

# Package ‘expp’

February 4, 2019

**Type** Package

**Title** Spatial Analysis of Extra-Pair Paternity

**Version** 1.2.4

**Depends** R(>= 3.5.0)

**Imports** graphics, methods, sp, stats, spdep, rgeos, deldir, spatstat

**Suggests** roxygen2, knitr, lme4

**VignetteBuilder** knitr

**Description** Tools and data to accompany Schlicht, L., Valcu, M., & Kempenaers, B. (2015) <doi:10.1111/1365-2656.12293>. Spatial patterns of extra-pair paternity: beyond paternity gains and losses. *Journal of Animal Ecology*, 84(2), 518-531.

**License** GPL-3

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'DirichletPolygons.R' 'epp.R' 'eppSimDat.R' 'expp-package.R'  
'neighborsDataFrame.R'

**NeedsCompilation** no

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expp-package	<i>Tools and data to accompany Schlicht, Valcu and Kempnaers "Spatial patterns of extra-pair paternity: beyond paternity gains and losses"</i>
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## Description

The expp package provides classes and functions for the investigation of the probability of having extra-pair young within local networks of breeding pairs including both realized and potential extra-pairings.

## Details

Package: expp  
 Type: Package  
 Version: 1.0  
 Date: 2014-Aug-04  
 License: GPL-3

See `help(epp)` and `vignette('expp')`

## Functions

<a href="#">epp</a>	Final data-transformation to male-female combinations and their extra-pair levels
<a href="#">eppSimDat</a>	"Toy"-dataset creation to investigate potential Type I error rate inflation for models where

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<a href="#">DirichletPolygons</a>	Territory calculation via Dirichlet tessellation
<a href="#">eppMatrix</a>	data.frame to eppMatrix object
<a href="#">neighborsDataFrame</a>	nb object to data.frame
<a href="#">SpatialPointsBreeding</a>	data.frame to SpatialPointsBreeding object

## Author(s)

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## References

Schlicht, Lotte, Mihai Valcu, and Bart Kempenaers. "Spatial patterns of extra-pair paternity: beyond paternity gains and losses." *Journal of Animal Ecology* 84.2 (2015): 518-531.

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bluetit\_boundary      *Study area boundary.*

---

## Description

SpatialPolygonsDataFrame Study area boundary of two Blue Tit populations: Kolbeterberg, Vienna, Austria (1998 through 2004) and Westerholz, Bavaria, Germany (2007 through 2011) .

## Format

A SpatialPolygonsDataFrame with 12 SpatialPolygons.

**list("year\_")** numeric. The year of the observation.

## Examples

```
data(bluetit_boundary)
summary(bluetit_boundary)
```

---

bluetit\_breeding      *Blue Tit breeding data.*

---

## Description

Breeding data recorded for two Blue Tit populations in Kolbeterberg, Vienna, Austria (1998 through 2004) and Westerholz, Bavaria, Germany (2007 through 2011) . The data set contains breeding attempts locations, the respective social pair, and several individual and nest parameters.

## Format

A data frame with 1025 observations on the following 10 variables.

- year\_ numeric. The year of the observation.
- id numeric. The identity of the nest box in which the breeding attempt took place.
- x numeric. The east-west location of the nest box.
- y numeric. The north-south location of the nest box.
- female character. The identity of the female.
- male character. The identity of the male.

- layingDate numeric. The day of the year when the first egg was produced.
- male\_age character. The age class of the male ('juv' = 1st year breeder; 'adult' = older)
- male\_tarsus numeric. tarsus length (mm))
- study\_area character. The study area name.

### Examples

```
data(bluetit_breeding)
head(bluetit_breeding)
```

---

bluetit_epp	<i>Blue tit extra-pair paternity data.</i>
-------------	--

---

### Description

data.frame Extra-pair paternity data recorded for two Blue Tit populations in Kolbeterberg, Vienna, Austria (1998 through 2004) and Westerholz, Bavaria, Germany (2007 through 2011) .

