# Package 'MuMIn'

September 2, 2010

| Type Package   |
|--|
| Title Multi-model inference  |
| <b>Version</b> 0.13.13   |
| <b>Date</b> 2010-09-02   |
| Encoding UTF-8   |
| Author Kamil Bartoń  |
| Maintainer Kamil Bartoń <kamil.barton@go2.pl></kamil.barton@go2.pl>  |
| <b>Description</b> Model selection and model averaging based on information criteria (AICc and alike).   |
| License GPL  |
| Suggests lme4, nlme  |
| LazyLoad yes   |
| R topics documented:   |
| MuMIn-package       2         AICc       3         Cement       3         dredge       4         get.models       6         miscellaneous       7         model.avg       8         par.avg       12         QAIC       13         subset.model.selection       14 |
| Index 16   |

2 MuMIn-package

MuMIn-package

Multi-model inference

#### **Description**

The package MuMIn contains functions for (automated) model selection and model averaging based on information criteria (AIC alike).

#### **Details**

User level functions include:

```
model.avg does model averaging.

get.models evaluates models from the table returned by dredge.

dredge runs models with combinations of terms of the supplied 'global.model'.
```

AICc calculates second-order Akaike information criterion for one or several fitted model objects.

### Author(s)

```
Kamil Bartoń < kamil.barton@go2.pl>
```

#### References

Burnham, K. P. and Anderson, D. R (2002) *Model selection and multimodel inference: a practical information-theoretic approach*. 2nd ed.

### See Also

```
AIC, step
```

#### **Examples**

```
fm1 <- lm(Fertility ~ . , data = swiss)

dd <- dredge(fm1)
top.models.1 <- get.models(dd, subset = delta < 4)
model.avg(top.models.1) # get averaged coefficients

top.models.2 <- get.models(dd, cumsum(weight) <= .95)
model.avg(top.models.2) # get averaged coefficients

# Mixed models:
# modified example(lme)
data(Orthodont, package="nlme")
require(nlme)
fm2 <- lme(distance ~ age + Sex, data = Orthodont, random = ~ 1 | Subject,
method="ML")
dredge(fm2)</pre>
```

AICc 3

AICc

Second-order Akaike Information Criterion

#### **Description**

Calculates second-order Akaike information criterion for one or several fitted model objects (AIC for small samples).

### Usage

```
AICc (object, ..., k = 2)
```

### Arguments

object a fitted model object
... optionally more fitted model objects
k the "penalty" per parameter to be used; the default k = 2 is the classical AIC

#### Value

If just one object is provided, returns a numeric value with the corresponding AICc; if more than one object are provided, returns a data.frame with rows corresponding to the objects and columns representing the number of parameters in the model (df), AICc and the AIC.

#### Author(s)

Kamil Bartoń

### References

Burnham, K. P. and Anderson, D. R (2002) *Model selection and multimodel inference: a practical information-theoretic approach.* 2nd ed.

### See Also

Akaike's An Information Criterion: AIC

Cement

Cement hardening data

### **Description**

Cement hardening data from Woods et al (1939).

### Usage

```
data(Cement)
```

4 dredge

#### **Format**

Cement is a data frame with 5 variables. x1-x4 are four predictor variables expressed as a percentage of weight.

- X1 calcium aluminate
- X2 tricalcium silicate
- X3 tetracalcium alumino ferrite
- X4 dicalcium silicate
- y calories of heat evolved per gram of cement after 180 days of hardening

### Author(s)

Kamil Bartoń

#### **Source**

Woods H., Steinour H.H., Starke H.R. (1932) Effect of composition of Portland cement on heat evolved during hardening. *Industrial & Engineering Chemistry* 24, 1207-1214

#### References

Burnham, K. P. and Anderson, D. R (2002) *Model selection and multimodel inference: a practical information-theoretic approach*. 2nd ed.

dredge

Evaluate "all possible" models

#### **Description**

Runs models with all possible combinations of the explanatory variables in the supplied model.

