Package 'ORION'

May 15, 2020

Type Package

Title Ordinal Relations

Version 1.0.1

Date 2020-05-12

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Description Functions to handle ordinal relations reflected within the feature space. Those function allow to search for ordinal relations in multi-class datasets. One can check whether proposed relations are reflected in a specific feature representation. Furthermore, it provides functions to filter, organize and further analyze those ordinal relations.

License GPL-2

LazyLoad yes

Imports e1071, TunePareto, knitr, rmarkdown, doParallel, igraph, foreach, randomForest

NeedsCompilation yes

VignetteBuilder knitr

RoxygenNote 7.1.0

Repository CRAN

Date/Publication 2020-05-15 15:10:06 UTC

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as.edgedataframe Coerce to an Edge List

Description

Converts from a Subcascades object to a weighted edge list.

Usage

as.edgedataframe(subcascades)

Arguments

subcascades A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

Details

Converts a Subcascades object to a data frame that can be used to generate a graph. The first and second column correspond to all pairwise relations of the cascades within the Subcascades object. The 'CASC_ID' column contains the same ID for all edges belonging to the same cascade. The 'SIZE' column gives the size of the cascade to which the repective column bleongs.

as.groupwise

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

as.groupwise, as.subcascades

Examples

```
library(TunePareto)
library(igraph)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                                     = 2,
                          ntimes
                          nfold
                                     = 2.
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate a dataframe
subcascades = subcascades(genMap,thresh=0.65,size=4)
edges = as.edgedataframe(subcascades)
g = graph_from_data_frame(edges[,c(1,2)], directed = TRUE)
E(g)$weight = edges[,3]
plot(g,edge.color=edges[,3],edge.arrow.size=0.5,
edge.curved =seq(-0.5, 1, length = ecount(g)))
```

as.groupwise Coe

Coerce to a Groupwise object

Description

Converts from a Subcascades object to a Groupwise object.

Usage

```
as.groupwise(subcascades = NULL, maxCl = 50)
```

Arguments

| subcascades | A Subcascades object as it is returned by subcascades-function. The Subcas- cades object is made up of a list of matrices. Each matrix comprises the evalua- tion results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
|-------------|--|
| maxCl | An integer defining the lower bound for the maximal number of classes. Has only to be set if the analyzed dataset has more than 50 classes. |

Details

This function re-sorts the Subcascades object in a way that the cascades made up of the same classes are grouped.

Value

A Groupwise object, which comprises a two-leveled list. The first level collects cascades of the same size. The second level contains a list of unique class combinations, labelled as a character string with '-' separating the different classes. For each unique set of class combinations the corresponding orders and their performance are given as a matrix, where each row contains a cascade, given as a character string of type '1>2>3', and the columns the sensitivity for the class at the corresponding position. Each matrix is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing).

See Also

as.subcascades, summaryGroupwise, as.edgedataframe

Examples

as.subcascades

Description

Converts from a Groupwise object to a Subcascades object.

Usage

```
as.subcascades(groupwise = NULL)
```

Arguments

```
groupwise A Groupwise object, which comprises a two-leveled list. The first level collects cascades of the same size. The second level contains a list of unique class combinations, labelled as a character string with '-' separating the different classes. For each unique set of class combinations the corresponding orders and their performance are given as a matrix, where each row contains a cascade, given as a character string of type '1>2>3', and the columns the sensitivity for the class at the corresponding position. Each matrix is sorted row-wise according to the achieved minimal classwise sensitivites of the cascades (decreasing).
```

Details

Converts a Groupwise object to a Subcascades object.

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

as.groupwise, as.edgedataframe

Examples

```
stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate a Groupwise object
subcascades = subcascades(genMap,thresh=0.7)
groupwise = as.groupwise(subcascades)
#convert it so a Subcascades object
as.subcascades(groupwise)
```

confusion.table Calculation of a Confusion Table

Description

Confusion table and class assignment of one cascade.