### Format

A data frame with 425 observations on the following 3 variables.

- year\_ numeric. The year of the observation.
- female character. The female involved in the respective EPP event.
- male character. The male involved in the respective EPP event.

### Examples

```
data(bluetit_epp)
head(bluetit_epp)
```

---

DirichletPolygons      *Dirichlet Polygons*

---

## Description

Computes the Dirichlet polygons using a [SpatialPointsBreeding](#) object and optionally a boundary [SpatialPolygons](#) or a vector containing id-s located at the boundary.

## Usage

```
DirichletPolygons(x, boundary, ...)

## S4 method for signature 'SpatialPointsBreeding,missing'
DirichletPolygons(x, boundary,
  ...)

## S4 method for signature 'SpatialPointsBreeding,integer'
DirichletPolygons(x, boundary,
  width)

## S4 method for signature 'SpatialPointsBreeding,SpatialPolygons'
DirichletPolygons(x,
  boundary)
```

## Arguments

x	A <a href="#">SpatialPointsBreeding</a> object.
boundary	A <a href="#">SpatialPolygons</a> or a vector of integers containing the id-s located at the boundary. When missing boundary is inferred using <a href="#">ripras</a> in spatstat .
...	passed to <a href="#">ripras</a>
width	argument passed to <a href="#">gBuffer</a> . It defines the distance between boundary boxes and the boundary polygon; it is set by default to half of the average distance between boundary boxes.

## Examples

```
d = data.frame(
  x = c(4, 17, 16, 41, 41, 43, 86, 62, 71, 92, 95,53, 34, 27, 53),
  y = c(3, 18, 36, 6, 18, 50, 3, 21, 40, 43, 57, 62, 62, 45, 37),
  id = 1:15,male = paste0('m', 1:15), female = paste0('f', 1:15),
  stringsAsFactors=FALSE)

b = SpatialPointsBreeding(d, id = 'id', breeding = ~ male + female)

# boundary is inferred based on the Ripley-Rasson estimate of the spatial domain
dp1 = DirichletPolygons(b)
```

```

plot(dp1)

# boundary is given
brdy2 = rgeos::readWKT("POLYGON((28 71,67 68,70 49,84 49,90 74,111 65,107
                               36,78 28,98 15,98 -4,74 -7,-2 -8,0 31,28 71) )")
dp2 = DirichletPolygons(b, boundary = brdy2)
plot(dp2)

# boundary is inferred based on the boundary id-s.
# define boundary id-s using a 'Follow-The-Dots' strategy.
brdy3 = as.integer(c(1, 2, 4, 7, 9, 10, 11, 12, 13, 14, 3))

dp3 = DirichletPolygons(b, boundary = brdy3)
plot(dp3)

# setting width manually
dp4 = DirichletPolygons(b, boundary = brdy3, width = 2)
plot(dp4)

plot(dp1)
plot(dp2, add = TRUE, border = 2)
plot(dp3, add = TRUE, border = 3)
plot(dp4, add = TRUE, border = 4)
plot(b, add = TRUE)

```

---

epp-class

*Building data-set for realized and unrealized EPP-pairs*


---

## Description

epp combines a `SpatialPointsBreeding`, a `SpatialPolygons*` as obtained from `DirichletPolygons` and a `eppMatrix` to create the spatial context for every potential and realized extra-pair male-female combination.