### Usage

```
dredge(global.model, beta = FALSE, eval = TRUE, rank = "AICC",
    fixed = NULL, m.max = NA, subset, marg.ex = NULL, trace = FALSE, ...)
## S3 method for class 'model.selection':
print(x, abbrev.names = TRUE, ...)
```

### Arguments

| global.model | a fitted 'global' model object. Currently, it can be a lm, glm, rlm, gam, gls, lme, lmer, sarlm or spautolm, but also other types are likely to work (untested). |
|--------------|--|
| beta         | logical should standardized coefficients be returned rather than normal ones?  |
| eval         | whether to evaluate and rank the models. If FALSE, a list of all possible model formulas is returned   |
| rank         | optional custom rank function (information criterion) to be used instead AICc, e.g. QAIC or BIC, See 'Details'   |

dredge 5

| fixed        | optional, either a single sided formula or a character vector giving names of terms to be included in all models  |
|--------------|---|
| m.max        | optional, maximum number of terms to be included in single model, defaults to the number of terms in ${\tt global.model}$   |
| subset       | logical expression to put additional constraints for the set of models. Can contain any of the global.model terms. Run getAllTerms (global.model) to list all the terms. Complex expressions (e.g smooth functions in gam models) should be treated as non-syntactic names and enclosed in backticks (see Quotes). Mind the spacing, names must match exactly the term names in model's formula. To simply keep variables in all models, use of fixed is preferred. |
| marg.ex      | a character vector specyfying names of variables for which NOT to check for marginality restrictions when generating model formulas. If this argument is set to TRUE, all model formulas are used (i.e. no checking). See 'Details'.  |
| trace        | if TRUE, all calls to the fitting function (i.e. updated ${\tt global.model}$ calls) are printed.   |
| x            | a model.selection object, returned by dredge.   |
| abbrev.names | Should variable names be abbreviated when printing? (useful with many variables)  |
| •••          | optional arguments for the rank function. Any can be an expression (of mode call), in which case any $x$ within it will be substituted with a current model.  |

#### **Details**

Models are run one by one by calling update with modified formula argument. This method, while robust in that it can be applied to a variety of different models, is not very efficient, so may be time (and memory) consuming.

Handling interactions, dredge respects marginality constraints, so "all possible combinations" do not include models containing interactions without their respective main effects. This behaviour can be altered by marg.ex argument. It can be used to allow for simple nested designs. For example, with global model of form a / (x + z), use marg.ex = "a" and fixed = "a".

rank is found by a call to match. fun and typically is specified as a function or a symbol (e.g. a backquoted name) or a character string specifying a function to be searched for from the environment of the call to lapply.

Function rank must be able to accept model as a first argument and must always return a scalar.

#### Value

dredge returns an object of class model.selection, being a data.frame with models' coefficients, k, deviance/RSS, R-squared, AIC, AICc, delta and weight. This depends on a type of model. Models are ordered according to AICc (lowest on top), or by rank function if specified. The attribute "formulas" is a list containing model formulas.

#### Note

Make sure there is no a na.action set to na.omit in global.model. This can result with models fitted to different data sets, if there are NA's present.

#### Author(s)

Kamil Bartoń

6 get.models

#### See Also

```
get.models, model.avg. QAIC has examples of using custom rank function. There is also subset.model.selection method.
```

### **Examples**

```
# Example from Burnham and Anderson (2002), page 100:
data(Cement)
lm1 <- lm(y \sim ., data = Cement)
dd <- dredge(lm1)</pre>
subset(dd, delta < 4)</pre>
#models with delta.aicc < 4
model.avg(get.models(dd, subset = delta < 4)) # get averaged coefficients
#or as a 95% confidence set:
top.models <- get.models(dd, cumsum(weight) <= .95)</pre>
model.avg(top.models) # get averaged coefficients
#topmost model:
top.models[[1]]
## Not run:
# Examples of using 'subset':
# exclude models with with both X1 and X2
dredge(lm1, subset = !X1 | !X2)
# keep only models with X3
dredge(lm1, subset = X3)
# the same, but more effective:
dredge(lm1, fixed = ~ X3)
## End(Not run)
```

get.models

Get models

#### **Description**

Gets list of models from a model.selection object

### Usage

```
get.models(dd, subset = delta <= 4, ...)</pre>
```

### Arguments

```
dd      object returned by dredge
subset      subset of models
...      additional parameters passed to update, for example, in lme/lmer one may
      want to use method = "REML" while using "ML" for model selection
```

miscellaneous 7

#### Value

list of models.

#### Author(s)

Kamil Bartoń

### See Also

```
dredge, model.avg
```

#### **Examples**

```
# Mixed models:
require(nlme)
fm2 <- lme(distance ~ age + Sex, data = Orthodont,
random = ~ 1 | Subject, method="ML")
dd2 <- dredge(fm2)
# Get top-most models, but fitted by REML:
(top.models.2 <- get.models(dd2, subset = delta < 4, method = "REML"))</pre>
```

miscellaneous

Helper functions

#### **Description**

```
beta.weights - computes standardized coefficients (beta weights) for a model;
coeffs - extracts model coefficients;
getAllTerms - extracts independent variable names from a model object;
tTable - extracts a table of coefficients, standard errors, and p-values from a model object;
Weights - calculates Akaike weights (normalized relative likelihoods)
```

