 'degrees', then the default value for length_unit is 'km'.
edge_weights Either a number, a numerical vector with length given by the number of edges, providing the edge weights, or a data. frame with the number of rows being equal to the number of edges, where each row gives a vector of weights to its corresponding edge. Can be changed by using the set_edge_weights() method.
kirchhoff_weights If non-null, the name (or number) of the column of edge_weights that contain the Kirchhoff weights. Must be equal to 1 (or TRUE) in case edge_weights is a single number and those are the Kirchhoff weights.
longlat If TRUE, then it is assumed that the coordinates are given. in Longitude/Latitude and that distances should be computed in meters. If TRUE it takes precedence over vertex_unit and length_unit, and is equivalent to vertex_unit = 'degrees' and length_unit = 'm'.
crs Coordinate reference system to be used in case longlat is set to TRUE and which_longlat is sf. Object of class crs. The default is sf: :st_crs(4326).
proj4string Projection string of class CRS-class to be used in case longlat is set to TRUE and which_longlat is sp. The default is sp: :CRS("+proj=longlat +datum=WGS84").
which_longlat Compute the distance using which package? The options are sp and sf. The default is sp .
project If longlat is TRUE should a projection be used to compute the distances to be used for the tolerances (see tolerance below)? The default is FALSE. When TRUE, the construction of the graph is faster.
project_data If longlat is TRUE should the vertices be project to planar coordinates? The default is FALSE. When TRUE, the construction of the graph is faster.
which_projection Which projection should be used in case project is TRUE? The options are Robinson, Winkel tripel or a proj4string. The default is Winkel tripel.
tolerance List that provides tolerances during the construction of the graph:

- vertex_vertex Vertices that are closer than this number are merged (default $=1 \mathrm{e}-7$ ).
- vertex_edge If a vertex at the end of one edge is closer than this number to another edge, this vertex is connected to that edge (default = 1e-7). Previously vertex_line, which is now deprecated.
- edge_edge If two edges at some point are closer than this number, a new vertex is added at that point and the two edges are connected (default $=0$ ).
- vertex_line, Deprecated. Use vertex_edge instead.
- line_line, Deprecated. Use edge_edge instead.

In case longlat = TRUE, the tolerances are given in length_unit.
check_connected If TRUE, it is checked whether the graph is connected and a warning is given if this is not the case.
remove_deg2 Set to TRUE to remove all vertices of degree 2 in the initialization. Default is FALSE.
merge_close_vertices should an additional step to merge close vertices be done?
factor_merge_close_vertices Which factor to be multiplied by tolerance vertex_vertex when merging close vertices at the additional step?
remove_circles All circlular edges with a length smaller than this number are removed. If TRUE, the vertex_vertex tolerance will be used. If FALSE, no circles will be removed.
verbose Print progress of graph creation. There are 3 levels of verbose, level 0,1 and 2 . In level 0 , no messages are printed. In level 1 , only messages regarding important steps are printed. Finally, in level 2, messages detailing all the steps are printed. The default is 1 .
lines [Deprecated] Use edges instead.
Details: A graph object can be initialized in two ways. The first method is to specify V and E. In this case, all edges are assumed to be straight lines. The second option is to specify the graph via the lines input. In this case, the vertices are set by the end points of the lines. Thus, if two lines are intersecting somewhere else, this will not be viewed as a vertex.

Returns: A metric_graph object.
Method set_edge_weights(): Sets the edge weights

```
Usage:
metric_graph$set_edge_weights(
    weights = rep(1, self$nE),
    kirchhoff_weights = NULL
)
```

Arguments:
weights Either a number, a numerical vector with length given by the number of edges, providing the edge weights, or a data.frame with the number of rows being equal to the number of edges, where each row gives a vector of weights to its corresponding edge.
kirchhoff_weights If non-null, the name (or number) of the column of weights that contain the Kirchhoff weights. Must be equal to 1 (or TRUE) in case weights is a single number and those are the Kirchhoff weights.
Returns: No return value. Called for its side effects.
Method get_edge_weights(): Gets the edge weights
Usage:
metric_graph\$get_edge_weights(data.frame = FALSE, tibble = TRUE)
Arguments:
data. frame If the edge weights are given as vectors, should the result be returned as a data.frame?
tibble Should the edge weights be returned as tibble?
Returns: A vector or data.frame containing the edge weights.
Method get_vertices_incomp_dir(): Gets vertices with incompatible directions

## Usage:

metric_graph\$get_vertices_incomp_dir()
Returns: A vector containing the vertices with incompatible directions.
Method summary (): Prints a summary of various informations of the graph
Usage:
metric_graph\$summary(
messages = FALSE, compute_characteristics = TRUE, check_euclidean = TRUE, check_distance_consistency = TRUE
)
Arguments:
messages Should message explaining how to build the results be given for missing quantities?
compute_characteristics Should the characteristics of the graph be computed?
check_euclidean Check if the graph has Euclidean edges?
check_distance_consistency Check the distance consistency assumption?
Returns: No return value. Called for its side effects.
Method print(): Prints various characteristics of the graph
Usage:
metric_graph\$print()
Returns: No return value. Called for its side effects.
Method compute_characteristics(): Computes various characteristics of the graph
Usage:
metric_graph\$compute_characteristics(check_euclidean = FALSE)
Arguments:
check_euclidean Also check if the graph has Euclidean edges? This essentially means that the distance consistency check will also be perfomed. If the graph does not have Euclidean edges due to another reason rather than the distance consistency, then it will already be indicated that the graph does not have Euclidean edges.
Returns: No return value. Called for its side effects. The computed characteristics are stored in the characteristics element of the metric_graph object.

Method check_euclidean(): Check if the graph has Euclidean edges.
Usage:
metric_graph\$check_euclidean()

Returns: Returns TRUE if the graph has Euclidean edges, or FALSE otherwise. The result is stored in the characteristics element of the metric_graph object. The result is displayed when the graph is printed.

Method check_distance_consistency(): Checks distance consistency of the graph.
Usage:
metric_graph\$check_distance_consistency()
Returns: No return value. The result is stored in the characteristics element of the metric_graph object. The result is displayed when the graph is printed.

Method compute_geodist(): Computes shortest path distances between the vertices in the graph

Usage:
metric_graph\$compute_geodist(full = FALSE, obs = TRUE, group = NULL)
Arguments:
full Should the geodesic distances be computed for all the available locations? If FALSE, it will be computed separately for the locations of each group.
obs Should the geodesic distances be computed at the observation locations?
group Vector or list containing which groups to compute the distance for. If NULL, it will be computed for all groups.

Returns: No return value. Called for its side effects. The computed geodesic distances are stored in the geo_dist element of the metric_graph object.

Method compute_geodist_PtE(): Computes shortest path distances between the vertices in the graph.

```
Usage:
metric_graph$compute_geodist_PtE(
    PtE,
    normalized = TRUE,
    include_vertices = TRUE
)
Arguments:
```

PtE Points to compute the metric for.
normalized are the locations in PtE in normalized distance?
include_vertices Should the original vertices be included in the distance matrix?
Returns: A matrix containing the geodesic distances.
Method compute_geodist_mesh(): Computes shortest path distances between the vertices in the mesh.
Usage:
metric_graph\$compute_geodist_mesh()
Returns: No return value. Called for its side effects. The geodesic distances on the mesh are stored in mesh\$geo_dist in the metric_graph object.

