## Package 'DRHotNet'

May 14, 2020

**Title** Differential Risk Hotspots in a Linear Network

Version 1.2

Author Alvaro Briz-Redon

Maintainer Alvaro Briz-Redon <alvaro.briz@uv.es>

**Description** Performs the identification of differential risk hotspots (Briz-Redon et al. 2019) <doi:10.1016/j.aap.2019.105278> along a linear network. Given a marked point pattern lying on the linear network, the method implemented uses a network-constrained version of kernel density estimation (McSwiggan et al. 2017) <doi:10.1111/sjos.12255> to approximate the probability of occurrence across space for the type of event specified by the user through the marks of the pattern (Kelsall and Diggle 1995) <doi:10.2307/3318678>. The goal is to detect microzones of the linear network where the type of event indicated by the user is overrepresented.

**Depends** R (>= 3.5.0)

**Imports** graphics, grDevices, maptools, PBSmapping, raster, sp, spatstat, spdep, stats, utils

License GPL-2

LazyData true

RoxygenNote 6.1.1

Suggests knitr, rmarkdown

NeedsCompilation no

**Repository** CRAN

Date/Publication 2020-05-13 23:40:26 UTC

## **R** topics documented:

DRHotspots_k_n	2
NeighbourhoodMatrixNetwork	3
PlotHotspots	ł
PlotRelativeProbabilities	5
RelativeProbabilityNetwork	5
SampleMarkedPattern	1
Sensitivity_k_n	1
SummaryDRHotspots	3

#### Index

DRHotspots\_k\_n

Identifies differential risk hotspots along a linear network given a vector of relative probabilities computed over the middle points of the segments of the network

#### Description

Given a relative probability surface corresponding to the occurrence of a type of event along a linear network, this function filters and groups in hotspots those segments satisfying two conditions: 1) the relative probability in the segment exceeds the average relative probability per segment in k times the standard deviation of the complete set of probabilities estimated across all the segments of the network, and 2) there are n or more events at a distance below sigma from the middle point of the segment (sigma is obtained from the object rel\_probs computed with the function RelativeProbabilityNetwork). In summary, k and n control the formation of differential risk hotspots along the network, given a set of relative probabilities covering the network. The choice of a higher value for k or n (or both) represents a more strict criterion and leads to a lower number of differential risk hotspots being detected. Users should test several values of k and n (sensitivity analysis on k and n) in order to reach reasonable choices for the research or practical purposes of their data analyses. This sensitivity analysis can be carried out with the Sensitivity\_k\_n function

#### Usage

```
DRHotspots_k_n(X, rel_probs, k, n, dist = "path",
    event_distances = NULL)
```

#### Arguments

Х	- A lpp object representing a marked point pattern lying on a road network (linnet object)
rel_probs	- An object containing the relative probabilities of a specific type of event along the linear network contained in X, generated through the function RelativeProbabilityNetwork
k	- A numeric value that controls the procedure of detecting differential risk hotspots (departure from average relative probability), as described above
n	- A numeric value that controls the procedure of detecting differential risk hotspots (minimum size for the sample of events implicated in the computation of the relative probabilities), as described above
dist	- A character indicating which distance to use. Two values are allowed: path (shortest-path distance) and euclidean (Euclidean distance). By default, the shortest-path distance is used. Change to euclidean to reduce the computation time or skip memory issues
event_distances	
	- A matrix that contains the distances between the middle points of the segments satisfying the condition on parameter k and the events o X. By default it is set to NULL

## 10

## Value

Returns a list that contains the differential risk hotspots found for X and the type of event specified by rel\_probs

## References

Briz-Redon, A., Martinez-Ruiz, F., & Montes, F. (2019). Identification of differential risk hotspots for collision and vehicle type in a directed linear network. Accident Analysis & Prevention, 132, 105278.

#### Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(raster)
library(maptools)
rel probs rear end <- RelativeProbabilityM</pre>
```

```
rel_probs_rear_end <- RelativeProbabilityNetwork(X = SampleMarkedPattern,
lixel_length = 50, sigma = 100, mark = "Collision", category_mark = "Rear-end")
hotspots_rear_end <- DRHotspots_k_n(X = SampleMarkedPattern, rel_probs = rel_probs_rear_end,
k = 1, n = 30)
```

NeighbourhoodMatrixNetwork

Creates the neighbourhood structure of a linear network

## Description

Given a linear network structure, this function creates the neighbourhood matrix ("queen" criterion) associated to it. Two segments of the network are neighbours if they share a vertex

## Usage

```
NeighbourhoodMatrixNetwork(network)
```

#### Arguments

network - A linnet object representing a linear network structure

#### Value

Returns a listw object in "W" style

## Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(raster)
library(maptools)
chicago_neighbourhood <- NeighbourhoodMatrixNetwork(chicago$domain)
class(chicago_neighbourhood)
chicago_neighbourhood$neighbours[[1]]</pre>
```

```
PlotHotspots
```