#### Usage

```
beta.weights(model)
coeffs(model)
getAllTerms(x, ...)
## S3 method for class 'terms':
getAllTerms(x, offset = TRUE, ...)
tTable(model, ...)
Weights(aic, ...)
cbindDataFrameList(x)
rbindDataFrameList(x)
```

#### **Arguments**

| model  | a fitted model object  |
|--------|--|
| X      | a fitted model object or a formula. for $\star$ bindDataFrameList, a list of data.frames |
| offset | should 'offset' terms be included?   |
|        | other arguments, not used  |
| aic    | a vector of AIC (or other information criterion) values                                  |

#### **Details**

The functions coeffs, getAllTerms and tTable provide an interface between the model and model.avg (as well as dredge). Custom methods can be written to provide support for additional classes of models. Also, a logLik method must exist for object.

#### Note

coeffs's value is in most cases identical to that returned by coef, the only difference is that it returns fixed effects' coefficients for mixed models.

Functions \*bindDataFrameList are not exported from the name space, use MuMIn:::cbindDataFrameList to access them.

### Author(s)

Kamil Bartoń

### See Also

dredge

model.avg Model averaging

### Description

Model averaging based on an information criterion.

### Usage

```
model.avg(m1, ..., beta = FALSE, method = c("0", "NA"), rank = NULL,
rank.args = NULL, alpha = 0.05)

## S3 method for class 'averaging':
coef(object, ...)

## S3 method for class 'averaging':
predict(object, newdata, se.fit = NULL, interval = NULL,
type=NULL, ...)
```

#### **Arguments**

m1 A fitted model object or a list of such objects. See 'Details'

beta Logical, should standardized coefficients be returned rather than normal ones?

method If set to "0" (default), terms missing in one model are assumed to be 0's, other-

wise they are omitted from the weighted average. See 'Details'.

rank Custom rank function (information criterion) to use instead of AICc, e.g. QAIC

or BIC, may be omitted if m1 is a list returned by dredge. See 'Details'.

rank.args Optional list of arguments for the rank function. If one is an expression, an

x within it is substituted with a current model.

alpha Significance level for calculating confidence intervals.

object An object returned by model.avg.

newdata An optional data frame in which to look for variables with which to predict. If

omitted, the fitted values are used.

se.fit, interval

Currently not used.

type Ignored. Only predictions on the link scale are allowed. Warning is given if user

tries something else here.

... for model.avg - more fitted model objects, for predict - arguments to be

passed to respective predict method

#### **Details**

model.avg has been tested to work with lm, glm; rlm (MASS); gam (mgcv); lme, gls (nlme), lmer (lme4), as well as with sarlm and spautolm (spdep). Other types are also likely to work, in particular when they inherit from the supported classes. See 'Details' section of the Miscellaneous page to see how to provide support for other types of models.

rank is found by a call to match. fun and typically is specified as a function or a symbol (e.g. a backquoted name) or a character string specifying a function to be searched for from the environment of the call to lapply.

Function rank must be able to accept model as a first argument and must always return a scalar.

predict.averaging supports method="NA" only for linear, fixed effect models. In other cases (e.g. nonlinear or mixed models), prediction is obtained using "brute force", i.e. by calling predict on each component model and weighted averaging the results, which is equivalent to assuming that missing coefficients equal zero (method="0").

Apart from predict and coef, other default methods, such as formula and residuals may be used.

#### Value

An object of class averaging, being a list with elements:

summary Model table with deviance, AICc, Delta and weight.

coefficients the model coefficients variance variance of coefficients

avg.model averaged model summary (data.frame with columns: coef - averaged co-

efficients, var - unconditional variance estimator, ase - adjusted standard error

estimator, lci, uci - unconditional confidence intervals)

```
relative.importance
relative variable importances

variable.codes
Variable names with numerical codes used in the summary

relative.importance
Relative importance of variables

weights

beta (logical) were standardized coefficients used?

model the model matrix, analogical to one that would be used in a single model.

residuals the residuals (response minus fitted values).
```

#### Note

predict.averaging relies on availability of the predict methods for the component model classes (except for (g) lm).

#### Author(s)

Kamil Bartoń

#### References

Burnham, K. P. and Anderson, D. R (2002) *Model selection and multimodel inference: a practical information-theoretic approach*. 2nd ed.

#### See Also

dredge, get.models. QAIC has examples of using custom rank function.