## Usage

```

epp(breedingDat, polygonsDat, eppDat, maxlag = 3)

## S4 method for signature 'epp,missing'
plot(x, zoom, maxlag = 3, zoom.col = "grey",
     ...)

## S4 method for signature 'epp'
barplot(height, relativeValues = FALSE, ...)

## S4 method for signature 'epp'
as.data.frame(x)

```

**Arguments**

breedingDat	A SpatialPointsBreeding object, created by the SpatialPointsBreeding function
polygonsDat	A SpatialPolygons* object as obtained by calling DirichletPolygons function
eppDat	An object of class eppMatrix
maxlag	A numeric value indicating the maximum breeding distance for which male-female combinations should be calculated. When plotting it defines the outermost row of neighbors plotted around a focal id set by zoom
x, height	an epp object
zoom	a SpatialPointsBreeding id which is used for subsetting prior to plot
zoom.col	background color of the id (and hence the polygon) set by zoom
...	further arguments to pass to plot.SpatialPointsBreeding and plot.SpatialPolygons*
relativeValues	Defines the unit of the y-axis. TRUE plots proportions, FALSE absolute numbers.

**Details**

'plot' plots the territories, the identity of males ('m...') and females ('f...') at breeding sites (numbers), and the extra-pair events (dashed red arrows). Individuals that had extra-pair offspring are marked red. The parameter 'zoom' can be used to make a detailed visual check of a specific location (nestbox) and its surroundings.

'barplot' displays the distribution of extra-pair events over different breeding distances between the partners (in the number of territories) as vertical bars. Note that the distribution of all potential extra-pair partners is displayed as a dashed line only if the argument 'relativeValues' is TRUE.

**Value**

Returns an S4-class epp-object with 5 slots:

breedingDat	Input breeding data-set.
polygonsDat	Either polygons are estimated automatically using Thiessen Polygons, or input breeding polygons.
eppDat	Input data.frame with all male-female combinations that had EPP together.
maxlag	Input rank. Defaults to 3.
EPP	data.frame containing columns for the focal male and female ("male", "female"), their breeding distance ("rank"), and the parameters associated either with the male (column with prefix "_MALE") or the female (column with prefix "_FEMALE") territory.

**See Also**

vignette(expp)

**Examples**

```

### Simple example with three breeding pairs
require(expp)
# create raw data
set.seed(1310)
b = data.frame(id = as.integer(10:12), x = rnorm(3), y = rnorm(3),
male = paste0("m",1:3), female = paste0("f",1:3), xx = rnorm(3), stringsAsFactors=FALSE )
eppPairs = data.frame(male = c("m1", "m2", "m1"), female=c("f3", "f1", "f2") )

# prepare data
breedingDat = SpatialPointsBreeding(b, id = 'id', coords = ~ x + y, breeding = ~ male + female)
polygonsDat = DirichletPolygons(breedingDat)
eppDat = eppMatrix(eppPairs, pairs = ~ male + female)

plot(breedingDat, eppDat)

# convert to epp class
x = epp(breedingDat, polygonsDat, eppDat, maxlag = 3)
as.data.frame(x)

#plot
plot(x)

### Example on a random data set with n breeding pairs and n/2 extra-pair paternity rate
# create raw data
set.seed(123)
n = 20
b = data.frame(id = 1:n, x = rnorm(n), y = rnorm(n),
male = paste0("m",1:n), female = paste0("f",1:n), xx = rnorm(n), stringsAsFactors=FALSE )
eppPairs = data.frame(male = sample(b$male, round(n/2) ), female = sample(b$female, round(n/2) ) )

# prepare data
breedingDat = SpatialPointsBreeding(b, id = 'id', coords = ~ x + y, breeding = ~ male + female)
polygonsDat = DirichletPolygons(breedingDat)
eppDat = eppMatrix(eppPairs, pairs = ~ male + female)

# convert to epp class
x = epp(breedingDat, polygonsDat, eppDat, maxlag = 10)

# plot
plot(x)
barplot(x)
barplot(x, relativeValues = TRUE)

### Real data example
# Raw datasets
data(bluetit_breeding)
data(bluetit_epp)