*Plots an object obtained with* DiffHotspots\_n\_k

## Description

This function plots a set of differential risk hotspots located along a linear network. An extension of the hotspots (including the kth order neighbourhs of the segments of the hotspots) is also plotted

#### Usage

```
PlotHotspots(X, hotspots, order_extension = NULL, which.plot = NULL,
rotation_angle = 0, eps_image = F)
```

#### Arguments

Х	- A lpp object representing a marked point pattern lying on a road network (linnet object)
hotspots	- A set of differential risk hotspots obtained with the function $\tt DiffHotspots\_n\_k$
order_extension	n
	- A natural number indicating a neighbourhood order to be used for constructing an extension of the differential risk hotspots. The summary is also given for the segments forming this extension
which.plot	- A numeric vector indicating which differential risk hotspots to plot (according to the way they are ordered in hotspots)
rotation_angle	- A rotation angle (in degrees, from 0 to 180) to apply to the network (to improve visualization, if required). By default it is set to $0$
eps_image	- If set to TRUE, an .eps image is generated. By default it is set to FALSE

## Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(raster)
library(maptools)
```

rel\_probs\_rear\_end <- RelativeProbabilityNetwork(X = SampleMarkedPattern,</pre>

4

```
lixel_length = 50, sigma = 100, mark = "Collision", category_mark = "Rear-end")
hotspots_rear_end <- DRHotspots_k_n(X = SampleMarkedPattern, rel_probs = rel_probs_rear_end,
k = 1, n = 30)
PlotHotspots(X = SampleMarkedPattern, hotspots = hotspots_rear_end)</pre>
```

PlotRelativeProbabilities

*Plots an object obtained with* RelativeProbabilityNetwork

## Description

This function plots the relative probability of occurrence of a type of event along a linear network

#### Usage

```
PlotRelativeProbabilities(X, rel_probs, rotation_angle = 0,
    eps_image = F)
```

## Arguments

Х	- A lpp object representing a marked point pattern lying on a road network (linnet object)
rel_probs	- An object containing the relative probabilities of a specific type of event along the linear network contained in X, generated through the function RelativeProbabilityNetwork
rotation_angle	- A rotation angle (in degrees, from 0 to 180) to apply to the network (to improve visualization, if required). By default it is set to $0$
eps_image	- If set to TRUE, an .eps image is generated. By default it is set to FALSE

#### Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(maptools)
```

```
rel_probs_rear_end <- RelativeProbabilityNetwork(X = SampleMarkedPattern,
lixel_length = 50, sigma = 100, mark = "Collision", category_mark = "Rear-end")
PlotRelativeProbabilities(X = SampleMarkedPattern, rel_probs = rel_probs_rear_end)
```

#### RelativeProbabilityNetwork

*Computes the relative probability of observing a type of event along a linear network* 

#### Description

Given a marked point pattern lying on a linear network structure, this function uses kernel density estimation (KDE) to estimate a relative probability of occurrence for a type of event specified by the user through the marks of the pattern. The marks of a point pattern represent additional information of the events that are part of the pattern

#### Usage

```
RelativeProbabilityNetwork(X, lixel_length, sigma, mark, category_mark)
```

#### Arguments

Х	- A lpp object representing a marked point pattern lying on a linear network (linnet object)
lixel_length	- A numeric value representing a lixel length that will be used for creating a split version of the network contained in X. Then, the length of all the segments of the split network is below lixel_length
sigma	- A numeric value representing the bandwidth parameter (in meters)
mark	- Mark of X that is used to characterize the type of event. The algorithm searches microzones of the network where this mark is over- or underrepresented
category_mark	- A numeric/character value from the set allowed in the chosen mark to compute the relative probability in relation to it

#### Value

Returns a list that contains the relative probability values estimated along the network for the type of event specified by mark and category\_mark

#### References

Baddeley, A., Rubak, E., & Turner, R. (2015). Spatial point patterns: methodology and applications with R. Chapman and Hall/CRC.

Briz-Redon, A., Martinez-Ruiz, F., & Montes, F. (2019). Identification of differential risk hotspots for collision and vehicle type in a directed linear network. Accident Analysis & Prevention, 132, 105278.

Diggle, P. J. (2013). Statistical analysis of spatial and spatio-temporal point patterns. Chapman and Hall/CRC.

Kelsall, J. E., & Diggle, P. J. (1995). Kernel estimation of relative risk. Bernoulli, 1(1-2), 3-16.

McSwiggan, G., Baddeley, A., & Nair, G. (2017). Kernel density estimation on a linear network. Scandinavian Journal of Statistics, 44(2), 324-345.