### **Examples**

```
require(graphics)
# Example from Burnham and Anderson (2002), page 100:
data(Cement)
lm1 <- lm(y \sim ., data = Cement)
dd <- dredge(lm1)</pre>
dd
#models with delta.aicc < 4
model.avg(get.models(dd, subset = delta < 4)) # get averaged coefficients</pre>
#or as a 95% confidence set:
top.models <- get.models(dd, cumsum(weight) <= .95)</pre>
model.avg(top.models) # get averaged coefficients
#topmost model:
top.models[[1]]
## Not run:
# using BIC (Schwarz's Bayesian criterion) to rank the models
BIC <- function(x) AIC(x, k=log(length(residuals(x))))
```

```
mav <- model.avg(top.models, rank=BIC)</pre>
## End(Not run)
# Predicted values
nseq <- function(x, len=length(x)) seq(min(x, na.rm=TRUE), max(x, na.rm=TRUE),</pre>
length=len)
# New predictors: X1 along the range of original data, other variables held
# constant at their means
newdata <- as.data.frame(lapply(lapply(Cement[1:5], mean), rep, 25))</pre>
newdata$X1 <- nseq(Cement$X1, nrow(newdata))</pre>
# Predictions from each of the models in a set:
pred <- sapply(top.models, predict, newdata=newdata)</pre>
# Add predictions from the models averaged using two methods:
pred <- cbind(pred,</pre>
averaged.0=predict(model.avg(top.models, method="0"), newdata),
averaged.NA=predict(model.avg(top.models, method="NA"), newdata)
matplot(x=newdata$X1, y=pred, type="l", lwd=c(rep(1,ncol(pred)-2), 2, 2),
xlab="X1", ylab="y")
legend("topleft",
legend=c(lapply(top.models, formula),
paste("Averaged model (method=", c("0", "NA"), ")", sep="")),
col=1:6, lty=1:5, lwd=c(rep(1, ncol(pred)-2), 2, 2), cex = .75
## Not run:
# Example with gam models (based on "example(gam)")
dat <- gamSim(1, n = 500, dist="poisson", scale=0.1)</pre>
gam1 < -gam(y \sim s(x0) + s(x1) + s(x2) + s(x3) + (x1+x2+x3)^2,
family = poisson, data = dat, method = "REML")
cat(dQuote(getAllTerms(gam1)), "\n")
# include only models with smooth OR linear term (but not both) for each variable:
 \texttt{dd} \leftarrow \texttt{dredge}(\texttt{gam1}, \ \texttt{subset=(!`s(x1)` | !x1) \& (!`s(x2)` | !x2) \& (!`s(x3)` | !x3)) } 
# ...this may take a while.
subset(dd, cumsum(weight) < .95)</pre>
top.models <- get.models(dd, cumsum(weight) <= .95)</pre>
newdata <- as.data.frame(lapply(lapply(dat, mean), rep, 50))</pre>
newdata$x1 <- nseq(dat$x1, nrow(newdata))</pre>
pred <- cbind(</pre>
sapply(top.models, predict, newdata=newdata),
averaged=predict(model.avg(top.models), newdata)
```

12 par.avg

```
matplot(x=newdata$x1, y=pred, type="1", lwd=c(rep(1,ncol(pred)-2), 2, 2),
xlab="x1", ylab="y")
## End(Not run)
```

par.avg

Parameter averaging

### **Description**

Averages single parameter based on provided weights

### Usage

```
par.avg(x, se, npar, weight, alpha = 0.05)
```

### Arguments

x vector of parametersse vector of standard errors

npar vector giving numbers of estimated parameters

weight vector of weights

alpha significance level for calculating confidence intervals

#### Value

par.avg returns a vector with named elements:

Coefficient model coefficients

Variance unconditional variance of coefficients

Unconditional SE

Lower CI, Upper CI
relative variable importances

### Author(s)

Kamil Bartoń

### References

Burnham, K. P. and Anderson, D. R (2002) *Model selection and multimodel inference: a practical information-theoretic approach.* 2nd ed.

### See Also

```
{\tt model.avg} for averaging models.
```

QAIC 13

QAIC Quasi AIC

#### **Description**

Calculates "quasi AIC" for one or several fitted model objects. This function is provided just as an example of custom rank function for use with model.avg and dredge

#### Usage

```
QAIC(object, ..., chat)
```

### **Arguments**

```
object a fitted model object.
... optionally more fitted model objects.
chat c - hat
```

#### **Details**

rank is specified as a function or a symbol (e.g. a backquoted name) or a character string specifying a function.

Function rank must be able to accept model as a first argument and must always return a scalar.

#### Value

If just one object is provided, returns a numeric value with the corresponding QAIC; if more than one object are provided, returns a data.frame with rows corresponding to the objects.

