

Package ‘RatingScaleReduction’

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Title Rating Scale Reduction Procedure

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Depends pROC, ggplot2

Description Describes a new procedure of reducing items in a rating scale called Rating Scale Reduction (RSR). The new stop criterion in RSR procedure is added (stop global max). The function order is replaced by sort.list.

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RatingScaleReduction-package

Rating Scale Reduction Procedure

Description

This package describes a procedure of reducing items in a rating scale. It was published in the reference included in this description. The method was proposed by Waldemar W. Koczkodaj and published by a sizable collaboration coordinated by him.

Author(s)

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References

1. W.W. Koczkodaj, T. Kakiashvili, A. Szymanska, J. Montero-Marin, R. Araya, J. Garcia-Campayo, K. Rutkowski, D. Strzalka, How to reduce the number of rating scale items without predictability loss? *Scientometrics*, 909(2):581-593(open access), 2017
<https://link.springer.com/article/10.1007/s11192-017-2283-4>
2. T. Kakiashvili, W. W. Koczkodaj, and M. Woodbury-Smith. Improving the medical scale predictability by the pairwise comparisons method: Evidence from a clinical data study. *Computer Methods and Programs in Biomedicine*, 105(3), 2012
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3. X. Robin, N. Turck, A. Hainard, N. Tiberti, F. Lisacek, J.-C. Sanchez, and M. Muller. proc: an opensource package for r and s+ to analyze and compare roc curves. *BMC Bioinformatics*, 2011
<https://bmcbioinformatics.biomedcentral.com/articles/10.1186/1471-2105-12-77>
4. R. DeLong, D. M. DeLong, and D. L. Clarke-Pearson. Comparing the areas under two or more correlated receiver operating characteristic curves: a nonparametric approach. *Biometrics*, 1988

CheckAttr4Inclusion *Check the next attribute for possible inclusion into AUC*

Description

The attribute checked for AUC before it is added to the running total. The running total is used with the class (decision attribute) to compute AUC. The next attribute is added to the sequence of attributes having the MAX total AUC.

Usage

```
CheckAttr4Inclusion(attribute, D, plotCheck=FALSE, method=c("delong", "bootstrap",
"venkatraman", "sensitivity", "specificity"), boot.n,
alternative = c("two.sided", "less", "greater"))
```

Arguments

attribute	a matrix or data.frame containing attributes
D	the decision vector
plotCheck	If TRUE the plot with two ROC curves is created
method	the method to use as in the function roc.test{pROC}
boot.n	bootstrap replication number
alternative	the alternative hypothesis

Value

test	the result of the roc.test as in the function roc.test from the package pROC
------	--

Author(s)

Waldemar W. Koczkodaj, Feng Li, Alicja Wolny-Dominiak

References

1. R. DeLong, D. M. DeLong, and D. L. Clarke-Pearson. Comparing the areas under two or more correlated receiver operating characteristic curves: a nonparametric approach. *Biometrics*, pages 837 - 845, 1988.
2. W.W. Koczkodaj, T. Kakiashvili, A. Szymanska, J. Montero-Marin, R. Araya, J. Garcia-Campayo, K. Rutkowski, D. Strzalka, How to reduce the number of rating scale items without predictability loss? *Scientometrics*, 909(2):581-593(open access), 2017
<https://link.springer.com/article/10.1007/s11192-017-2283-4>

Examples

```
#creating the matrix of attributes and the decision vector
#must be as.numeric()
data(aSAH)
attach(aSAH)
is.numeric(aSAH)

attribute <-data.frame(as.numeric(gender),
as.numeric(age), as.numeric(wfns), as.numeric(s100b), as.numeric(ndka))
colnames(attribute) <-c("a1", "a2", "a3", "a4", "a5")
decision <-as.numeric(outcome)

#deLong test, two-side alternative hypothesis
```

```

CheckAttr4Inclusion(attribute, decision, method=c("delong"),
alternative=c("two.side"))

#bootstrap, two-side alternative hiphotesis
#CheckAttr4Inclusion(attribute, decision, method=c("bootstrap"), boot.n=500)
#

```

diffExamples

The number of different (unique) examples in a dataset

Description

Datasets often contain replications. In particular, one example may be replicated n times, where n is the total number of examples, so that there are no other examples. Such situation would deviate computations and should be early detected. Ideally, no example should be replicated but if the rate is small, we can progress to computing AUC.