Method compute_resdist(): Computes the resistance distance between the observation locations.

```
Usage:
metric_graph$compute_resdist(
    full = FALSE,
    obs = TRUE,
    group = NULL,
    check_euclidean = FALSE,
    include_vertices = FALSE
)
```

Arguments:
full Should the resistance distances be computed for all the available locations. If FALSE, it will be computed separately for the locations of each group.
obs Should the resistance distances be computed at the observation locations?
group Vector or list containing which groups to compute the distance for. If NULL, it will be computed for all groups.
check_euclidean Check if the graph used to compute the resistance distance has Euclidean edges? The graph used to compute the resistance distance has the observation locations as vertices.
include_vertices Should the vertices of the graph be also included in the resulting matrix when using FULL=TRUE?
Returns: No return value. Called for its side effects. The geodesic distances are stored in the res_dist element of the metric_graph object.

Method compute_resdist_PtE(): Computes the resistance distance between the observation locations.

```
Usage:
metric_graph$compute_resdist_PtE(
    PtE,
    normalized = TRUE,
    include_vertices = FALSE,
    check_euclidean = FALSE
)
```

Arguments:
PtE Points to compute the metric for.
normalized Are the locations in PtE in normalized distance?
include_vertices Should the original vertices be included in the Laplacian matrix?
check_euclidean Check if the graph used to compute the resistance distance has Euclidean edges? The graph used to compute the resistance distance has the observation locations as vertices.
Returns: A matrix containing the resistance distances.
Method get_degrees(): Returns the degrees of the vertices in the metric graph.
Usage:
metric_graph\$get_degrees(which = "degree")

## Arguments:

which If "degree", returns the degree of the vertex. If "indegree", returns the indegree, and if "outdegree", it returns the outdegree.

Returns: A vector containing the degrees of the vertices.
Method compute_PtE_edges(): Computes the relative positions of the coordinates of the edges and save it as an attribute to each edge. This improves the quality of plots obtained by the plot_function() method, however it might be costly to compute.

Usage:

```
metric_graph$compute_PtE_edges()
```

Returns: No return value, called for its side effects.
Method compute_resdist_mesh(): Computes the resistance metric between the vertices in the mesh.

Usage:
metric_graph\$compute_resdist_mesh()
Returns: No return value. Called for its side effects. The geodesic distances on the mesh are stored in the mesh\$res_dist element in the metric_graph object.

Method compute_laplacian(): Computes the weigthed graph Laplacian for the graph.
Usage:
metric_graph\$compute_laplacian(full = FALSE, obs = TRUE, group = NULL)

## Arguments:

full Should the resistance distances be computed for all the available locations. If FALSE, it will be computed separately for the locations of each group.
obs Should the resistance distances be computed at the observation locations? It will only compute for locations in which there is at least one observations that is not NA.
group Vector or list containing which groups to compute the Laplacian for. If NULL, it will be computed for all groups.

Returns: No reutrn value. Called for its side effects. The Laplacian is stored in the Laplacian element in the metric_graph object.

Method prune_vertices(): Removes vertices of degree 2 from the metric graph.
Usage:
metric_graph\$prune_vertices(check_weights = TRUE, verbose = FALSE)
Arguments:
check_weights If TRUE will only prune edges with different weights.
verbose Print progress of pruning. There are 3 levels of verbose, level 0,1 and 2 . In level 0 , no messages are printed. In level 1 , only messages regarding important steps are printed. Finally, in level 2 , messages detailing all the steps are printed. The default is 1 .

Details: Vertices of degree 2 are removed as long as the corresponding edges that would be merged are compatible in terms of direction.

Returns: No return value. Called for its side effects.

Method get_groups(): Gets the groups from the data.
Usage:
metric_graph\$get_groups(get_cols = FALSE)
Arguments:
get_cols Should the names of the columns that created the group variable be returned?
Returns: A vector containing the available groups in the internal data.
Method get_PtE(): Gets PtE from the data.
Usage:
metric_graph\$get_PtE()

## Arguments:

group For which group, should the PtE be returned? NULL means that all PtEs available will be returned.
include_group Should the group be included as a column? If TRUE, the PtEs for each group will be concatenated, otherwise a single matrix containing the unique PtEs will be returned.
Returns: A matrix with two columns, where the first column contains the edge number and the second column contains the distance on edge of the observation locations.

Method get_edge_lengths(): Gets the edge lengths with the corresponding unit.
Usage:
metric_graph\$get_edge_lengths(unit = NULL)
Arguments:
unit If non-NULL, changes from length_unit from the graph construction to unit.
Returns: a vector with the length unit (if the graph was constructed with a length unit).
Method get_locations(): Gets the spatial locations from the data.
Usage:
metric_graph\$get_locations()
Returns: A data.frame object with observation locations. If longlat = TRUE, the column names are lon and lat, otherwise the column names are x and y .

Method observation_to_vertex(): Adds observation locations as vertices in the graph.
Usage:
metric_graph\$observation_to_vertex(tolerance = 1e-15, mesh_warning = TRUE)

## Arguments:

tolerance Observations locations are merged to a single vertex if they are closer than this number (given in relative edge distance between 0 and 1 ). The default is $1 \mathrm{e}-15$.
mesh_warning Display a warning if the graph structure change and the metric graph has a mesh object.
share_weights Should the same weight be shared among the split edges? If FALSE, the weights will be removed, and a common weight given by 1 will be given.
Returns: No return value. Called for its side effects.

```
Method edgeweight_to_data(): Turns edge weights into data on the metric graph
Usage:
metric_graph$edgeweight_to_data(
    loc = NULL,
    mesh = FALSE,
    data_loc = FALSE,
    weight_col = NULL,
    add = TRUE,
    data_coords = c("PtE", "spatial"),
    normalized = FALSE,
    tibble = TRUE,
    verbose = 1,
    suppress_warnings = FALSE,
    return = FALSE
)
```


## Arguments:

loc A matrix or data.frame with two columns containing the locations to generate the data from the edge weights. If data_coords is 'spatial', the first column must be the x-coordinate of the data, and the second column must be the $y$-coordinate. If data_coords is ' PtE ', the first column must be the edge number and the second column must be the distance on edge.
mesh Should the data be generated to the mesh locations? In this case, the loc argument will be ignored. Observe that the metric graph must have a mesh built for one to use this option. CAUTION: To add edgeweight to data to both the data locations and mesh locations, please, add at the data locations first, then to mesh locations.
data_loc Should the data be generated to the data locations? In this case, the loc argument will be ignored. Observe that the metric graph must have data for one to use this option. CAUTION: To add edgeweight to data to both the data locations and mesh locations, please, add at the data locations first, then to mesh locations.
weight_col Which columns of the edge weights should be turned into data? If NULL, all columns will be turned into data.
add Should the data generated be added to the metric graph internal data?
data_coords To be used only if mesh is FALSE. It decides which coordinate system to use. If PtE, the user must provide edge_number and distance_on_edge, otherwise if spatial, the user must provide coord_x and coord_y.
normalized if TRUE, then the distances in distance_on_edge are assumed to be normalized to $(0,1)$. Default FALSE.
tibble Should the data be returned as a tidyr: :tibble?
verbose Print progress of the steps when adding observations. There are 3 levels of verbose, level 0,1 and 2. In level 0 , no messages are printed. In level 1 , only messages regarding important steps are printed. Finally, in level 2, messages detailing all the steps are printed. The default is 1 .
suppress_warnings Suppress warnings related to duplicated observations?
return Should the data be returned? If return_removed is TRUE, only the removed locations will be return (if there is any).

Method get_mesh_locations(): Returns a list or a matrix with the mesh locations.