## SampleMarkedPattern

#### Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(raster)
library(maptools)
rel_probs_rear_end <- RelativeProbabilityNetwork(X = SampleMarkedPattern,
lixel_length = 50, sigma = 100, mark = "Collision", category_mark = "Rear-end")</pre>
```

SampleMarkedPattern Marked point pattern on a road network simulating traffic accidents

## Description

A simulated lpp object representing traffic accidents lying on a road structure. The pattern is marked, with the following marks: Collision, Bicycle, Car, Lorry, Motorcycle, Public.bus, Private.bus and Van. The mark Collision is a factor, with the following possible values: Crossing, Fixed-object, Rear-end, Run-off-road, Run-over, Side. The remaining marks are numeric and binary

#### Usage

SampleMarkedPattern

## Format

An object of class 1pp (inherits from ppx) of length 3.

Sensitivity_k_n	Performs a sensitivity analysis on the parameters k and n that are
	<pre>provided to DRHotspots_k_n</pre>

#### Description

Given a set of ks and ns parameters, this function allows the user to perform a sensitivity analysis on the parameters k and n by calling DRHotspots\_k\_n for each combination of k and n

#### Usage

Sensitivity\_k\_n(X, rel\_probs, ks, ns)

## Arguments

Х	- A lpp object representing a marked point pattern lying on a road network (linnet object)
rel_probs	- An object containing the relative probabilities of a specific type of event along the linear network contained in X, generated through the function RelativeProbabilityNetwork
ks	- A numeric vector of possible values for the k parameter that is provided to ${\tt DRHotspots\_k\_n}$
ns	- A numeric vector of possible values for the n parameter that is provided to ${\tt DRHotspots\_k\_n}$

## Value

A matrix providing the type-specific prediction accuracy index that corresponds to the set differential risk hotspots obtained for each value of k or n provided in ks and ns, respectively. A NA value in this matrix indicates that no differential risk hotspots are found for the corresponding combination of k and n

#### References

Briz-Redon, A., Martinez-Ruiz, F., & Montes, F. (2019). Identification of differential risk hotspots for collision and vehicle type in a directed linear network. Accident Analysis & Prevention, 132, 105278.

#### Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(raster)
library(maptools)

rel_probs_rear_end <- RelativeProbabilityNetwork(X = SampleMarkedPattern,
lixel_length = 50,sigma = 100,mark = "Collision",category_mark = "Rear-end")
sensitivity_analysis <- Sensitivity_k_n(X = SampleMarkedPattern, rel_probs = rel_probs_rear_end,
ks = c(1,2), ns = c(30,40))</pre>
```

SummaryDRHotspots	Performs a summary of a set of differential risk hotspots located along
	a linear network

#### Description

This function provides a basic summary of each differential risk hotspot provided in the object hotspots passed to the function. This includes the proportion of the type of event in each hotspot, the total length of the hotspot, a type-specific prediction accuracy index (PAI\_type). Furthermore, this summary is also provided for an extension of each of the hotspots

## Usage

```
SummaryDRHotspots(X, rel_probs, hotspots, order_extension = NULL,
    compute_p_value = F, n_it = 40)
```

## Arguments

Х	- A lpp object representing a marked point pattern lying on a linear network (linnet object)	
rel_probs	- An object containing the relative probabilities of a specific type of event along the linear network contained in X, generated through the function RelativeProbabilityNetwork	
hotspots	- A set of differential risk hotspots obtained with the function DiffHotspots_n_k	
order_extension		
	- A natural number indicating a neighbourhood order to be used for constructing an extension of the differential risk hotspots. The summary is also given for the segments forming this extension	
compute_p_value		
	- A Boolean value allowing the user to compute a p-value representing the sta- tistical significance of each differential risk hotspot	
n_it	<ul> <li>Number of simulations performed for the estimation of the p-value (if compute_p_value = T)</li> </ul>	

## Value

Returns a data.frame providing a summary of a set of differential risk hotspots. Each row of the output corresponds to one hotspot

## Examples

```
library(DRHotNet)
library(spatstat)
library(spdep)
library(raster)
library(maptools)
```

```
rel_probs_rear_end <- RelativeProbabilityNetwork(X = SampleMarkedPattern,
lixel_length = 50, sigma = 100, mark = "Collision", category_mark = "Rear-end")
hotspots_rear_end <- DRHotspots_k_n(X = SampleMarkedPattern, rel_probs = rel_probs_rear_end,
k = 1, n = 30)
hotspots_summary <- SummaryDRHotspots(X = SampleMarkedPattern, rel_probs = rel_probs_rear_end,
hotspots = hotspots_rear_end)
```

# Index

\*Topic **datasets** SampleMarkedPattern,7

 $\texttt{DRHotspots\_k\_n, 2}$ 

 ${\tt NeighbourhoodMatrixNetwork, 3}$ 

PlotHotspots, 4
PlotRelativeProbabilities, 5

 ${\tt Relative Probability Network, 6}$ 

SampleMarkedPattern, 7
Sensitivity\_k\_n, 7
SummaryDRHotspots, 8