

Package ‘GeNetIt’

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Type Package

Title Spatial Graph-Theoretic Genetic Gravity Modelling

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Description Implementation of spatial graph-theoretic genetic gravity models.

The model framework is applicable for other types of spatial flow questions.

Includes functions for constructing spatial graphs, sampling and summarizing associated raster variables and building unconstrained and singly constrained gravity models.

Depends R (>= 3.6.0)

Imports exactextractr, methods, nlme, sp, spdep, raster, rgeos, sf

Maintainer Jeffrey S. Evans <jeffrey_evans@tnc.org>

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URL <https://github.com/jeffreyevans/GeNetIt>

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Author Jeffrey S. Evans [aut, cre],
Melanie Murphy [aut]

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`area.graph.statistics` *Statistics for edges (lines) based on a defined scale (area).*

Description

Samples rasters for each edge and calculates specified statistics for buffer distance

Usage

```
area.graph.statistics(...)
```

Arguments

... Parameters to be passed to the modern version of the function

Note

Please note that this function has been deprecated, please use `graph.statistics` with the `buffer` argument.

<code>build.node.data</code>	<i>Build node data</i>
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Description

Helper function to build the origin/destination node data structure.

Usage

```
build.node.data(x, group.ids, from.parms, to.parms = NULL)
```

Arguments

x	A data.frame containing node (site) data
group.ids	Character vector of unique identifier that can be used to join to graph
from.parms	Character vector of independent "from" variables
to.parms	Character vector of independent "to" variables. If NULL is the same as from.parms

Value

data.frame

Note

Unless a different set of parameters will be used as the destination (to) there is no need to define the argument "to.parms" and the "from.parm" will be used to define both set of parameters.

The resulting data.frame represents the origin (from) and destination (to) data structure for use in gravity model. This is node structure is also known in the gravity literature as producer (from) and attractor (to).

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

Examples

```
data(ralu.site)

# Build from/to site (node) level data structure
site.parms = c("AREA_m2", "PERI_m", "Depth_m", "TDS")
site <- build.node.data(ralu.site@data, group.ids = c("SiteName"),
                        from.parms = site.parms )
```

Description

Prints diagnostic statistics for comparing gravity models

Usage

```
compare.models(...)
```

Arguments

...	gravity model objects
-----	-----------------------

Details

Results include model name, AIX, BIC, log likelihood, RMSE and number of parameters

Value

`data.frame` of competing model statistics

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

References

Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. *Molecular Ecology* 19(17):3634-3649

Examples

```
library(nlme)
data(ralu.model)

x = c("DEPTH_F", "HLI_F", "CTI_F", "cti", "ffp")
( null <- gravity(y = "DPS", x = c("DISTANCE"), d = "DISTANCE",
                    group = "FROM_SITE", data = ralu.model, method = "ML") )

( gm_h1 <- gravity(y = "DPS", x = x, d = "DISTANCE", group = "FROM_SITE",
                     data = ralu.model, ln = FALSE, method="ML") )
( gm_h2 <- gravity(y = "DPS", x = x[1:3], d = "DISTANCE", group = "FROM_SITE",
                     data = ralu.model, ln = FALSE, method="ML") )
( gm_h3 <- gravity(y = "DPS", x = x[c(4:5)], d = "DISTANCE", group = "FROM_SITE",
                     data = ralu.model, ln = FALSE, method="ML") )

compare.models(null, gm_h1, gm_h2, gm_h3)
```

dmatrix.df

Distance matrix to data.frame

Description

Coerces distance matrix to a `data.frame` object

Usage

`dmatrix.df(x, rm.diag = TRUE)`

Arguments

x	Symmetrical distance matrix
rm.diag	(TRUE/FALSE) remove matrix diagonal, self values.