Usage:
metric_graph\$get_mesh_locations(bru = FALSE, loc = NULL, normalized = TRUE)

## Arguments:

bru Should an 'inlabru'-friendly list be returned?
loc If bru is set to TRUE, the name of the location variable. The default name is 'loc'.
normalized If TRUE, then the distances in distance_on_edge are assumed to be normalized to $(0,1)$. Default TRUE.
Returns: A list or a matrix containing the mesh locations.
Method clear_observations(): Clear all observations from the metric_graph object.
Usage:
metric_graph\$clear_observations()
Returns: No return value. Called for its side effects.
Method process_data(): Process data to the metric graph data format.

```
Usage:
metric_graph$process_data(
    data = NULL,
    edge_number = "edge_number",
    distance_on_edge = "distance_on_edge",
    coord_x = "coord_x",
    coord_y = "coord_y",
    data_coords = c("PtE", "spatial"),
    group = NULL,
    group_sep = ".",
    normalized = FALSE,
    tibble = TRUE,
    duplicated_strategy = "closest",
    include_distance_to_graph = TRUE,
    only_return_removed = FALSE,
    tolerance = max(self$edge_lengths)/2,
    verbose = FALSE,
    suppress_warnings = FALSE,
    Spoints = lifecycle::deprecated()
)
```


## Arguments:

data A data.frame or named list containing the observations. In case of groups, the data.frames for the groups should be stacked vertically, with a column indicating the index of the group. If data is not NULL, it takes priority over any eventual data in Spoints.
edge_number Column (or entry on the list) of the data that contains the edge numbers. If not supplied, the column with name "edge_number" will be chosen. Will not be used if Spoints is not NULL.
distance_on_edge Column (or entry on the list) of the data that contains the edge numbers. If not supplied, the column with name "distance_on_edge" will be chosen. Will not be used if Spoints is not NULL.
coord_x Column (or entry on the list) of the data that contains the $x$ coordinate. If not supplied, the column with name "coord_x" will be chosen. Will not be used if Spoints is not NULL or if data_coords is PtE.
coord_y Column (or entry on the list) of the data that contains the $y$ coordinate. If not supplied, the column with name "coord_x" will be chosen. Will not be used if Spoints is not NULL or if data_coords is PtE.
data_coords It decides which coordinate system to use. If PtE, the user must provide edge_number and distance_on_edge, otherwise if spatial, the user must provide coord_x and coord_y. The option euclidean is [Deprecated]. Use spatial instead.
group Vector. If the data is grouped (for example measured at different time points), this argument specifies the columns (or entries on the list) in which the group variables are stored. It will be stored as a single column . group with the combined entries.
group_sep separator character for creating the new group variable when grouping two or more variables.
normalized if TRUE, then the distances in distance_on_edge are assumed to be normalized to $(0,1)$. Default FALSE.
tibble Should the data be returned as a tidyr: :tibble?
duplicated_strategy Which strategy to handle observations on the same location on the metric graph (that is, if there are two or more observations projected at the same location). The options are 'closest' and 'jitter'. If 'closest', only the closest observation will be used. If 'jitter', a small perturbation will be performed on the projected observation location. The default is 'closest'.
include_distance_to_graph When data_coord is 'spatial', should the distance of the observations to the graph be included as a column?
only_return_removed Should the removed data (if it exists) when using 'closest' duplicated_strategy be returned instead of the processed data?
tolerance Parameter to control a warning when adding observations. If the distance of some location and the closest point on the graph is greater than the tolerance, the function will display a warning. This helps detecting mistakes on the input locations when adding new data.
verbose If TRUE, report steps and times.
suppress_warnings Suppress warnings related to duplicated observations?
Spoints [Deprecated] Use data instead.
Returns: No return value. Called for its side effects. The observations are stored in the data element of the metric_graph object.

Method add_observations(): Add observations to the metric graph.

```
Usage:
metric_graph$add_observations(
    data = NULL,
    edge_number = "edge_number",
    distance_on_edge = "distance_on_edge",
    coord_x = "coord_x",
    coord_y = "coord_y",
    data_coords = c("PtE", "spatial"),
    group = NULL,
```

```
    group_sep = ".",
    normalized = FALSE,
    clear_obs = FALSE,
    tibble = FALSE,
    tolerance = max(self$edge_lengths)/2,
    duplicated_strategy = "closest",
    include_distance_to_graph = TRUE,
    return_removed = TRUE,
    verbose = 1,
    suppress_warnings = FALSE,
    Spoints = lifecycle::deprecated()
)
```

Arguments:
data A data.frame or named list containing the observations. In case of groups, the data.frames for the groups should be stacked vertically, with a column indicating the index of the group. data can also be an sf object or a SpatialPointsDataFrame object. in which case data_coords will automatically be spatial, and there is no need to specify the coord_x or coord_y arguments.
edge_number Column (or entry on the list) of the data that contains the edge numbers. If not supplied, the column with name "edge_number" will be chosen. Will not be used if Spoints is not NULL.
distance_on_edge Column (or entry on the list) of the data that contains the edge numbers. If not supplied, the column with name "distance_on_edge" will be chosen. Will not be used if Spoints is not NULL.
coord_x Column (or entry on the list) of the data that contains the $x$ coordinate. If not supplied, the column with name "coord_x" will be chosen. Will not be used if Spoints is not NULL or if data_coords is PtE.
coord_y Column (or entry on the list) of the data that contains the y coordinate. If not supplied, the column with name "coord_x" will be chosen. Will not be used if Spoints is not NULL or if data_coords is PtE.
data_coords It decides which coordinate system to use. If PtE , the user must provide edge_number and distance_on_edge, otherwise if spatial, the user must provide coord_x and coord_y. The option euclidean is [Deprecated]. Use spatial instead.
group Vector. If the data is grouped (for example measured at different time points), this argument specifies the columns (or entries on the list) in which the group variables are stored. It will be stored as a single column .group with the combined entries.
group_sep separator character for creating the new group variable when grouping two or more variables.
normalized if TRUE, then the distances in distance_on_edge are assumed to be normalized to $(0,1)$. Default FALSE.
clear_obs Should the existing observations be removed before adding the data?
tibble Should the data be returned as a tidyr: :tibble?
tolerance Parameter to control a warning when adding observations. If the distance of some location and the closest point on the graph is greater than the tolerance, the function will display a warning. This helps detecting mistakes on the input locations when adding new data.
duplicated_strategy Which strategy to handle observations on the same location on the metric graph (that is, if there are two or more observations projected at the same location). The options are 'closest' and 'jitter'. If 'closest', only the closest observation will be used. If 'jitter', a small perturbation will be performed on the projected observation location. The default is 'closest'.
include_distance_to_graph When data_coord is 'spatial', should the distance of the observations to the graph be included as a column?
return_removed Should the removed data (if it exists) when using 'closest' duplicated_strategy be returned?
verbose Print progress of the steps when adding observations. There are 3 levels of verbose, level 0,1 and 2 . In level 0 , no messages are printed. In level 1 , only messages regarding important steps are printed. Finally, in level 2, messages detailing all the steps are printed. The default is 1 .
suppress_warnings Suppress warnings related to duplicated observations?
Spoints [Deprecated] Use data instead.
Returns: No return value. Called for its side effects. The observations are stored in the data element of the metric_graph object.