```



```

# select one year
year = 2010
b = bluetit_breeding[bluetit_breeding$year_ == year, ]
eppPairs = bluetit_epp[bluetit_epp$year_ == year, ]

# prepare data
breedingDat = SpatialPointsBreeding(b, id = 'id', coords = ~ x + y, breeding = ~ male + female)
polygonsDat = DirichletPolygons(breedingDat)
eppDat = eppMatrix(eppPairs, pairs = ~ male + female)

# convert to epp class
x = epp(breedingDat, polygonsDat, eppDat, maxlag = 2)

# plot
plot(x)
barplot(x)
# plot zoom
plot(x, zoom = 120, maxlag = 3)

# run model on epp probability
dat = as.data.frame(x)
nrow(dat[dat$epp == 1, c('male', 'female')] )
nrow(unique(eppPairs))

if(require(lme4))
  (summary(glmer(epp ~ rank + male_age_MALE + (1|male) + (1|female),
    data = dat, family = binomial)))

```

---

eppMatrix-class

*Convert a data.frame to an eppMatrix object.*


---

### Description

Converts a data.frame to a eppMatrix object using a ~male+female formula.

### Usage

```
eppMatrix(data, pairs = ~male + female)
```

### Arguments

data	a data.frame
pairs	a formula indicating the extra-pair male and the extra-pair female in that order.

**Value**

An object of class `eppMatrix` with two slots.

**Slots**

male extra-pair male ID-s as character vectors

female extra-pair female ID-s as character vectors

**See Also**

[epp](#)

**Examples**

```
eppPairs = data.frame(male = c("m1", "m2", "m1"), female=c("f3", "f1", "f2") )
e = eppMatrix(eppPairs, pairs = ~ male + female)
class(e)
showClass("eppMatrix")

data(bluetit_breeding)
data(bluetit_epp)
b = bluetit_breeding[bluetit_breeding$year_ == 2010, ]
eppPairs = bluetit_epp[bluetit_epp$year_ == 2010, ]

breedingDat = SpatialPointsBreeding(b, id = 'id', coords = ~ x + y, breeding = ~ male + female)
eppDat = eppMatrix(eppPairs, pairs = ~ male + female)

plot(breedingDat, eppDat)
```

---

eppSimDat

*Type I error rate simulations*

---

**Description**

A helper function to perform Type I error rate simulations.

**Usage**

```
eppSimDat(N = 10, meanClutch = 10, eppRate = 0.1, eppMax = 12,
  eppMales = 0.35, nLags = 3)
```

**Arguments**

N	Number of breeding pairs; default value is 10
meanClutch	Mean clutch size (integer); clutch size it is assumed to be Poisson distributed; default is 10
eppRate	Proportion of extra-pair young in population; default is 0.10
eppMax	Maximum number of extra-pair young by male; default is 12
eppMales	Proportion of extra-pair males in population; default is 0.35
nLags	maxlag parameter to pass to <a href="#">DirichletPolygons</a>

**Details**

All default values match the values found in one of our study populations ('Westerholz').

**Value**

An object of class `epp` The data.frame of the EPP slot contains two variable (trait\_MALE trait\_FEMALE) simulated independent from the epp variable.

**Examples**

```
d = eppSimDat()
plot(d)

# Type I error rate simulation

require(lme4)
pval_glmer = vector(mode = "numeric", length = 0)
pval_glm = vector(mode = "numeric", length = 0)

# For meaningful results increase i to e.g. 500 and N in eppSimDat to e.g. 120
for(i in 1:5) {
  x = as.data.frame(eppSimDat(N = 25, meanClutch = 10, eppRate = 0.10, eppMax = 12,
    eppMales = 0.35, nLags = 3))

  fm1glmer = glmer(epp ~ rank + trait_MALE + trait_FEMALE + (1 | male) + (1 | female) ,
    data = x, family = binomial, nAGQ = 0)
  fm0glmer = update(fm1glmer, epp ~ 1 + (1 | male) + (1 | female) )
  pval_glmer[i] = anova(fm0glmer, fm1glmer)$"Pr(>Chisq)"[2]

  fm1glm = glm(epp ~ rank + trait_MALE + trait_FEMALE , data = x, family = binomial)
  fm0glm = update(fm1glm, epp ~ 1 )
  pval_glm[i] = anova(fm0glm, fm1glm, test = "Chisq")$"Pr(>Chi)"[2]

  print(i)
}

# Type I error rate of glmer models
```

```
table(pval_glm<0.05)[2]/length(pval_glm)

# Type I error rate of the equivalent glm models
table(pval_glm<0.05)[2]/length(pval_glm)
```

