Package ‘gRc’

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Title Inference in Graphical Gaussian Models with Edge and Vertex Symmetries

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Description Estimation, model selection and other aspects of statistical inference in Graphical Gaussian models with edge and vertex symmetries (Graphical Gaussian models with colours). Documentation about 'gRc' is provided in the paper by Højsgaard and Lauritzen (2007, <doi:10.18637/jss.v023.i06>) and the paper by Højsgaard and Lauritzen (2008, <doi:10.1111/j.1467-9868.2008.00666.x>).

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Description

Make a test for adding/dropping all colour classes in scope for an RCOX model.

Usage

```r
## S3 method for class 'rcox'
add1(object, scope, details = 0, trace = 0, ...)  
## S3 method for class 'rcox'
drop1(object, scope, details = 0, trace = 0, stat = "wald", ...)
```

Arguments

- `object`: An RCOX model, an object of class 'rcox'
- `scope`: A set of edge colour classes to be considered for addition or deletion, see 'details'.
- `details`: Control the amount of output created.
- `trace`: For debugging purposes
- `stat`: Either "wald" for a Wald statistic or "dev" for a deviance statistic.
- `...`: Additional arguments, currently unused.

Value

A list with entries:

- `tab`: A data frame with the test results
- `cc`: A list of colour classes

Note

Note that the keyword 'stat' is not available for add1 because this function expands the current model and hence the Wald statistic is not available.

Author(s)

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**comparecc**

**See Also**

`comparecc, stepadd1, stepdrop1`

**Examples**

```r
data(math)
gc.sat <- ~me:ve:al:st:an
gc.1  <- ~me+ve+al+st+an

m.sat <- rcox(gm=gc.sat, data=math)
m.1   <- rcox(gm=gc.1,  data=math)

t.sat <- drop1(m.sat)
t.sat$tab

t.sat$cc
t.1 <- add1(m.1)
t.1$tab
t.1$cc
```

**comparecc**

*Compare colour classes of an RCOX model*

**Description**

A general function for pairwise comparisons of colour classes in an RCOX model, i.e. for testing whether the corresponding parameters are significantly different.

**Usage**

```r
comparecc(object, cc1 = NULL, cc2 = NULL, type = "ecc", stat = "wald", details = 1)
```

**Arguments**

- **object**: An RCOX model, an object of class `rcox`
- **cc1, cc2**: Lists of colour classes of type `type`, see 'details' for an explanation of the defaults.
- **type**: Either "ecc" for edge colour classes or "vcc" for vertex colour classes
- **stat**: Base the comparison on either "wald" for a Wald statistic or "dev" for a deviance statistic
- **details**: Control the amount of output created.

**Details**

All colour classes specified in `cc1` are compared with all those given in `cc2` (duplicate entries are not compared). If `cc2=NULL` (the default) then all colour classes specified in `cc1` are compared with all colour classes in the model except those specified in `cc1`. If `cc1=NULL` (the default) and `cc2=NULL` then all pairwise comparisons are made.
Value

A list with entries:

- `tab` A data frame with the test results
- `cc1, cc2` Lists of colour classes

Author(s)

Søren Højsgaard, sorenh@agrsci.dk

See Also

`add1.rcox`, `drop1.rcox`, `stepadd1`, `stepdrop1`, `join1`, `split1`, `stepjoin1`, `stepsplit1`

Examples

data (math)

```r
gm = ~al:an:st
vcc = list(~me+st, ~ve+an, ~al)
ecc = list(~me:ve+me:al, ~ve:al+al:st)

m1 <- rcox(gm=gm, vcc=vcc, ecc=ecc, data=math)

comparecc(m1, type="vcc")
comparecc(m1, type="ecc")
```

---

**fit**  
*Fit RCOX models*

Description

This is a general function for fitting RCOX models (i.e. RCON and RCOR models) using different estimation algorithms.