Method mutate(): Use dplyr: :mutate function on the internal metric graph data object.
Usage:
metric_graph\$mutate(..., .drop_na = FALSE, .drop_all_na = TRUE)
Arguments:
... Arguments to be passed to dplyr: :mutate().
.drop_na Should the rows with at least one NA for one of the columns be removed? DEFAULT is FALSE.
.drop_all_na Should the rows with all variables being NA be removed? DEFAULT is TRUE.
Details: A wrapper to use dplyr: :mutate() within the internal metric graph data object.
Returns: A tidyr::tibble object containing the resulting data list after the mutate.
Method drop_na(): Use tidyr: :drop_na() function on the internal metric graph data object.
Usage:
metric_graph\$drop_na(...)
Arguments:
... Arguments to be passed to tidyr: : drop_na().
Details: A wrapper to use dplyr: : drop_na() within the internal metric graph data object.
Returns: A tidyr::tibble object containing the resulting data list after the drop_na.
Method select(): Use dplyr:: select function on the internal metric graph data object.
Usage:
metric_graph\$select(..., .drop_na = FALSE, .drop_all_na = TRUE)
Arguments:
... Arguments to be passed to dplyr: : select().
.drop_na Should the rows with at least one NA for one of the columns be removed? DEFAULT is FALSE.
.drop_all_na Should the rows with all variables being NA be removed? DEFAULT is TRUE.
Details: A wrapper to use dplyr: :select() within the internal metric graph data object. Observe that it is a bit different from directly using dplyr: : select () since it does not allow to remove the internal positions that are needed for the metric_graph methods to work.
Returns: A tidyr: :tibble object containing the resulting data list after the selection.
Method filter(): Use dplyr::filter function on the internal metric graph data object.
Usage:
metric_graph\$filter(..., .drop_na = FALSE, .drop_all_na = TRUE)
Arguments:
... Arguments to be passed to dplyr: :filter().
.drop_na Should the rows with at least one NA for one of the columns be removed? DEFAULT is FALSE.
.drop_all_na Should the rows with all variables being NA be removed? DEFAULT is TRUE.
Details: A wrapper to use dplyr: : filter() within the internal metric graph data object.
Returns: A tidyr: : tibble object containing the resulting data list after the filter.
Method summarise(): Use dplyr: : summarise function on the internal metric graph data object grouped by the spatial locations and the internal group variable.

```
Usage:
metric_graph$summarise(
    .include_graph_groups = FALSE,
    .groups = NULL,
    .drop_na = FALSE,
    .drop_all_na = TRUE
)
```

Arguments:
... Arguments to be passed to dplyr: : summarise().
.include_graph_groups Should the internal graph groups be included in the grouping variables? The default is FALSE. This means that, when summarising, the data will be grouped by the internal group variable together with the spatial locations.
.groups A vector of strings containing the names of the columns to be additionally grouped, when computing the summaries. The default is NULL.
.drop_na Should the rows with at least one NA for one of the columns be removed? DEFAULT is FALSE.
.drop_all_na Should the rows with all variables being NA be removed? DEFAULT is TRUE.
Details: A wrapper to use dplyr: : summarise() within the internal metric graph data object grouped by manually inserted groups (optional), the internal group variable (optional) and the spatial locations. Observe that if the integral group variable was not used as a grouping variable for the summarise, a new column, called .group, will be added, with the same value 1 for all rows.

Returns: A tidyr: : tibble object containing the resulting data list after the summarise.
Method get_data(): Return the internal data with the option to filter by groups.
Usage:
metric_graph\$get_data( group = NULL, tibble = TRUE, drop_na = FALSE, drop_all_na = TRUE
)

Arguments:
group A vector contaning which groups should be returned? The default is NULL, which gives the result for the all groups.
tibble Should the data be returned as a tidyr: :tibble?
drop_na Should the rows with at least one NA for one of the columns be removed? DEFAULT is FALSE.
drop_all_na Should the rows with all variables being NA be removed? DEFAULT is TRUE.
Method buildDirectionalConstraints(): Build directional ODE constraint matrix from edges.
Usage:
metric_graph\$buildDirectionalConstraints(alpha = 1)
Arguments:
alpha how many derivatives the processes has
Details: Currently not implemented for circles (edges that start and end in the same vertex)
Returns: No return value. Called for its side effects.
Method buildC(): Build Kirchoff constraint matrix from edges.
Usage:
metric_graph\$buildC(alpha = 2, edge_constraint = FALSE)
Arguments:
alpha the type of constraint (currently only supports 2 )
edge_constraint if TRUE, add constraints on vertices of degree 1
Details: Currently not implemented for circles (edges that start and end in the same vertex)
Returns: No return value. Called for its side effects.
Method build_mesh(): Builds mesh object for graph.

```
Usage:
metric_graph$build_mesh(
    h = NULL,
    n = NULL,
    continuous = TRUE,
    continuous.outs = FALSE,
    continuous.deg2 = FALSE
)
```


## Arguments:

$h$ Maximum distance between mesh nodes (should be provided if n is not provided).
n Maximum number of nodes per edge (should be provided if h is not provided).
continuous If TRUE (default), the mesh contains only one node per vertex. If FALSE, each vertex v is split into $\operatorname{deg}(\mathrm{v})$ disconnected nodes to allow for the creation of discontinuities at the vertices.
continuous.outs If continuous $=$ FALSE and continuous.outs $=$ TRUE, continuity is assumed for the outgoing edges from each vertex.
continuous.deg2 If TRUE, continuity is assumed at degree 2 vertices.
Details: The mesh is a list with the objects:

- PtE The mesh locations excluding the original vertices;
- V The verties of the mesh;
- E The edges of the mesh;
- n_e The number of vertices in the mesh per original edge in the graph;
- h_e The mesh width per edge in the graph;
- ind The indices of the vertices in the mesh;
- VtE All mesh locations including the original vertices.

Returns: No return value. Called for its side effects. The mesh is stored in the mesh element of the metric_graph object.

Method compute_fem(): Build mass and stiffness matrices for given mesh object.
Usage:
metric_graph\$compute_fem(petrov = FALSE)
Arguments:
petrov Compute Petrov-Galerkin matrices? (default FALSE). These are defined as Cpet $_{i j}=<$ $\phi_{i}, \psi_{j}>$ and Gpet $_{i j}=<d \phi_{i}, \psi_{j}>$, where $\psi_{i}$ are piecewise constant basis functions on the edges of the mesh.
Details: The function builds: The matrix C which is the mass matrix with elements $C_{i j}=<$ $\phi_{i}, \phi_{j}>$, the matrix G which is the stiffness matrix with elements $G_{i j}=<d \phi_{i}, d \phi_{j}>$, the matrix B with elements $B_{i j}=<d \phi_{i}, \phi_{j}>$, the matrix D with elements $D_{i j}=\sum_{v \in V} \phi_{i}(v) \phi_{j}(v)$, and the vector with weights $\left\langle\phi_{i}, 1\right\rangle$.

Returns: No return value. Called for its side effects. The finite element matrices C, G and B are stored in the mesh element in the metric_graph object. If petrov=TRUE, the corresponding Petrov-Galerkin matrices are stored in Cpet and Gpet.

Method mesh_A(): Deprecated - Computes observation matrix for mesh.
[Deprecated] in favour of metric_graph\$fem_basis().
Usage:
metric_graph\$mesh_A(PtE)

## Arguments:

PtE Locations given as (edge number in graph, normalized location on edge)
Details: For n locations and a mesh with m nodes, A is an nx m matrix with elements $A_{i j}=$ $\phi_{j}\left(s_{i}\right)$.