Value

data.frame object representing to and from values

Note

Function results in data.frame object with "X1" (FROM), "X2" (TO) and "distance" columns. The FROM column represents to origin ID, TO represents destination ID and distance is the associated matrix distance. These results can be joined back to the graph object using either the origin or destination ID's.

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

Examples

```
library(sp)
pts <- cbind( x=runif(15, 480933, 504250), y=runif(15, 4479433, 4535122))
  pts <- SpatialPointsDataFrame(pts,
                                data.frame(ID=paste("ob",1:nrow(pts),sep="")))

# Create distance matrix
dm <- spDists(pts, pts)
  colnames(dm) <- pts@data[,"ID"]
  rownames(dm) <- pts@data[,"ID"]

# Coerce to data.frame with TO and FROM ID's and associated distance
dm.df <- dmatrix.df(dm)
  head(dm.df)
```

dps

dps genetic distance matrix for Columbia spotted frog (*Rana luteiventris*)

Description

Subset of data used in Murphy et al., (2010)

Format

A 29 x 29 genetic distance matrix:

References

Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. Molecular Ecology 19(17):3634-3649

flow	<i>Convert distance to flow</i>
------	---------------------------------

Description

Converts distance to flow (1-d) with or without data standardization

Usage

```
flow(x, standardize = FALSE, rm.na = FALSE, diag.value = NA)
```

Arguments

<code>x</code>	A numeric vector or matrix object representing distances
<code>standardize</code>	(FALSE/TRUE) Row-standardize the data before calculating flow
<code>rm.na</code>	(TRUE/FALSE) Should NA's be removed, if FALSE (default) the will be retained in the results
<code>diag.value</code>	If <code>x</code> is a matrix, what diagonal matrix values should be used (default is NA)

Value

A vector or matrix representing flow values

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

Examples

```
#### On a distance vector
flow(runif(10,0,1))
flow(runif(10, 0, 500), standardize = TRUE)

# With NA's
d <- runif(10, 0,1)
d[2] <- NA
flow(d)
flow(d, rm.na=TRUE)

#### On a distance matrix
dm <- as.matrix(dist(runif(5,0,1), diag = TRUE, upper = TRUE))
flow(dm)
```

graph.statistics	<i>Point sample and statistics for edges (lines)</i>
------------------	--

Description

Samples rasters for each edge and calculates specified statistics

Usage

```
graph.statistics(x, r, stats = c("min", "mean", "max"), buffer = NULL)
```

Arguments

x	sp SpatialLinesDataFrame or sf LINE object
r	A rasterLayer, rasterStack or rasterBrick object
stats	Statistics to calculate. If vectorized, can pass a custom statistic function.
buffer	Buffer distance, radius in projection units. For statistics based on edge buffer distance

Value

data.frame object of statistics

Note

...

Examples

```
library(sp)
library(spdep)
library(raster)
data(rasters)
data(ralu.site)

xvars <- stack(rasters)

dist.graph <- knn.graph(ralu.site, row.names = ralu.site$SiteName,
                       max.dist = 1500)
str(dist.graph@data)

skew <- function(x, na.rm = TRUE) {
  if (na.rm) x <- x[!is.na(x)]
  sum( (x - mean(x)) ^ 3) / ( length(x) * sd(x) ^ 3 )
}

# Moments on continuous raster data
```

```

system.time( {
  stats <- graph.statistics(dist.graph, r = xvars[[-6]],
                            stats = c("min", "median", "max", "var", "skew"))
} )

# Proportional function on nominal raster data
p <- function(x) { length(x[x < 52]) / length(x) }

system.time( {
  nstats <- graph.statistics(dist.graph, r = xvars[[6]],
                             stats = "p")
} )

# Based on 500m buffer distance around line(s)
system.time( {
  stats <- graph.statistics(dist.graph, r = xvars[[-6]],
                            stats = c("min", "median", "max", "var", "skew"),
                            buffer = 500)
} )

dist.graph@data <- data.frame(dist.graph@data, stats, nstats)
str(dist.graph@data)