Usage

```
confusion.table(
   predictionMap = NULL,
   cascade = NULL,
   other.classes = NULL,
   sort = TRUE
)
```

Arguments

| predictionMap | A PredictionMap object as it is returned by gen.predictionMap-function. It is made up of two elements(pred and meta). The rownames of the pred-matrix |
|---------------|---|
| | (e.g. [0vs1]) show the classes of the binary base classifier. The elements are the prediction result of a specific training. The rows that correspond to base classifiers that would separate the same class consists of -1. Those rows are |
| | not used within the analysis. The meta information connects the values in the pred-matrix to a specific fold, run and contains the original label. |
| cascade | A numeric vector of classes or a character string of type '1>2>3' of at least two class labels reflected in 'predictionMap'. |
| other.classes | This parameter can be either NULL, 'all' or a numeric vector of classes that are not part of the cascade parameter. If other classes is: |
| | • NULL, only the cascade classes are evaluated. |
| | • 'all', all remaining classes are evaluated. |
| | • a vector of classes, those classes are evaluated. |
| sort | If TRUE (default) the classes that are not part of cascade are sorted based on their confusion. |

dropSets

Value

A confusion matrix of sensitivities, with the label of the predicted classes in the rows and the labels of the original class in the columns.

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                                     = 2,
                          ntimes
                          nfold
                                      = 2,
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# Calculation of the confusion matrix for '0>2>3>4'.
confusion.table(genMap, cascade = '0>2>3>4')
# Calculation of the confusion matrix for '0>2>3>4'
# and the assignment of all samples of the other classes.
confusion.table(genMap, cascade = '0>2>3>4',
                other.classes='all', sort = TRUE)
```

dropSets

Filter out Subcascades

Description

dropSets filters out specific cascade sets.

Usage

```
dropSets(
  subcascades = NULL,
  sets = NULL,
  direction = "sub",
 ordered = FALSE,
  neighborhood = "direct",
  type = "any"
)
```

Arguments

subcascades

A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to

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| | the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
|--------------|--|
| sets | Contains the set used for filtering. It is either a list of numberic vectors, a numeric vector, or a vector of characters representing a cascade of the following format '1>2>4'. |
| direction | Either 'sub', 'super' or 'exact', indicating whether the subset, the superset or the exact set is filtered. The 'exact' case filters exactly the cascades defined in sets. Please refer to the details section for a detailed description. |
| ordered | Either TRUE or FALSE indicating whether the order of the classes in sets is considered or not. |
| neighborhood | Either 'direct' or 'indirect' defines whether the given classes have to be direct neighbors ('direct') or there are other classes allowed inbetween ('indirect'). |
| type | If more than one cascade is defined in sets, this parameter defines whether the filtered cascade has to fit to at least one of the sets ('any') or to all of the given sets ('all'). |
| | |

... ...

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Details

This function allows for filtering the Subcascades object.

If direction is set to 'exact' the parameter neighborhood is ignored and the parameter type is used as its default and cannot be changed. There has to be an exact match between the classes of the sets parameter cascades and the cascade of the Subcascades object, so not more but also not less classes are allowed. If the ordered parameter is set to TRUE also the order of the classes within the sets parameter and within the Subcascades object has be be exactly the same.

If direction is set to 'sub' the Subcascades object is filtered for subsets of the given cascades. If the type parameter is set to 'any' each cascade is considered individually otherwise all cascades are used as reference for filtering. This means that either for each cascade of the sets parameter individually or for taking all together the Subcascades object is filtered for cascades that are made up of the same classes, a subset of classes (ordered = FALSE) or a cascade, part of a cascade (ordered = TRUE), resulting in a set of cascades that might contain less classes. Depending on the parameter neighborhood each class has to have the same direct neighbors as in the sets parameter defined ('direct'). If neighborhood is set to 'indirect' the filtering is less strict and the direct neighborhood defined in sets is not considered.

If direction is set to 'super' the Subcascades object is filtered for a superset of the given cascades. If the type parameter is set to 'any' each cascade is considered individually otherwise all cascades are used as reference for filtering. A superset are cascades that are made up of (parts) of the given cascades (ordered = TRUE) or classes (ordered=FALSE) but can contain also more classes. Depending on the parameter neighborhood each class has to have the same direct neighbors as in the sets parameter defined ('direct'). If neighborhood is set to 'indirect' the filtering is less strict and the direct neighborhood defined in sets is not considered.

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of

dropSets

a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

dropSize, keepSize, keepSets, dropThreshold, keepThreshold

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                         ntimes = 2.
                          nfold
                                     = 2,
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate Subcascades object
subcascades = subcascades(genMap,thresh=0.7)
#define sets
set1 = list(c(1,2,3),c(2,3,4))
set2 = c('1>2>3','2>3>4')
# filter for the subset cascades that contain either the classes
# {1,2,3} or {2,3,4} independent of the order, but neighbored
dropSets(subcascades, sets = set1, direction = 'sub',
         ordered = FALSE, neighborhood = 'direct')
dropSets(subcascades, sets = set2, direction = 'sub',
         ordered = FALSE, neighborhood = 'direct')
# filter for the superset cascades that contain either the classes
# {1,2,3} or {2,3,4} independent of the order, but neighbored
dropSets(subcascades, sets = set1, direction = 'super',
         ordered = FALSE, neighborhood = 'direct')
dropSets(subcascades, sets = set2, direction = 'super',
         ordered = FALSE, neighborhood = 'direct')
# filter for the superset cascades that contain both the classes
# {1,2,3} and {2,3,4} in exactly the given order, but allowing
# for other classes inbetween
dropSets(subcascades, sets = set1, direction = 'super',
        ordered = TRUE, neighborhood = 'indirect', type = 'all')
dropSets(subcascades, sets = set2, direction = 'super',
        ordered = TRUE, neighborhood = 'indirect', type = 'all')
# filter for the exact cascades
# sets can be a numeric list
```