---

```
neighborsDataFrame      Convert a nb object to data.frame.
```

---

### Description

Convert an object of class nb in package spdep or a list of nb objects to data.frame.

### Usage

```
neighborsDataFrame(nb)

higherNeighborsDataFrame(nb, maxlag)
```

### Arguments

```
nb          an object of class nb
maxlag      maximum lag, see nblag
```

### Value

```
data.frame
```

---

```
SpatialPointsBreeding-class
      Converts a data.frame to an object of class
      SpatialPointsBreeding
```

---

### Description

Converts a [data.frame](#) to a SpatialPointsBreeding object. The SpatialPointsBreeding class extends [SpatialPointsDataFrame](#) with three extra slots defining the id (i.e. nest or breeding box) and the pair identity (i.e. male and female), respectively.

**Usage**

```

SpatialPointsBreeding(data, proj4string, coords = ~x + y,
  breeding = ~male + female, id)

## S4 method for signature 'SpatialPointsBreeding,missing'
plot(x, pch = 20,
  axes = FALSE, add = FALSE, xlim = NULL, ylim = NULL, ...,
  cex = 1, col = "grey", lwd = 1, bg = "grey90")

## S4 method for signature 'SpatialPointsBreeding,eppMatrix'
plot(x, y, pch = 20,
  axes = FALSE, add = FALSE, xlim = NULL, ylim = NULL, ...,
  cex = 1, col = "grey", col.epp = "red", lwd = 1, lty = 2,
  bg = "grey90")

```

**Arguments**

data	a <a href="#">data.frame</a> containing the coordinates (e.g. "x","y"), the location id, and the pair identity (e.g. "male", "female") together with any other optional variables (e.g. individuals or nest traits).
proj4string	A <a href="#">CRS</a> object containing a valid proj4 string. See <a href="#">CRS proj4string</a> for details.
coords	Formula specifying which columns in object are the spatial coordinates. Argument passed to <a href="#">coordinates</a>
breeding	One side formula defining the male and female ID in that order (e.g. ~ male + female)
id	Integer specifying the location id (e.g. nest box number, den ID).
x	a <code>SpatialPointsBreeding</code> object
pch	see <code>plot.default</code>
axes	see <code>plot.default</code>
add	see <code>plot.default</code>
xlim	see <code>plot.default</code>
ylim	see <code>plot.default</code>
...	further arguments to pass to <code>plot(as(x, "Spatial"))</code>
cex	see <code>plot.default</code>
col	see <code>plot.default</code>
lwd	see <code>plot.default</code>
bg	see <code>plot.default</code>
y	an <code>eppMatrix</code> object
col.epp	extra-pair partners color
lty	see <code>plot.default</code>

**See Also**

[epp](#)

**Examples**

```
d = data.frame(  
  x = c(4, 17, 16, 41, 41, 43, 86, 62, 71, 92, 95,53, 34, 27, 53),  
  y = c(3, 18, 36, 6, 18, 50, 3, 21, 40, 43, 57, 62, 62, 45, 37),  
  id = 1:15,male = paste0('m', 1:15), female = paste0('f', 1:15),  
  stringsAsFactors = FALSE)  
  
b = SpatialPointsBreeding(d, id = 'id', breeding = ~ male+female)  
  
plot(b)
```

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