```

gravity*Gravity model***Description**

Implements Murphy et al., (2010) gravity model

Usage

```
gravity(y, x, d, group, data, ln = TRUE, constrained = TRUE, ...)
```

Arguments

y	Name of dependent variable
x	Character vector of independent variables
d	Name of column containing distance
group	Name of grouping column (from or to)
data	data.frame object containing model data
ln	Natural log transform data (TRUE/FALSE)
constrained	Specify constrained model, if FALSE a linear model (lm) is run (TRUE/FALSE)
...	Additional argument passed to nlme or lm

Details

The "group" factor defines the singly constrained direction (from or to) and the grouping structure for the origins. To specify a null (distance only or IBD) model just omit the x argument.

By default constrained models are fit by maximizing the restricted log-likelihood (REML), for maximum likelihood use the type="ML" argument which is passed to the lme function. If ln=TRUE the input data will be log transformed

Value

formula Model formula
gravity Gravity model
AIC AIC value for selected model
log.likelihood Restricted log-likelihood at convergence
x data.frame of independent variables
y Vector of dependent variable
groups Ordered factor vector of grouping variable
fit Model Fitted Values

Note

Depends: nlme, lattice

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

References

- Murphy, M. A. & J.S. Evans. (in prep). GenNetIt: graph theoretical gravity modeling for landscape genetics
- Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. Molecular Ecology 19(17):3634-3649

See Also

- [groupedData](#) for how grouping works in constrained model
[lme](#) for constrained model ... options
[lm](#) for linear model ... options

Examples

```
library(nlme)
data(ralu.model)
str(ralu.model)

# Gravity model
```

```

x = c("DEPTH_F", "HLI_F", "CTI_F", "cti", "ffp")
( gm <- gravity(y = "DPS", x = x, d = "DISTANCE", group = "FROM_SITE",
      data = ralu.model, ln = FALSE) )

# Plot gravity results
par(mfrow=c(2,3))
  for (i in 1:6) { plot(gm, type=i) }

# log likelihood of competing models
x = c("DEPTH_F", "HLI_F", "CTI_F", "cti", "ffp")
for(i in x[-1]) {
  x1 = c(x[1], x[-which(x %in% i)])
  ll <- gravity(y = "DPS", x = x1, d = "DISTANCE", group = "FROM_SITE",
                 data = ralu.model, ln = FALSE)$log.likelihood
  cat("log likelihood for parameter set:", "(", x1, ")",
      " = ", ll, "\n")
}

# Distance only (IBD) model
gravity(y = "DPS", d = "DISTANCE", group = "FROM_SITE",
        data = ralu.model, ln = FALSE)

```

gravity.es

*Effect Size***Description**

Cohen's D effect size for gravity models

Usage

```
gravity.es(x, actual.n = FALSE, alpha = 0.95)
```

Arguments

x	gravity model object
actual.n	(FALSE/TRUE) Use actual N or degrees of freedom in calculating Confidence Interval
alpha	confidence interval

Details

Calculate Cohen's D statistic for each effect in a gravity model object

Value

data.frame of parameter effect size

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

References

- Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. *Molecular Ecology* 19(17):3634-3649
 Cohen, J. (1988) Statistical power for the behavioral sciences (2nd ed.). Hillsdale, NJ: Erlbaum

Examples

```
library(nlme)
data(ralu.model)

x = c("DEPTH_F", "HLI_F", "CTI_F", "cti", "ffp")
gm_h1 <- gravity(y = "DPS", x = x, d = "DISTANCE", group = "FROM_SITE",
                   data = ralu.model, ln = FALSE, method="ML")

gravity.es(gm_h1)
```

knn.graph

*Saturated or K Nearest Neighbor Graph***Description**

Creates a kNN or saturated graph SpatialLinesDataFrame object

Usage

```
knn.graph(
  x,
  row.names = NULL,
  k = NULL,
  max.dist = NULL,
  sym = FALSE,
  long.lat = FALSE,
  drop.lower = FALSE
)
```