Returns: The observation matrix.
Method fem_basis(): Computes observation matrix for mesh.
Usage:
metric_graph\$fem_basis(PtE)
Arguments:
PtE Locations given as (edge number in graph, normalized location on edge)
Details: For n locations and a mesh with m nodes, A is an nx m matrix with elements $A_{i j}=$ $\phi_{j}\left(s_{i}\right)$.
Returns: The observation matrix.
Method VtEfirst(): Find one edge corresponding to each vertex.
Usage:
metric_graph\$VtEfirst()
Returns: A nV x 2 matrix the first element of the $i$ th row is the edge number corresponding to the ith vertex and the second value is 0 if the vertex is at the start of the edge and 1 if the vertex is at the end of the edge.

Method plot(): Plots the metric graph.

```
Usage:
metric_graph$plot(
    data = NULL,
    newdata = NULL,
    group = 1,
    plotly = FALSE,
    interactive = FALSE,
    vertex_size = 3,
    vertex_color = "black",
    edge_width = 0.3,
    edge_color = "black",
    data_size = 1,
    support_width = 0.5,
    support_color = "gray",
    mesh = FALSE,
    X = NULL,
    X_loc = NULL,
    p = NULL,
    degree = FALSE,
    direction = FALSE,
    edge_weight = NULL,
    edge_width_weight = NULL,
    scale_color_main = ggplot2::scale_color_viridis_c(option = "D"),
    scale_color_weights = ggplot2::scale_color_viridis_c(option = "C"),
    scale_color_degree = ggplot2::scale_color_viridis_d(option = "D"),
    add_new_scale_weights = TRUE,
)
```


## Arguments:

data Which column of the data to plot? If NULL, no data will be plotted.
newdata A dataset of class metric_graph_data, obtained by any get_data(), mutate(), filter(), summarise(), drop_na() methods of metric graphs, see the vignette on data manipulation for more details.
group If there are groups, which group to plot? If group is a number, it will be the index of the group as stored internally. If group is a character, then the group will be chosen by its name.
plotly Use plot_ly for 3D plot (default FALSE). This option requires the 'plotly' package.
interactive Only works for 2d plots. If TRUE, an interactive plot will be displayed. Unfortunately, interactive is not compatible with edge_weight if add_new_scale_weights is TRUE.
vertex_size Size of the vertices.
vertex_color Color of vertices.
edge_width Line width for edges. If edge_width_weight is not NULL, this determines the maximum edge width.
edge_color Color of edges.
data_size Size of markers for data.
support_width For 3D plot, width of support lines.
support_color For 3D plot, color of support lines.
mesh Plot the mesh locations?
$X$ Additional values to plot.
X_loc Locations of the additional values in the format (edge, normalized distance on edge).
p Existing objects obtained from 'ggplot2' or 'plotly' to add the graph to
degree Show the degrees of the vertices?
direction Show the direction of the edges?
edge_weight Which column from edge weights to plot? If NULL edge weights are not plotted. To plot the edge weights when the metric graph edge_weights is a vector instead of a data.frame, simply set to 1 . edge_weight is only available for 2 d plots. For 3 d plots with edge weights, please use the plot_function() method.
edge_width_weight Which column from edge weights to determine the edges widths? If NULL edge width will be determined from edge_width.
scale_color_main Color scale for the data to be plotted.
scale_color_weights Color scale for the edge weights. Will only be used if add_new_scale_weights is TRUE.
scale_color_degree Color scale for the degrees.
add_new_scale_weights Should a new color scale for the edge weights be created?
... Additional arguments to pass to ggplot() or plot_ly()
Returns: A plot_ly (if plotly = TRUE) or ggplot object.
Method plot_connections(): Plots the connections in the graph
Usage:
metric_graph\$plot_connections()
Returns: No return value. Called for its side effects.

Method is_tree(): Checks if the graph is a tree (without considering directions)
Usage:
metric_graph\$is_tree()
Returns: TRUE if the graph is a tree and FALSE otherwise.
Method plot_function(): Plots continuous function on the graph.

```
Usage:
metric_graph$plot_function(
    data = NULL,
    newdata = NULL,
    group = 1,
    X = NULL,
    plotly = FALSE,
    improve_plot = FALSE,
    continuous = TRUE,
    edge_weight = NULL,
    vertex_size = 5,
    vertex_color = "black",
    edge_width = 1,
    edge_color = "black",
    line_width = NULL,
    line_color = "rgb(0,0,200)",
    scale_color = ggplot2::scale_color_viridis_c(option = "d"),
    support_width = 0.5,
    support_color = "gray",
    p = NULL,
)
```

Arguments:
data Which column of the data to plot? If NULL, no data will be plotted.
newdata A dataset of class metric_graph_data, obtained by any get_data(), mutate(), filter(), summarise(), drop_na() methods of metric graphs, see the vignette on data manipulation for more details.
group If there are groups, which group to plot? If group is a number, it will be the index of the group as stored internally. If group is a character, then the group will be chosen by its name.
X A vector with values for the function evaluated at the mesh in the graph
plotly If TRUE, then the plot is shown in 3D. This option requires the package 'plotly'.
improve_plot Should the original edge coordinates be added to the data with linearly interpolated values to improve the plot?
continuous Should continuity be assumed when the plot uses newdata?
edge_weight Which column from edge weights to plot? If NULL edge weights are not plotted. To plot the edge weights when the metric graph edge_weights is a vector instead of a data. frame, simply set to 1 .
vertex_size Size of the vertices.
vertex_color Color of vertices.

```
edge_width Width for edges.
edge_color For 3D plot, color of edges.
line_width For 3D plot, line width of the function curve.
line_color Color of the function curve.
scale_color Color scale to be used for data and weights.
support_width For 3D plot, width of support lines.
support_color For 3D plot, color of support lines.
p Previous plot to which the new plot should be added.
. . . Additional arguments for ggplot() or plot_ly()
```

```
Usage:
```

Usage:
metric_graph$plot_movie(
metric_graph$plot_movie(
X,
X,
plotly = TRUE,
plotly = TRUE,
vertex_size = 5,
vertex_size = 5,
vertex_color = "black",
vertex_color = "black",
edge_width = 1,
edge_width = 1,
edge_color = "black",
edge_color = "black",
line_width = NULL,
line_width = NULL,
line_color = "rgb(0,0,200)",
line_color = "rgb(0,0,200)",
)

```
)
```

Returns: Either a ggplot (if plotly = FALSE) or a plot_ly object.

Method plot_movie(): Plots a movie of a continuous function evolving on the graph.

## Arguments:

X A m x T matrix where the ith column represents the function at the ith time, evaluated at the mesh locations.
plotly If TRUE, then plot is shown in 3D. This option requires the package 'plotly'.
vertex_size Size of the vertices.
vertex_color Color of vertices.
edge_width Width for edges.
edge_color For 3D plot, color of edges.
line_width For 3D plot, line width of the function curve.
line_color Color of the function curve.
. . . Additional arguments for ggplot or plot_ly.
Returns: Either a ggplot (if plotly=FALSE) or a plot_ly object.
Method add_mesh_observations(): Add observations on mesh to the object.
Usage:
metric_graph\$add_mesh_observations(data = NULL, group = NULL)
Arguments:
data A data.frame or named list containing the observations. In case of groups, the data.frames for the groups should be stacked vertically, with a column indicating the index of the group. If data_frame is not NULL, it takes priority over any eventual data in Spoints.
group If the data_frame contains groups, one must provide the column in which the group indices are stored.

Returns: No return value. Called for its side effects. The observations are stored in the data element in the metric_graph object.