Usage

```r
## S3 method for class 'rcox'
fit(object, Kstart=object$Kstart, method = object$method, control = object$control, details = object$details, trace = object$trace, returnModel = TRUE,...)
```
Arguments

object       An RCOX model object (an object of class 'rcox')
Kstart       An initial value for the concentration matrix.
method       The specific estimation method. Can be either "scoring", (a modified Fisher
             scoring algorithm), "ipm" (iterative partial maximization), "matching" (score
             matching) or "user" (currently not used)
control      A list controlling the fitting algorithms. See the 'details' section.
details      The amount of details printed on the screen. 0 means no details at all.
trace        Controls various diagnostics print outs. A debugging feature not intended for
             the user.
returnModel  If TRUE the model object m is returned with fitting info added to it. If FALSE
             only the fitting info is returned.
...           Additional arguments; currently not used.

Details

The fitted parameters etc. can be extracted using 'fitInfo(m)'.
The control argument is a list with named entries. Most important are the entries 'maxouter' and
'maxinner' (which both defaults to 25) for controlling the estimation algorithms. For other compo-
nents please refer to the code.

Value

An RCOX model object.

Author(s)

Søren Højsgaard, sorenh@agrsci.dk

See Also

rcox, update.rcox

Examples

data(math)
gm = ~al:an:st
ccc = list(~me+st, ~ve+an, ~al)
eccc = list(~me:ve+me:al, ~ve:al+al:st)

ml <- rcox(gm=gm, ccc=ccc, eccecc=eccc, data=math, fit=FALSE)

fit(ml, method="matching")
fit(ml, method="scoring")
fit(ml, method="ipm")

## MISSING
getSlot  

Accessing RCOX model objects

Description

Accessing RCOX model objects

Usage

## accessor functions

getSlot(object, slot)
fitInfo(object, slot)
intRep(object, slot)
dataRep(object, slot)
getecc(object)
getvcc(object)
getedges(object, complement=FALSE)

Arguments

- **object**: An RCOX model object.
- **slot**: A name of a slot.
- **complement**: If FALSE, the edges of the model is returned. If TRUE, the edges not in the model is returned.

Author(s)

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See Also

rcox

Examples

data(math)
gm = ~al:an:st
vcc = list(~me+st, ~ve+an, ~al)
ecc = list(~me:ve+me:al, ~ve:al+al:st)

m1 <- rcox(gm=gm, vcc=vcc, ecc=ecc, data=math)
getecc(m1)

getSlot(m1, "type")
fitInfo(m1)
fitInfo(m1, "K")


**gRc**

*The package ‘gRc’: summary information*

**Description**

This package is for statistical inference in RCOX models. That is, graphical Gaussian models where specific entries of the inverse covariance matrix or partial correlation matrix have been restricted to being equal. Entries which are restricted to being identical are displayed with identical colours in the independence graph. Hence the name of the package gRc: The "c" stands for colours.

**Details**

The function for specifying RCOX models is rcox, and we refer to the help page for that function for examples.

**Authors**

Søren Højsgaard, sorenh@agrsci.dk

**See Also**

rcox

---

**join\$split**

*Joining and splitting of colour classes in RCOX models*

**Description**

Test for joining of two colour classes (of a specific type) by testing if their corresponding parameters are not significantly different. Split a colour class and test how much this changes the fit of the model.

**Usage**

join1(object, scope=NULL, type = "ecc", details = 1, stat = "wald")

split1(object, scope=NULL, type = "ecc", details = 1)

**Arguments**

- **object**: An RCOX model, an object of class RCOX
- **scope**: A specification of colour classes which should be considered for joining/splitting. If NULL, then all colour classes are considered.
- **type**: Either "ecc" for edge colour classes or "vcc" for vertex colour classes.
- **stat**: Either "wald" for a Wald statistic or "dev" for deviance statistic.
- **details**: Control the amount of output
Value

A list with entries:

- **tab**: A data frame with the test results
- **cc**: A list of colour classes

Note

Note that the keyword `stat` is not available for `split1` because this function expands the current and hence the Wald statistic is not available. Note also that `join1` is simply a wrapper for `comparecc` applied to edge colour classes.