Arguments

x	sp SpatialPointsDataFrame object
row.names	Unique row.names assigned to results
k	K nearest neighbors, defaults to saturated (n(x) - 1)
max.dist	Maximum length of an edge (used for distance constraint)

<code>sym</code>	Create symmetrical graph (FALSE/TRUE)
<code>long.lat</code>	(FALSE/TRUE) Coordinates are longitude-latitude decimal degrees, in which case distances are measured in kilometers
<code>drop.lower</code>	(FALSE/TRUE) Drop lower triangle of matrix (duplicate edges)

Value

SpatialLinesDataFrame object with:

- `i` Name of column in `x` with FROM (origin) index
- `j` Name of column in `x` with TO (destination) index
- `from_ID` Name of column in `x` with FROM (origin) region ID
- `to_ID` Name of column in `x` with TO (destination) region ID
- `length` Length of each edge (line) in projection units or kilometers if `long.lat = TRUE`

Note

...

Author(s)

Jeffrey S. Evans jeffrey_evans@tnc.org and Melanie Murphy melanie.murphy@uwyo.edu

References

- Murphy, M. A. & J.S. Evans. (in prep). "GenNetIt: gravity analysis in R for landscape genetics"
- Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. Molecular Ecology 19(17):3634-3649

Examples

```
library(sp)
data(ralu.site)

# Saturated spatial graph
sat.graph <- knn.graph(ralu.site, row.names=ralu.site@data[,"SiteName"])
head(sat.graph@data)

# Distanced constrained spatial graph
dist.graph <- knn.graph(ralu.site, row.names=ralu.site@data[,"SiteName"],
                         max.dist = 5000)

opar <- par(no.readonly=TRUE)
par(mfrow=c(1,2))
plot(sat.graph, col="grey")
points(ralu.site, col="red", pch=20, cex=1.5)
box()
title("Saturated graph")
plot(dist.graph, col="grey")
```

```

points(ralu.site, col="red", pch=20, cex=1.5)
  box()
  title("Distance constrained graph")
par(opar)

```

node.statistics *raster statistics for nodes*

Description

returns raster value or statistics (based on specified radius) for node

Usage

```
node.statistics(x, r, buffer = NULL, stats = c("min", "median", "max"))
```

Arguments

x	sp class SpatialPointsDataFrame object
r	A rasterLayer, rasterStack or rasterBrick object
buffer	Buffer distance, radius in projection units
stats	Statistics to calculate. If vectorized, can pass a custom statistic function.

Value

data.frame object of at-node raster values or statistics

Note

If no buffer is specified, at-node raster values are returned

Examples

```

library(sp)
library(spdep)
library(raster)
data(rasters)
data(ralu.site)

xvars <- stack(rasters)

skew <- function(x, na.rm = TRUE) {
  if (na.rm) x <- x[!is.na(x)]
  sum( (x - mean(x)) ^ 3) / ( length(x) * sd(x) ^ 3 )
}

```

```

# without buffer (values at point)
system.time( {
  stats <- node.statistics(ralu.site, r = xvars[[-6]],
    stats = c("min", "median", "max", "var", "skew"))
} )

# with 1000m buffer (values around points)
system.time( {
  stats <- node.statistics(ralu.site, r = xvars[[-6]], buffer = 1000,
    stats = c("min", "median", "max", "var", "skew"))
} )

dist.graph@data <- data.frame(dist.graph@data, stats, nstats)
str(dist.graph@data)

```

plot.gravity*Plot gravity model***Description**

Diagnostic plots gravity model with 6 optional plots.