dropSize

Filters for size

Description

Filters out the Subcascades object for the given sizes.

Usage

```
dropSize(subcascades = NULL, size = NA)
```

Arguments

| subcascades | A Subcascades object as it is returned by subcascades-function. The Subcas- cades object is made up of a list of matrices. Each matrix comprises the evalua- tion results of cascades of a specific length and is sorted row-wise according to |
|-------------|--|
| | the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
| size | A numeric value that defines the size of the cascades that should be returned. The smallest size is 2 and the largest the maximal number of classes of the current dataset. |

Value

A Subcascades object as in subcascades, that does not include cascades of the specific lengths that hve been filtered.

See Also

keepSize, dropSets, keepSets, dropThreshold, keepThreshold

Examples

dropThreshold

```
leaveOneOut = FALSE,
    stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate Subcascades object
subcascades = subcascades(genMap,thresh=0.7)
# filters out cascades that have a length of 3
dropSize(subcascades,size=3)
# filters out cascades that have a length of 3 or 4
dropSize(subcascades, size=c(3,4))
```

dropThreshold Exclude Cascades Based on Threshold

Description

Filters out all cascades that match the comparison with a minimal classwise sensitivity threshold.

Usage

dropThreshold(subcascades = NULL, comparison = ">=", thresh = 0)

Arguments

| subcascades | A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
|-------------|---|
| comparison | Defines the comparison type (<,>,<=,>=) for the threshold. |
| thresh | A numeric value between 0 and 1. The minimal sensitivity threshold used to filter the returned cascades. Only cascades that pass this threshold are returned. If 0 is used the returned cascades are filtered for >0 and otherwise >= thresh. For low thresholds the calculation lasts longer. |