Author(s)

Søren Højsgaard, sorenh@agrsci.dk

References

~put references to the literature/web site here~

See Also

- [rcox](#), [update](#), [comparecc](#)

Examples

```r
data(math)
g1 <- ~me:ve:al+al:st:an
m1 <- rcox(gm=g1, data=math)
join1(m1)

gm = ~al:an:st
vcc = list(~me+st, ~ve+an)
ecc = list(~me:ve+me:al, ~ve:al+al:st)
m2 <- rcox(gm=gm, vcc=vcc, ecc=ecc, data=math, type="rcon")
split1(m2)
```

---

**rcox**

*Main function for specifying RCON/RCOR models*

Description

This is the main function for specifying and fitting RCON/RCOR models in the package along with certain utility functions.
Usage
rcox(gm = NULL, vcc = NULL, ecc = NULL, type = c("rcon", "rcor"),
method = "ipm",
fit = TRUE, data = NULL, S = NULL, n = NULL, Kstart, control = list(),
details=1, trace=0)

Arguments

- **gm**: Generating class for a graphical Gaussian model, see 'Examples' for an illustration
- **vcc**: List of vertex colour classes for the model
- **ecc**: List of edge colour classes for the model
- **type**: Type of model. Default is RCON
- **method**: Estimation method; see 'Details' below.
- **fit**: Should the model be fitted
- **data**: A dataframe
- **S**: An empirical covariance matrix (as alternative to giving data as a dataframe)
- **n**: The number of observations (which is needed if data is specified as an empirical covariance matrix)
- **Kstart**: An initial value for K. Can be omitted.
- **control**: Controlling the fitting algorithms
- **details**: Controls the amount of output
- **trace**: Debugging info

Details

Estimation methods:

- 'ipm' (default) is iterative partial maximization which when finished calculates the information matrix so that approximate variances of the parameters can be obtained using vcov().
- 'ipms' is iterative partial maximization without calculating the information matrix. This is the fastest method.
- 'scoring' is stabilised Fisher scoring.
- 'matching' is score matching followed by one step with Fisher scoring.
- 'hybrid1' is for internal use and should not be called directly

Value

A model object of type 'RCOX'.

Note

demo("gRc-JSS") gives a more comprehensive demo.
**Stepwise model selection in RCOX models**

**Description**

These allow for stepwise model selection in RCOX models by. Model expansion (i.e. forward selection) is obtained by adding edge colour classes and by splitting edge/vertex colour classes. Model reduction (i.e. backward selection) is obtained by dropping edge colour classes and by joining edge/vertex colour classes.

**Usage**

```r
stepadd1 (object, criterion = "aic", steps = 1000, k = 2, alpha = 0.05, headlong=FALSE, random=TRUE, details=1, trace=0,...)
stepdrop1 (object, criterion = "aic", steps = 1000, k = 2, alpha = 0.05, stat = "wald", headlong=FALSE, random=TRUE, details=1, trace=0,...)
stepjoin1 (object, scope, type = "ecc", criterion = "aic", steps = 1000, k = 2, alpha = 0.05, stat = "wald", details = 1, trace=0)
```
stepsplit1(object, type = "ecc", criterion = "aic", steps = 1000, k = 2, alpha = 0.05, stat = "wald", details = 1, trace=0)

Arguments

object An RCOX model, an object of class RCOX
scope A set (list) of items (edge colour classes or vertex colour classes) to be considered. If missing, then all items are considered.
criterion Either "aic" (the default), "bic" or "test" (for significance test)
type Either "ecc" for edge colour classes or "vcc" for vertex colour classes.
k The multiple of the number of degrees of freedom used for the penalty when criterion is "aic". Ignored when criterion is "bic" or "test". Only k = 2 gives the genuine AIC.
steps The maximum number of steps to be considered. The default is 1000 (essentially as many as required). It is typically used to stop the process early
stat Either "wald" for a Wald statistic or "dev" for a deviance statistic.
alpha Critical value if 'criterion' is "test". If criterion is "aic" or "bic", the critical value is 0.
headlong If TRUE then at each step the first encountered edge that may be removed/added according to the current criterion is done so.
random If TRUE, then the edges are examined in random order
details Control the amount of output created.
trace For debugging purposes
... Additional arguments, currently not used.

Value

Either NULL or a new RCOX model.

Note

Note that the keyword 'stat' is not available for stepadd1 and stepsplit1 because these functions expand the current model and hence the Wald statistic is not available.