Usage

```
## S3 method for class 'gravity'
plot(x, type = 1, ...)
```

Arguments

<i>x</i>	Object of class gravity
<i>type</i>	Type of plot (default 1, model structure I)
...	Ignored

Value

defined plot

Note

Plot types available: 1 - Model structure I, 2 - Model structure II, 3 - Q-Q Normal - Origin random effects, 4 - Q-Q Normal - Residuals , 5 - Fitted values, 6 - Distribution of observed verses predicted

Depends: nlme, lattice

Author(s)

Jeffrey S. Evans <jeffrey_evans@tnc.org> and Melanie Murphy <melanie.murphy@uwyo.edu>

References

- Murphy, M. A. & J.S. Evans. (in prep). "GenNetIt: gravity analysis in R for landscape genetics"
Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. Molecular Ecology 19(17):3634-3649
-

predict.gravity *Predict gravity model*

Description

predict method for class "gravity"

Usage

```
## S3 method for class 'gravity'  
predict(object, newdata, ...)
```

Arguments

object	Object of class gravity
newdata	New data, matching model parameters, used for obtaining the predictions
...	Arguments passed to predict.lme or predict.lm

Value

Model predictions

print.gravity *Print gravity model*

Description

summary method for class "gravity"

Usage

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

Arguments

x	Object of class gravity
...	Ignored

ralu.model*Columbia spotted frog (*Rana luteiventris*) data for specifying gravity model. Note, the data.frame is already log transformed.*

Description

Subset of data used in Murphy et al., (2010)

Format

A data.frame with 190 rows (sites) and 19 columns (covariates):

ARMI_ID Unique ID

FROM_SITE Unique from site ID

TO_SITE Unique to site ID

FST FST genetic distance

DPS DPS genetic distance

DISTANCE Graph edge distance

DEPTH_F At site water depth

HLI_F Heat Load Index

CTL_F Wetness Index

DEPTH_T At site water depth

HLI_T Heat Load Index

CTL_T Wetness Index

hli Heat Load Index

cti Wetness Index

ffp Frost Free Period

err27 Roughness at 27x27 scale

rsp Relative Slope Position

ridge Percent Ridge Line

hab_ratio Ratio of suitable dispersal habitat

References

Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. Molecular Ecology 19(17):3634-3649

ralu.site	<i>Subset of site-level spatial point data for Columbia spotted frog (<i>Rana luteiventris</i>)</i>
-----------	---

Description

Subset of data used in Murphy et al., (2010)

Format

A SpatialPointsDataFrame with 31 obs. of 17 variables:

SiteName Unique site name

Drainage Source drainage

Basin source basin

Substrate Wetland substrate

NWI USFWS NWI Wetland type

AREA_m2 Area of wetland

PERI_m Perimeter of wetland

Depth_m Depth of wetland

TDS ...

FISH Fish present

ACB ...

AUC ...

AUCV ...

AUCC ...

AUF ...

AWOOD ...

AUFV ...

References

Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. Molecular Ecology 19(17):3634-3649

rasters*Subset of raster data for Columbia spotted frog (*Rana luteiventris*)***Description**

Subset of data used in Murphy et al., (2010)

Format

A raster RasterStack:

rows 426

columns 358

resolution 30 meter

projection "+proj=utm +zone=11 +datum=NAD83 +units=m +no_defs +ellps=GRS80 +towgs84=0,0,0"

cti Compound Topographic Index ("wetness")

err27 Elevation Relief Ratio

ffp Frost Free Period

gsp Growing Season Precipitation

hil Heat Load Index

nlcd USGS Landcover

References

Murphy M.A., R. Dezzani, D.S. Pilliod & A.S. Storfer (2010) Landscape genetics of high mountain frog metapopulations. *Molecular Ecology* 19(17):3634-3649

summary.gravity*Summarizing Gravity Model Fits***Description**

Summary method for class "gravity".

Usage

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

Arguments

object	Object of class gravity
...	Ignored

Note

Summary of lme or lm gravity model, AIC, log likelihood and Root Mean Square Error (RMSE) of observed verses predicted

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