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

dropSize, keepSize, dropSets, keepSets, keepThreshold

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                          ntimes
                                      = 2.
                          nfold
                                      = 2,
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate Subcascades object
subcascades = subcascades(genMap,thresh=0.5)
# filters for cascades that
# 1. have a minimal classwise sensitivity >= 0.6
dropThreshold(subcascades,thresh=0.6)
# 2. have a minimal classwise sensitivity <= 0.6</pre>
dropThreshold(subcascades, comparison = '<=', thresh=0.6)</pre>
```

esl

ESL Dataset

Description

The original ESL data set contains 488 profiles of applicants for certain industrial jobs. Expert psychologists of a recruiting company, based upon psychometric test results and interviews with the candidates, determined the values of the input attributes. The output is the an overall score corresponding to the degree of fitness of the candidate to this type of job. Here classes 1-3 are merged to one group and all classes >6 are merged to one group. Furtheremore, the data is relabeled to start at 0 and only 20 samples per class are included.

Usage

data(esl)

Format

An object of class list of length 2.

Source

Weka dataset (datasets-arie_ben_david.tar.gz, 11,348 Bytes)

esl_org

References

ordinal, real-world datasets donated by Dr. Arie Ben David (Holon Inst. of Technology/Israel) Donor: Arie Ben David MIS, Dept. of Technology Management Holon Academic Inst. of Technology 52 Golomb St. Holon 58102 Israel abendav@hait.ac.il Owner: Yoav Ganzah Business Administration School Tel Aviv Univerity Ramat Aviv 69978 Israel

Examples

data(esl)

esl_org

ESL Dataset

Description

The ESL data set contains 488 profiles of applicants for certain industrial jobs. Expert psychologists of a recruiting company, based upon psychometric test results and interviews with the candidates, determined the values of the input attributes. The output is the an overall score corresponding to the degree of fitness of the candidate to this type of job.

Usage

data(esl_org)

Format

An object of class data. frame with 488 rows and 5 columns.

Source

Weka dataset (datasets-arie_ben_david.tar.gz, 11,348 Bytes)

References

ordinal, real-world datasets donated by Dr. Arie Ben David (Holon Inst. of Technology/Israel) Donor: Arie Ben David MIS, Dept. of Technology Management Holon Academic Inst. of Technology 52 Golomb St. Holon 58102 Israel abendav@hait.ac.il Owner: Yoav Ganzah Business Administration School Tel Aviv Univerity Ramat Aviv 69978 Israel

Examples

data(esl_org)

gen.conf

Description

Sensitivities of all pairwise binary classifiers for all classes.

Usage

```
gen.conf(predictionMap = NULL)
```

Arguments

predictionMap A PredictionMap object as it is returned by gen.predictionMap-function. It is made up of two elements(pred and meta). The rownames of the pred-matrix (e.g. [0vs1]) show the classes of the binary base classifier. The elements are the prediction result of a specific training. The rows that correspond to base classifiers that would separate the same class consists of -1. Those rows are not used within the analysis. The meta information connects the values in the pred-matrix to a specific fold, run and contains the original label.

Details

The Conf object contains all class sensitivities for each binary trained classifiers. The \$fC-part is a column-vector and contains the sensitivities for the first class of each pairwise classifier. The rows stand for the pairwise classifiers, whereby 0vs1 means that this classifier was trained for class 0 against class 1, with class 0 being the first class. The number '-1' is used as placeholder. The \$sC-part is a matrix and contains the preformance measures for all second classes, which are meant here as all classes except the first class. The rows correspond to the binary classifiers and the columns to the classes. Furthermore the foldlist (\$foldList) used and the dataset name (\$dataName) are saved as variable of the object.

Value

Object of class Conf. For a detailed description refer to details sections.

Examples

```
classifier = tunePareto.svm(), kernel='linear')
gen.conf(genMap)
```

gen.predictionMap Generation of a Prediction Map Object

Description

Makes a PredictionMap object for the given data.

Usage

```
gen.predictionMap(
  data = NULL,
  labels = NULL,
  foldList = NULL,
  parallel = FALSE,
   classifier = NULL,
   ...
)
```

Arguments

| data | The data either as matrix or dataframe with features in rows and samples in columns. |
|------------|---|
| labels | A vector of labels of data, consecutively labelled starting with 0. |
| foldList | A set of partitions for a cross-validation experiment. This list comprises as many elements as cross-validation runs. Each run is a list of as many vectors as folds. The entries are the indices of the samples that are left out in the folds. This fold list can be generated by using generateCVRuns. |
| parallel | Either TRUE or FALSE (default). If TRUE the pairwise training is performed parallelized. |
| classifier | A TunePareto classifier object. For detailed information refer to TunePareto::tuneParetoClassifier. |
| | Further parameters of the classifier object. |
| | |

Details

Using a cross-validation set up this function performs a pairwise training for all class combinations and evaluates all samples using the trained classifier. This means that for each run, fold and binary classifier the predicted class for each sample is calculated.

Value

A PredictionMap object. It is made up of two elements. The meta information which connects the values in the pred-matrix to a specific fold, run and contains the original label. The rownames of the pred-matrix show the classes of the binary base classifier. The elements are the prediction result of a specific training. The rows that correspond to base classifiers that would separate the same class consists of -1. Those rows are not used within the analysis.

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                          ntimes
                                     = 2.
                                    = 2,
                          nfold
                          leaveOneOut = FALSE,
                          stratified = TRUE)
# svm with linear kernel
genMap = gen.predictionMap(data, labels, foldList = foldList,
                           classifier = tunePareto.svm(), kernel='linear')
\# knn with k = 3
genMap = gen.predictionMap(data, labels, foldList = foldList,
                           classifier = tunePareto.knn(), k = 3)
# randomForest
genMap = gen.predictionMap(data, labels, foldList = foldList,
                           classifier = tunePareto.randomForest())
```

keepSets

Filter Subcascades

Description

keepSets filters specific cascade sets.