Method get_initial_graph(): Returns a copy of the initial metric graph.
Usage:
metric_graph\$get_initial_graph()
Returns: A metric_graph object.

Method coordinates(): Convert between locations on the graph and Euclidean coordinates.
Usage:
metric_graph\$coordinates(PtE = NULL, XY = NULL, normalized $=$ TRUE)
Arguments:
PtE Matrix with locations on the graph (edge number and normalized position on the edge).
XY Matrix with locations in Euclidean space
normalized If TRUE, it is assumed that the positions in PtE are normalized to $(0,1)$, and the object returned if XY is specified contains normalized locations.

Returns: If PtE is specified, then a matrix with Euclidean coordinates of the locations is returned. If XY is provided, then a matrix with the closest locations on the graph is returned. Gets the edge weights data.frame If the edge weights are given as vectors, should the result be returned as a data.frame? A vector or data.frame containing the edge weights. data List containing data on the metric graph.

Method clone(): The objects of this class are cloneable with this method.
Usage:
metric_graph\$clone(deep = FALSE)
Arguments:
deep Whether to make a deep clone.

## Examples

```
edge1 <- rbind(c(0, 0), c(2, 0))
edge2 <- rbind(c(2, 0), c(1, 1))
edge3 <- rbind(c(1, 1), c(0, 0))
edges <- list(edge1, edge2, edge3)
graph <- metric_graph$new(edges)
graph$plot()
```

```
mutate.metric_graph_data
```

                                    A version of dplyr: : mutate() function for datasets on metric graphs
    
## Description

Applies dplyr: :mutate() function for datasets obtained from a metric graph object.

## Usage

\#\# S3 method for class 'metric_graph_data'
mutate(.data, ...)

## Arguments

.data The data list or tidyr: : tibble obtained from a metric graph object.
... Additional parameters to be passed to dplyr: :mutate().

## Value

A tidyr::tibble with the resulting selected columns.

```
pems Traffic speed data from San Jose, California
```


## Description

Data set of traffic speed observations on highways in the city of San Jose, California.

## Usage

pems

## Format

pems:
A list with three elements:
edges A list object containing the coordinates of the road segments.
data Locations of the observations on the road segments as a data.frame with 325 rows and 2 columns. The first column indicates the edge number and the second column indicates the distance on edge of the position.
Y Observations of traffic speed. Consists of a vector with 325 observations.

## Source

https://www.openstreetmap.org
https://github.com/spbu-math-cs/Graph-Gaussian-Processes/blob/main/examples/data/PEMS.zip

## References

Chen, C., K. Petty, A. Skabardonis, P. Varaiya, and Z. Jia (2001). Freeway performance measurement system: mining loop detector data. Transportation Research Record 1748(1), 96-102.

OpenStreetMap contributors (2017). Planet dump retrieved from https://planet.osm.org. https://www.openstreetmap.org.

```
plot.graph_bru_pred Plot of predicted values with 'inlabru'
```


## Description

Auxiliary function to obtain plots of the predictions of the field using 'inlabru'.

## Usage

```
## S3 method for class 'graph_bru_pred'
plot(x, y = NULL, vertex_size = 0, ...)
```


## Arguments

x
y Not used.
vertex_size $\quad$ Size of the vertices.
... Additional parameters to be passed to plot_function.

## Value

A 'ggplot2' object.

```
posterior_crossvalidation
```

Leave-one-out crossvalidation for graph_lme models assuming observations at the vertices of metric graphs

## Description

Leave-one-out crossvalidation for graph_lme models assuming observations at the vertices of metric graphs

## Usage

posterior_crossvalidation(object, factor $=1$, tibble $=$ TRUE)

## Arguments

object A fitted model using the graph_lme() function or a named list of fitted objects using the graph_lme() function.
factor Which factor to multiply the scores. The default is 1 .
tibble Return the scores as a tidyr::tibble()

## Value

Vector with the posterior expectations and variances as well as mean absolute error (MAE), root mean squared errors (RMSE), and three negatively oriented proper scoring rules: log-score, CRPS, and scaled CRPS.

```
predict.graph_lme Prediction for a mixed effects regression model on a metric graph
```


## Description

Prediction for a mixed effects regression model on a metric graph

## Usage

```
## S3 method for class 'graph_lme'
predict(
    object,
    newdata = NULL,
    mesh = FALSE,
    mesh_h = 0.01,
    which_repl = NULL,
    compute_variances = FALSE,
    compute_pred_variances = FALSE,
```

```
    posterior_samples = FALSE,
    pred_samples = FALSE,
    n_samples = 100,
    edge_number = "edge_number",
    distance_on_edge = "distance_on_edge",
    normalized = FALSE,
    no_nugget = FALSE,
    return_as_list = FALSE,
    return_original_order = TRUE,
    check_euclidean = TRUE,
    ...,
    data = deprecated()
)
```


## Arguments

| object | The fitted object with the graph_lme() function. |
| :--- | :--- |
| newdata | A data.frame or a list containing the covariates, the edge number and the <br> distance on edge for the locations to obtain the prediction. Observe that you <br> should not provide the locations for each replicate. Only a single set of locations <br> and covariates, and the predictions for the different replicates will be obtained <br> for this same set of locations. |
| Obtain predictions for mesh nodes? The graph must have a mesh and should not |  |
| have covariates. |  |

Set to TRUE to compute the kriging variances.
compute_pred_variances
Set to TRUE to compute the prediction variances. Will only be computed if newdata is NULL.
posterior_samples
If TRUE, posterior samples for the random effect will be returned.
pred_samples If TRUE, prediction samples for the response variable will be returned. Will only be computed if newdata is NULL.
n_samples $\quad$ Number of samples to be returned. Will only be used if sampling is TRUE.
edge_number Name of the variable that contains the edge number, the default is edge_number.
distance_on_edge
Name of the variable that contains the distance on edge, the default is distance_on_edge.
normalized Are the distances on edges normalized?
no_nugget Should the prediction be carried out without the nugget?
return_as_list Should the means of the predictions and the posterior samples be returned as a list, with each replicate being an element?

```
return_original_order
                            Should the results be return in the original (input) order or in the order inside
                    the graph?
check_euclidean
    Check if the graph used to compute the resistance distance has Euclidean edges?
    The graph used to compute the resistance distance has the observation locations
    as vertices.
... Not used.
data [Deprecated] Use newdata instead.
```


## Value

A list with elements mean, which contains the means of the predictions, fe_mean, which is the prediction for the fixed effects, re_mean, which is the prediction for the random effects, variance (if compute_variance is TRUE), which contains the posterior variances of the random effects, samples (if posterior_samples is TRUE), which contains the posterior samples.

```
predict.inla_metric_graph_spde
```

Predict method for 'inlabru' fits on Metric Graphs

## Description

Auxiliar function to obtain predictions of the field using 'inlabru'.