Usage

```
diffExamples(attribute)
```

Arguments

attribute a matrix or data.frame containing attributes

Value

total.examples a number of examples in a data
diff.examples a number of different examples in a data
dup.exapmles a number of duplicate examples in a data

Author(s)

Waldemar W. Koczkodaj, Feng Li, Alicja Wolny-Dominiak

Examples

```

#creating the matrix of attributes and the decision vector
#must be as.numeric()
data(aSAH)
attach(aSAH)
is.numeric(aSAH)

attribute <-data.frame(as.numeric(gender),
as.numeric(age), as.numeric(wfns), as.numeric(s100b), as.numeric(ndka))
colnames(attribute) <-c("a1", "a2", "a3", "a4", "a5")

#show the number of different examples
diffExamples(attribute)

```

grayExamples

Examples belonging to both classes

Description

A subset of data with examples having identical values on all attributes (excluding the class attribute also called the decision attribute which is different and has two permitted values: positive and negative)

Usage

```
grayExamples(attribute, D)
```

Arguments

attribute	a matrix or data.frame containing attributes
D	the decision vector

Value

1 a list of pairs of identical examples on all attributes

Author(s)

Waldemar W. Koczkodaj, Alicja Wolny-Dominiak

Examples

```
#generate data

a=c(); attribute=c()
for (i in 1:3){
  a <-sample(c(1,2,3), 100, replace=TRUE)
  attribute <-cbind(attribute, a)
  attribute=data.frame(attribute)
}
colnames(attribute)=c("a1", "a2", "a3")
names(attribute)

decision=sample(c(0,1), 100, replace=TRUE)

#check examples
grayExamples(attribute, decision)
```

Description

This package implements a rather sophisticated method published in (Koczkodaj et al., 2017) In essence, it is a stepwise method for maximizing the area under the curve (AUC) of receiver operating characteristic (ROC). In this description, data mining terminology will be used:

- examples (observations in statistics),
- variables in statistics,
- class or decision attribute (decision variable may be used statistics).

The implemented algorithm (when reduced to its minimum) comes to using a loop for all attributes (with the class excluded) to compute AUC. Subsequently, attributes are sorted in the descending order by AUC. The attribute with the largest AUC is added to a subset of all attributes (evidently, it cannot be empty since it is supposed to be the minimum subset S of all attributes with the maximum AUC). We keep adding the next in line (according to AUC) attribute to the subset S checking AUC. If it decreases, we stop the procedure. The above procedure can be described by the following algorithm.

Algorithm:

1. compute AUC of all attributes excluding class
2. sort attributes by their AUC in the ascending order
3. select the attribute with the largest AUC to subset S
4. select the next attribute A with the largest AUC to subset S
5. if the AUC of the subset S is larger than AUC of the former AUC then go to 3

There are a lot of checking (e.g., if the dataset is not empty or full of replications) involved.

Usage

```
rsr(attribute, D, plotRSR = FALSE, method=c('Stop1Max', 'StopGlobalMax'))
```

Arguments

attribute	a matrix or data.frame containing attributes
D	the decision vector
plotRSR	If TRUE the ROC curve is plotted
method	the Stop reduction criteria: First Max of AUC or Global Max of AUC, default: 'Stop1Max'

Value

rsr.auc	total AUC of attributes
rsr.label	attribute labels
summary	a summary table

Author(s)

Waldemar W. Koczkodaj, Alicja Wolny-Dominiak

References

1. W.W. Koczkodaj, T. Kakiashvili, A. Szymanska, J. Montero-Marin, R. Araya, J. Garcia-Campayo, K. Rutkowski, D. Strzalka, How to reduce the number of rating scale items without predictability loss? *Scientometrics*, 909(2):581-593(open access), 2017
<https://link.springer.com/article/10.1007/s11192-017-2283-4>
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<https://www.sciencedirect.com/science/article/abs/pii/S0169260711002586>
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<https://bmcbioinformatics.biomedcentral.com/articles/10.1186/1471-2105-12-77>