Usage

```
keepSets(
   subcascades = NULL,
   sets = NULL,
   direction = "sub",
   ordered = FALSE,
   neighborhood = "direct",
   type = "any"
)
```

keepSets

Arguments

| A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
|---|
| Contains the set used for filtering. It is either a list of numberic vectors, a numeric vector, or a vector of characters representing a cascade of the following format ' $1>2>4'$. |
| Either 'sub', 'super' or 'exact', indicating whether the subset, the superset or the exact set is filtered. The 'exact' case filters exactly the cascades defined in sets. Please refer to the details section for a detailed description. |
| Either TRUE or FALSE indicating whether the order of the classes in sets is considered or not. |
| Either 'direct' or 'indirect' defines whether the given classes have to be direct neighbors ('direct') or there are other classes allowed inbetween ('indirect'). |
| If more than one cascade is defined in sets, this parameter defines whether the filtered cascade has to fit to at least one of the sets ('any') or to all of the given sets ('all'). |
| |

Details

This function allows for filtering the Subcascades object.

If direction is set to 'exact' the parameter neighborhood is ignored and the parameter type is used as its default and cannot be changed. There has to be an exact match between the classes of the sets parameter cascades and the cascade of the Subcascades object, so not more but also not less classes are allowed. If the ordered parameter is set to TRUE also the order of the classes within the sets parameter and within the Subcascades object has be be exactly the same.

If direction is set to 'sub' the Subcascades object is filtered for subsets of the given cascades. If the type parameter is set to 'any' each cascade is considered individually otherwise all cascades are used as reference for filtering. This means that either for each cascade of the sets parameter individually or for taking all together the Subcascades object is filtered for cascades that are made up of the same classes, a subset of classes (ordered = FALSE) or a cascade, part of a cascade (ordered = TRUE), resulting in a set of cascades that might contain less classes. Depending on the parameter neighborhood each class has to have the same direct neighbors as in the sets parameter defined ('direct'). If neighborhood is set to 'indirect' the filtering is less strict and the direct neighborhood defined in sets is not considered.

If direction is set to 'super' the Subcascades object is filtered for a superset of the given cascades. If the type parameter is set to 'any' each cascade is considered individually otherwise all cascades are used as reference for filtering. A superset are cascades that are made up of (parts) of the given cascades (ordered = TRUE) or classes (ordered=FALSE) but can contain also more classes. Depending on the parameter neighborhood each class has to have the same direct neighbors as in the sets parameter defined ('direct'). If neighborhood is set to 'indirect' the filtering is less strict and the direct neighborhood defined in sets is not considered.

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

dropSize, keepSize, dropSets, dropThreshold, keepThreshold

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                          ntimes
                                    = 2,
                          nfold
                                     = 2,
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate Subcascades object
subcascades = subcascades(genMap,thresh=0.7)
#define sets
set1 = list(c(1,2,3),c(2,3,4))
set2 = c('1>2>3','2>3>4')
# filter for the subset cascades that contain either the classes
# {1,2,3} or {2,3,4} independent of the order, but neighbored
keepSets(subcascades, sets = set1, direction = 'sub',
         ordered = FALSE, neighborhood = 'direct')
keepSets(subcascades, sets = set2, direction = 'sub',
         ordered = FALSE, neighborhood = 'direct')
# filter for the superset cascades that contain either the classes
# {1,2,3} or {2,3,4} independent of the order, but neighbored
keepSets(subcascades, sets = set1, direction = 'super',
         ordered = FALSE, neighborhood = 'direct')
keepSets(subcascades, sets = set2, direction = 'super',
         ordered = FALSE, neighborhood = 'direct')
# filter for the superset cascades that contain both the classes
# {1,2,3} and {2,3,4} in exactly the given order, but allowing
# for other classes inbetween
keepSets(subcascades, sets = set1, direction = 'super',
        ordered = TRUE, neighborhood = 'indirect', type = 'all')
keepSets(subcascades, sets = set2, direction = 'super',
        ordered = TRUE, neighborhood = 'indirect', type = 'all')
```

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Value

keepSize

keepSize