Author(s)

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See Also

split1 join1 add1.rcox drop1.rcox comparecc
tr \quad \textit{Calculate trace of various matrix products}

\textbf{Description}

Calculate trace of various matrix products.

\textbf{Usage}

\begin{verbatim}
trA(A)
trAW(A,W)
trAWB(A,W,B)
trAWBW(A,W,B)
trAWBV(A,W,B,V)
\end{verbatim}

\textbf{Arguments}

\begin{itemize}
\item \texttt{A,B} Square matrices represented as matrices or lists (see examples below).
\item \texttt{W,V} Square matrices
\end{itemize}

\textbf{Value}

A number

\textbf{Author(s)}

Søren Højsgaard, sorenh@agrsci.dk

\textbf{Examples}

\begin{verbatim}
d <- 5
W <- matrix(rnorm(d*d),nr=d,nc=d);
V <- W <- w+t(w)

## Turn list into matrix
##
tomat <- function(x){
  ans <- do.call("rbind", x)
  storage.mode(ans)="double"
  return(ans)
}

A1 <- tomat(list(c(1,2),c(1,3)))
A2 <- tomat(list(1,3,5))

## Just for checking the calculations
##
symMat <- function(A,d){
\end{verbatim}
```r
ans <- matrix(0Lnr=d,nc=d)
for (i in 1:length(A)){
  e <- A[i]
  if (length(e)==1){
    ans[e,e] <- 1
  } else {
    ans[e[1],e[2]] <- ans[e[2],e[1]] <- 1
  }
}
return(ans)
}

trAW(A1, W)
#sum(diag(symMat(A1,d=d) %*% W))

trAW(A2, W)
#sum(diag(symMat(A2,d=d) %*% W))

trAWB(A1, W, A2)
#sum(diag(symMat(A1,d=d) %*% W %*% symMat(A2,d=d)))

trAWBV(A1, W, A2, V)
#sum(diag(symMat(A1,d=d) %*% W %*% symMat(A2,d=d) %*% V))
```

---

**update.rcox**

*Update an RCOX model*

---

**Description**

`update` will update and (by default) re-fit an RCOX model.

**Usage**

## S3 method for class 'rcox'

`update(object, vcc = NULL, ecc = NULL, splitecc = NULL, splitvcc = NULL, joinvcc = NULL, joinecc = NULL, addecc = NULL, dropecc = NULL, Kstart = NULL, fit = TRUE, control=NULL, trace = object$trace, ...)`

**Arguments**

- **object**: An RCOX model, an object of class RCOX
- **vcc**: Specification of the vertex colour classes in the model
- **ecc**: Specification of the edge colour classes in the model
- **splitvcc**: Existing vertex colour class to be split
- **splitecc**: Existing edge colour class to be split
- **joinvcc**: Existing vertex colour classes to be joined
update.rcox

joinecc  Existing vertex colour classes to be joined
addecc   New edge colour classes to be added
dropecc  Existing vertex color classes to be dropped (deleted)
Kstart   A start value for K
fit      Should the updated model be fitted.
control  A list of control parameters.
trace    For debugging purposes
...      Additional arguments, currently not used.

Value

A new model object of class 'rcox'.

Warning

Only one of the arguments pertaining to edge colour classes (i.e. ecc, splitecc, joinecc, dropecc, addecc) should be applied at the time. Likewise for the arguments pertaining to the vertex colour classes.

The result will otherwise be highly unpredictable and is likely to cause an error.

Author(s)

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See Also

rcox

Examples

data(math)
gm = ~al:an:st
vcc = list(~me+st, ~ve+an, ~al)
ecc = list(~me:ve+me:al, ~ve:al+al:st)

m1 <- rcox(gm=gm, vcc=vcc, ecc=ecc, data=math, method='matching', trace=0)

update(m1, joinvcc=list(~me+st, ~ve+an))
update(m1, joinecc=list(~al:an, ~an:st))

update(m1, splitvcc=~ve+an)
update(m1, splitecc=~me:ve+me:al)

update(m1, dropecc=list(~me:st+st:an,~al:an,~st:al))
update(m1, addecc=list(~an:me+st:ve))
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