Examples

```
#creating the matrix of attributes and the decision vector
#must be as.numeric()
data(aSAH)
attach(aSAH)
is.numeric(aSAH)

attribute <-data.frame(as.numeric(gender),
as.numeric(age), as.numeric(wfns), as.numeric(s100b), as.numeric(ndka))
colnames(attribute) <-c("a1", "a2", "a3", "a4", "a5")
decision <-as.numeric(outcome)

#rating scale reduction procedure
rsred <-rsr(attribute, decision, plotRSR=TRUE)
rsred
```

startAuc	<i>AUC of a single attribute</i>
----------	----------------------------------

Description

Compute AUC of every single attribute

Usage

```
startAuc(attribute, D)
```

Arguments

attribute	a matrix or data.frame containing attributes
D	the decision vector

Value

auc	AUC of a single attribute
item	attribute labels
summary	a summary table

Author(s)

Waldemar W. Koczkodaj, Alicja Wolny-Dominiak

References

1. W.W. Koczkodaj, T. Kakiashvili, A. Szymanska, J. Montero-Marin, R. Araya, J. Garcia-Campayo, K. Rutkowski, D. Strzalka, How to reduce the number of rating scale items without predictability loss? *Scientometrics*, 909(2):581-593(open access), 2017
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<https://bmcbioinformatics.biomedcentral.com/articles/10.1186/1471-2105-12-77>

Examples

```
#creating the matrix of attributes and the decision vector
#must be as.numeric()
data(aSAH)
attach(aSAH)
is.numeric(aSAH)

attribute <-data.frame(as.numeric(gender),
```

```

as.numeric(age), as.numeric(wfns), as.numeric(s100b), as.numeric(ndka))
colnames(attribute) <-c("a1", "a2", "a3", "a4", "a5")
decision <-as.numeric(outcome)

#compute AUC of all attributes
start <-startAuc(attribute, decision)
start$summary

```

totalAuc	<i>AUC of the running total of attributes</i>
----------	---

Description

AUC values are computed for all individual attributes. We sort them in an ascending order. We begin with the attribute having the largest AUC and add to it the second, third,... attribute until AUC of the total of them decreases.

Usage

```
totalAuc(attribute, D, plotT = FALSE)
```

Arguments

attribute	a matrix or data.frame containing attributes
D	the decision vector
plotT	If TRUE the plot is created: x - labels of attributes, y - total AUC in ascending order

Value

ordered.attribute	ordered attribute matrix
total.auc	total AUC
item	ordered attribute labels
summary	a summary table

Author(s)

Waldemar W. Koczkodaj, Alicja Wolny-Dominiak

References

1. W.W. Koczkodaj, T. Kakiashvili, A. Szymanska, J. Montero-Marin, R. Araya, J. Garcia-Campayo, K. Rutkowski, D. Strzalka, How to reduce the number of rating scale items without predictability loss? *Scientometrics*, 909(2):581-593(open access), 2017
<https://link.springer.com/article/10.1007/s11192-017-2283-4>
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<https://www.sciencedirect.com/science/article/abs/pii/S0169260711002586>
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<https://bmcbioinformatics.biomedcentral.com/articles/10.1186/1471-2105-12-77>

Examples

```
#creating the matrix of attributes and the decision vector
#must be as.numeric()
data(aSAH)
attach(aSAH)
is.numeric(aSAH)

attribute <-data.frame(as.numeric(gender),
as.numeric(age), as.numeric(wfns), as.numeric(s100b), as.numeric(ndka))
colnames(attribute) <-c("a1", "a2", "a3", "a4", "a5")
decision <-as.numeric(outcome)

#arrange start AUC in an ascending order and compute total AUC according to
#Rating Scale Reduction procedure

tot <-totalAuc(attribute, decision, plotT=TRUE)
tot$summary
```

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