## Usage

```
## S3 method for class 'inla_metric_graph_spde'
predict(
    object,
    cmp,
    bru_fit,
    newdata = NULL,
    formula = NULL,
    data_coords = c("PtE", "euclidean"),
    normalized = TRUE,
    n.samples = 100,
    seed = 0L,
    probs = c(0.025, 0.5, 0.975),
    return_original_order = TRUE,
    num.threads = NULL,
    include = NULL,
    exclude = NULL,
    drop = FALSE,
    ...,
    data = deprecated()
)
```


## Arguments

| object | An inla_metric_graph_spde object built with the graph_spde() function. |
| :--- | :--- |
| cmp | The 'inlabru' component used to fit the model. |
| bru_fit | A fitted model using 'inlabru' or 'INLA'. |
| newdata | A data.frame of covariates needed for the prediction. The locations must be |
| normalized PtE. |  |
| formula | A formula where the right hand side defines an R expression to evaluate for each <br> generated sample. If NULL, the latent and hyperparameter states are returned <br> as named list elements. See Details for more information. |
| data_coords | It decides which coordinate system to use. If PtE, the user must provide the <br> locations as a data frame with the first column being the edge number and the <br> second column as the distance on edge, otherwise if euclidean, the user must <br> provide a data frame with the first column being the x Euclidean coordinates and <br> the second column being the y Euclidean coordinates. |
| normalized | if TRUE, then the distances in distance on edge are assumed to be normalized to <br> (0,1). Default TRUE. Will not be used if data_coords is euclidean. |
| n. samples | Integer setting the number of samples to draw in order to calculate the posterior <br> statistics. The default is rather low but provides a quick approximate result. |
| seed |  |
| probs | Random number generator seed passed on to inla.posterior. sample() |
| A numeric vector of probabilities with values in the standard unit interval to be |  |
| passed to stats::quantile |  |

Value
A list with predictions.

```
predict.rspde_metric_graph
```

Predict method for 'inlabru' fits on Metric Graphs for 'rSPDE' models

## Description

Auxiliar function to obtain predictions of the field using 'inlabru' and 'rSPDE'.

## Usage

```
## S3 method for class 'rspde_metric_graph'
predict(
    object,
    cmp,
    bru_fit,
    newdata = NULL,
    formula = NULL,
    data_coords = c("PtE", "euclidean"),
    normalized = TRUE,
    n.samples = 100,
    seed = 0L,
    probs = c(0.025, 0.5, 0.975),
    num.threads = NULL,
    include = NULL,
    exclude = NULL,
    drop = FALSE,
    ...,
    data = deprecated()
)
```


## Arguments

object An rspde_metric_graph object built with the rspde.metric_graph() function.
cmp The 'inlabru' component used to fit the model.
bru_fit A fitted model using 'inlabru' or 'INLA'.
newdata A data.frame of covariates needed for the prediction. The locations must be normalized PtE.
formula A formula where the right hand side defines an $R$ expression to evaluate for each generated sample. If NULL, the latent and hyperparameter states are returned as named list elements. See Details for more information.
data_coords It decides which coordinate system to use. If PtE, the user must provide the locations as a data frame with the first column being the edge number and the second column as the distance on edge, otherwise if euclidean, the user must provide a data frame with the first column being the $x$ Euclidean coordinates and the second column being the $y$ Euclidean coordinates.

```
sample_spde
\begin{tabular}{|c|c|}
\hline normalized & if TRUE, then the distances in distance on edge are assumed to be normalized to \((0,1)\). Default TRUE. Will not be used if data_coords is euclidean. \\
\hline n. samples & Integer setting the number of samples to draw in order to calculate the posterior statistics. The default is rather low but provides a quick approximate result. \\
\hline seed & Random number generator seed passed on to inla.posterior.sample \\
\hline probs & A numeric vector of probabilities with values in the standard unit interval to be passed to stats::quantile. \\
\hline num.threads & Specification of desired number of threads for parallel computations. Default NULL, leaves it up to 'INLA'. When seed != 0 , overridden to " \(1: 1\) " \\
\hline include & Character vector of component labels that are needed by the predictor expression; Default: NULL (include all components that are not explicitly excluded) \\
\hline exclude & Character vector of component labels that are not used by the predictor expression. The exclusion list is applied to the list as determined by the include parameter; Default: NULL (do not remove any components from the inclusion list) \\
\hline drop & logical; If keep=FALSE, data is a SpatialDataFrame, and the prediciton summary has the same number of rows as data, then the output is a SpatialDataFrame object. Default FALSE. \\
\hline & Additional arguments passed on to inla.posterior.sample. \\
\hline data & [Deprecated] Use newdata instead. \\
\hline
\end{tabular}
```


## Value

A list with predictions.
sample_spde Samples a Whittle-Matérn field on a metric graph

## Description

Obtains samples of a Whittle-Matérn field on a metric graph.

## Usage

```
sample_spde(
    kappa,
    tau,
    range,
    sigma,
    sigma_e = 0,
    alpha = 1,
    graph,
    PtE = NULL,
    type = "manual",
```

```
    posterior = FALSE,
    nsim = 1,
    method = c("conditional", "Q"),
    BC = 1
)
```


## Arguments

| kappa | Range parameter. |
| :--- | :--- |
| tau | Precision parameter. |
| range | Practical correlation range parameter. |
| sigma | Marginal standard deviation parameter. |
| sigma_e | Standard deviation of the measurement noise. |
| alpha | Smoothness parameter. |
| graph | A metric_graph object. |
| PtE | Matrix with locations (edge, normalized distance on edge) where the samples <br> should be generated. |
| type | If "manual" is set, then sampling is done at the locations specified in PtE. Set to <br> "mesh" for simulation at mesh nodes, and to "obs" for simulation at observation <br> locations. |
| posterior | Sample conditionally on the observations? |
| nsim | Number of samples to be generated. <br> method |
| Which method to use for the sampling? The options are "conditional" and "Q". |  |
| BC | Here, "Q" is more stable but takes longer. |
|  | Boundary conditions for degree 1 vertices. BC = 0 gives Neumann boundary <br> conditions and BC = 1 gives stationary boundary conditions. |

## Details

Samples a Gaussian Whittle-Matérn field on a metric graph, either from the prior or conditionally on observations

$$
y_{i}=u\left(t_{i}\right)+\sigma_{e} e_{i}
$$

on the graph, where $e_{i}$ are independent standard Gaussian variables. The parameters for the field can either be specified in terms of tau and kappa or practical correlation range and marginal standard deviation.

## Value

Matrix or vector with the samples.

```
select.metric_graph_data
```

    A version of dplyr: : select() function for datasets on metric graphs
    
## Description

Selects columns on metric graphs, while keeps the spatial positions.

## Usage

\#\# S3 method for class 'metric_graph_data' select(.data, ...)

## Arguments

$$
\begin{array}{ll}
\text {.data } & \text { The data list or tidyr::tibble obtained from a metric graph object. } \\
\ldots & \text { Additional parameters to be passed to dplyr: : select(). }
\end{array}
$$

## Value

A tidyr::tibble with the resulting selected columns.

```
simulate.graph_lme Simulation of models on metric graphs
```


## Description

The function samples a Gaussian random field based on a fitted model using graph_lme().

```
Usage
    ## S3 method for class 'graph_lme'
    simulate(
        object,
        nsim = 1,
        seed = NULL,
        sample_latent = FALSE,
        posterior = FALSE,
        which_repl = NULL,
    )
```


## Arguments

object A graph_lme object
nsim
The number of simulations.
seed an object specifying if and how the random number generator should be initialized ('seeded').
sample_latent If FALSE, samples for the response variable will be generated. If TRUE, samples for the latent model will be generated. The default is FALSE.
posterior Should posterior samples be generated? If FALSE, samples will be computed based on the estimated prior distribution. The default is FALSE.
which_repl Which replicates to generate the samples. If NULL samples will be generated for all replicates. Default is NULL.
... Currently not used.