#### Author(s)

Kamil Bartoń

#### **Examples**

```
# Based on "example(predict.glm)"
require(graphics)

budworm <- data.frame(ldose = rep(0:5, 2), numdead = c(1, 4, 9, 13, 18, 20, 0, 2, 6, 10, 12, 16), sex = factor(rep(c("M", "F"), c(6, 6))))
budworm$SF = cbind(numdead = budworm$numdead, numalive = 20 - budworm$numdead)

budworm.lg <- glm(SF ~ sex*ldose, data = budworm, family = quasibinomial)

plot(c(1,32), c(0,1), type = "n", xlab = "dose", ylab = "prob", log = "x")
text(2^budworm$ldose, budworm$numdead/20, as.character(budworm$sex))
ld <- seq(0, 5, 0.1)
lines(2^ld, predict(budworm.lg, data.frame(ldose=ld, sex=factor(rep("M", length(ld)), levels=levels(budworm$sex))),
type = "response"))</pre>
```

14 subset.model.selection

```
lines(2^ld, predict(budworm.lg, data.frame(ldose=ld,
    sex=factor(rep("F", length(ld)), levels=levels(budworm$sex))),
    type = "response"))

dd <- dredge(budworm.lg, rank = "QAIC",
    chat = summary(budworm.lg)$dispersion)
mod <- get.models(dd, seq(nrow(dd)))
budworm.avg <- model.avg(mod)
model.avg(mod[[1]], mod[[2]], rank = "QAIC", rank.args = list(chat = 1))

linkinv <- quasibinomial()$linkinv
lines(2^ld, linkinv(predict(budworm.avg, data.frame(ldose=ld,
    sex=factor(rep("M", length(ld)), levels=levels(budworm$sex))))), col=2)
lines(2^ld, linkinv(predict(budworm.avg, data.frame(ldose=ld,
    sex=factor(rep("F", length(ld)), levels=levels(budworm$sex))))), col=2)
legend("bottomright", legend=c("full", "averaged"), title="Model",
    col=1:2, lty=1)</pre>
```

subset.model.selection

Subsetting model selection table

#### **Description**

Return subsets of a model selection table returned by dredge.

### Usage

```
## S3 method for class 'model.selection':
subset(x, subset, select, recalc.weights = TRUE, ...)
## S3 method for class 'model.selection':
x[i, j, recalc.weights = TRUE, ...]
```

#### **Arguments**

```
x a model.selection object to be subsetted.
subset, select
logical expressions indicating columns and rows to keep. See subset.
i, j indices specifying elements to extract.
recalc.weights
logical value specyfying whether Akaike weights should be normalized across
```

the new set of models to sum to one.

further arguments passed to [.data.frame.

### Value

. . .

A model.selection object containing only the selected models (rows). When columns are selected (arguments select or j are provided), a plain data.frame is returned.

subset.model.selection 15

### Author(s)

Kamil Bartoń

### See Also

dredge, subset and [.data.frame for subsetting and extracting from data.frames.

## **Index**

```
*Topic datasets
                                           Miscellaneous (miscellaneous), 7
    Cement, 3
                                           miscellaneous, 7
*Topic manip
                                           model.avg, 5, 6, 8, 12
   miscellaneous, 7
                                           MuMIn (MuMIn-package), 1
    subset.model.selection, 13
                                           MuMIn-package, 1
*Topic models
                                           par.avg, 11
   AICc, 2
                                           predict.averaging (model.avg), 8
   dredge, 4
                                           print.averaging (model.avg), 8
   get.models, 6
                                           print.model.selection(dredge), 4
   miscellaneous, 7
   model.avg, 8
                                           QAIC, 5, 10, 12
   MuMIn-package, 1
                                           Quotes, 4
   par.avg, 11
   QAIC, 12
                                           rbindDataFrameList
*Topic package
                                                   (miscellaneous), 7
   MuMIn-package, 1
[.data.frame, 14
                                           step, 2
[.model.selection
                                           subset, 14
       (subset.model.selection),
                                           subset.model.selection, 5, 13
                                           tTable (miscellaneous), 7
AIC, 2, 3
AICc, 2, 5
                                           update, 5
beta.weights (miscellaneous), 7
                                           Weights (miscellaneous), 7
cbindDataFrameList
       (miscellaneous), 7
Cement, 3
coef, 7
coef.averaging (model.avg), 8
coeffs (miscellaneous), 7
data.frame, 5, 9
dredge, 4, 6, 8, 10, 12, 14
formula, 7
gam, 4
get.models, 5, 6, 10
getAllTerms (miscellaneous), 7
list, 6
Miscellaneous, 9
```