## Value

A list containing elements samples, edge_number and distance_on_edge. Each of them is a list, whose indexes are the replicates, and in samples a matrix is given with nsim columns, each one being a sample. edge_number and distance_on_edges contain the respective edge numbers and distances on edge for each sampled element. The locations of the samples are the location of the data in which the model was fitted.
simulate_spacetime space-time simulation based on implicit Euler discretization in time

## Description

Simulation with starting value u0

## Usage

simulate_spacetime(graph, t, kappa, rho, gamma, alpha, beta, sigma, u0, BC = 0)

## Arguments

| graph | A metric_graph object. |
| :--- | :--- |
| t | Vector of time points. |
| kappa | Spatial range parameter. |
| rho | Drift parameter. |
| gamma | Temporal range parameter. |
| alpha | Smoothness parameter (integer) for spatial operator. |
| beta | Smoothness parameter (integer) for Q-Wiener process. |
| sigma | Variance parameter. |
| u0 | Starting value. |
| BC | Which boundary condition to use (0,1). Here, 0 is no adjustment on the bound- |
|  | ary and 1 results in making the boundary condition stationary. |

## Value

Precision matrix.
spde_covariance Covariance function for Whittle-Matérn fields

## Description

Computes the covariance function for a Whittle-Matérn field.

## Usage

spde_covariance(P, kappa, tau, range, sigma, alpha, graph)

## Arguments

P
Location (edge number and normalized location on the edge) for the location to evaluate the covariance function at.
kappa Parameter kappa from the SPDE.
tau Parameter tau from the SPDE.
range $\quad$ Range parameter.
sigma Standard deviation parameter.
alpha Smoothness parameter (1 or 2).
graph A metric_graph object.

## Details

Compute the covariance function $\rho\left(P, s_{i}\right)$ where P is the provided location and $s_{i}$ are all locations in the mesh of the graph.

## Value

Vector with the covariance function evaluate at the mesh locations.

```
spde_metric_graph_result
```

Metric graph SPDE result extraction from 'INLA' estimation results

## Description

Extract field and parameter values and distributions for a metric graph spde effect from an 'INLA' result object.

## Usage

spde_metric_graph_result( inla, name, metric_graph_spde, compute.summary = TRUE, n_samples $=5000$, n_density = 1024
)

## Arguments

| inla | An 'INLA' object obtained from a call to inla(). |
| :---: | :---: |
| name | A character string with the name of the 'rSPDE' effect in the model. |
| metric_graph_spde |  |
|  | The inla_metric_graph_spde object used for the random effect in the model. |
| compute. summary |  |
|  | Should the summary be computed? |
| n_samples | The number of samples to be used if parameterization is matern. |
| n_density | The number of equally spaced points to estimate the density. |

## Value

If the model was fitted with matern parameterization (the default), it returns a list containing:

> marginals.range

Marginal densities for the range parameter.
marginals.log.range
Marginal densities for $\log$ (range).
marginals.sigma
Marginal densities for std. deviation.
marginals.log.sigma
Marginal densities for $\log$ (std. deviation).
marginals.values
Marginal densities for the field values.
summary.log. range
Summary statistics for $\log$ (range).
summary.log.sigma
Summary statistics for $\log$ (std. deviation).
summary.values Summary statistics for the field values.
If compute. summary is TRUE, then the list will also contain
summary.kappa Summary statistics for kappa.
summary.tau Summary statistics for tau.
If the model was fitted with the spde parameterization, it returns a list containing:
marginals.kappa
Marginal densities for kappa.
marginals.log.kappa
Marginal densities for $\log ($ kappa $)$.
marginals.log.tau
Marginal densities for $\log (t a u)$.
marginals.tau Marginal densities for tau.
marginals.values
Marginal densities for the field values.
summary.log.kappa
Summary statistics for $\log$ (kappa).
summary.log.tau
Summary statistics for $\log ($ tau $)$.
summary. values Summary statistics for the field values.
If compute. summary is TRUE, then the list will also contain
summary. kappa Summary statistics for kappa.
summary.tau Summary statistics for tau.
spde_precision Precision matrix for Whittle-Matérn fields

## Description

Computes the precision matrix for all vertices for a Whittle-Matérn field.

## Usage

spde_precision(kappa, tau, alpha, graph, $B C=1$, build $=$ TRUE)

## Arguments

| kappa | Range parameter. |
| :--- | :--- |
| tau | Precision parameter. |
| alpha | Smoothness parameter (1 or 2). |
| graph | A metric_graph object. |
| BC | Set boundary conditions for degree=1 vertices. $\mathrm{BC}=0$ gives Neumann boundary <br> conditions and $\mathrm{BC}=1$ gives stationary boundary conditions. |
| build | If TRUE, the precision matrix is returned. Otherwise a list list $(\mathrm{i}, \mathrm{j}, \mathrm{x}, \mathrm{nv})$ is re- <br> turned. |

## Value

Precision matrix or list.

```
summarise.metric_graph_data
                                    A version of dplyr::summarise() function for datasets on metric
    graphs
```


## Description

Creates summaries, while keeps the spatial positions.

## Usage

\#\# S3 method for class 'metric_graph_data'
summarise(.data, ..., .include_graph_groups = FALSE, .groups = NULL)

## Arguments

$$
\begin{aligned}
& \text {.data } \\
& \begin{array}{ll}
\text { The data list or tidyr: : tibble obtained from a metric graph object. } \\
\ldots & \text { Additional parameters to be passed to dplyr: : summarise(). } \\
\text {.include_graph_groups }
\end{array} \\
& \begin{array}{l}
\text { Should the internal graph groups be included in the grouping variables? The } \\
\text { default is FALSE. This means that, when summarising, the data will be grouped } \\
\text { by the internal group variable together with the spatial locations. }
\end{array} \\
& \text {.groups }
\end{aligned} \begin{aligned}
& \text { A vector of strings containing the names of the columns to be additionally } \\
& \text { grouped, when computing the summaries. The default is NULL. }
\end{aligned}
$$

## Value

A tidyr: :tibble with the resulting selected columns.

```
summary.graph_lme Summary Method for graph_lme Objects
```


## Description

Function providing a summary of results related to metric graph mixed effects regression models.

## Usage

\#\# S3 method for class 'graph_lme'
summary (object, all_times = FALSE, ...)

## Arguments

| object | an object of class graph_lme containing results from the fitted model. |
| :--- | :--- |
| all_times | Show all computed times. |
| $\ldots$ | not used. |

## Value

An object of class summary_graph_lme containing information about a graph_lme object.

```
summary.metric_graph Summary Method for metric_graph Objects
```


## Description

Function providing a summary of several informations/characteristics of a metric graph object.

```
Usage
    ## S3 method for class 'metric_graph'
    summary(
        object,
        messages = FALSE,
        compute_characteristics = TRUE,
        check_euclidean = TRUE,
        check_distance_consistency = TRUE,
    )
```


## Arguments

object an object of class metric_graph.
messages $\quad$ Should message explaining how to build the results be given for missing quantities?
compute_characteristics
Should the characteristics of the graph be computed?
check_euclidean
Check if the graph has Euclidean edges?
check_distance_consistency
Check the distance consistency assumption?\#'
... not used.

## Value

An object of class summary_graph_lme containing information about a metric_graph object.

```
summary.metric_graph_spde_result
                                    Summary for posteriors of field parameters for an inla_rspde model
                    from a rspde.result object
```


## Description

Summary for posteriors of 'rSPDE' field parameters in their original scales.

## Usage

\#\# S3 method for class 'metric_graph_spde_result'
summary (object, digits = 6, ...)

## Arguments

| object | A rspde. result object. |
| :--- | :--- |
| digits | Integer, used for number formatting with signif() |
| $\ldots$ | Currently not used. |

## Value

A data. frame containing the summary.

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