```
Filter for Size
```

Description

Filters the Subcascades object for cascades of the given sizes.

Usage

```
keepSize(subcascades = NULL, size = NA)
```

Arguments

| subcascades | A Subcascades object as it is returned by subcascades-function. The Subcas- cades object is made up of a list of matrices. Each matrix comprises the evalua- tion results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The |
|-------------|--|
| | rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
| size | A numeric value that defines the size of the cascades that should be returned. The smallest size is 2 and the largest the maximal number of classes of the current dataset. |

Value

A Subcascades object as in subcascades, that only includes cascades of specific lengths.

See Also

dropSize, dropSets, keepSets, dropThreshold, keepThreshold

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                         ntimes
                                 = 2,
                         nfold
                                     = 2,
                         leaveOneOut = FALSE,
                         stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate Subcascades object
subcascades = subcascades(genMap,thresh=0.7)
# filters for cascades that have a length of 3
keepSize(subcascades,size=3)
# filters for cascades that have a length of 3 or 4
keepSize(subcascades, size=c(3,4))
```

keepThreshold Filters for Threshold

Description

Filters for all cascades that match the comparison with a minimal classwise sensitivity threshold.

Usage

```
keepThreshold(subcascades = NULL, thresh = 0, comparison = ">=")
```

Arguments

| subcascades | A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
|-------------|---|
| thresh | A numeric value between 0 and 1. The minimal sensitivity threshold used to filter the returned cascades. Only cascades that pass this threshold are returned. If 0 is used the returned cascades are filtered for >0 and otherwise >= thresh. For low thresholds the calculation lasts longer. |
| comparison | Defines the comparison type (<,>,<=,>=) for the threshold. |

mergeSubcascades

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

dropSize, keepSize, dropSets, keepSets, dropThreshold

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                                      = 2,
                          ntimes
                          nfold
                                      = 2,
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# generate Subcascades object
subcascades = subcascades(genMap,thresh=0.5)
# filters for cascades that
# 1. have a minimal classwise sensitivity >= 0.6
keepThreshold(subcascades,thresh=0.6)
# 2. have a minimal classwise sensitivity <= 0.6</pre>
keepThreshold(subcascades, comparison = '<=', thresh=0.6)</pre>
```

mergeSubcascades Merge Subcascades

Description

mergeSubcascades adds the cascades from subcascades2 to the subcascades1, that have not been part of subcascades1.

Usage

```
mergeSubcascades(subcascades1 = NULL, subcascades2 = NULL)
```

Arguments

| subcascades1 | A Subcascades object as it is returned by subcascades-function. The Subcas- |
|--------------|--|
| | cades object is made up of a list of matrices. Each matrix comprises the evalua- |
| | tion results of cascades of a specific length. The rownames show the class order |
| | and the entries the sensitivity for each position of the cascade. |
| subcascades2 | A Subcascades object like subcascades1 |

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                                   = 2,
                         ntimes
                                      = 2,
                          nfold
                          leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# make two Subcascades objects
subcascades1 = subcascades(genMap, size = c(3,4), thresh = 0.6)
subcascades2 = subcascades(genMap, size = c(4), thresh = 0.5)
# add the cascades of subcascades2 to subcascades1
mergeSubcascades(subcascades1, subcascades2)
```

plot.Conf

Base Classifier Performance Heatmap

Description

Plots a heatmap that shows base classifier performance.

Usage

```
## S3 method for class 'Conf'
plot(
    x = NULL,
    classNames = NULL,
```

plot.Conf

```
symmetric = FALSE,
main = "summary of base classifiers",
xlab = "second class",
ylab = "first class",
digits = 3,
ignore = 0,
first.colors = c("#f5f5f5", "#8c510a"),
second.colors = c("#f5f5f5", "#01665e"),
na.color = c("yellow"),
las = 1,
color.key = TRUE,
cex = 1,
cex.lab = 1,
...
```

Arguments

| x | A Conf object as it is returned by gen.conf-function. |
|---------------|--|
| classNames | Vector of the original class names. If not given the class number is used instead. |
| symmetric | Logical indicating whether a symmetric base classifier (TRUE) is used. |
| main | See plot. |
| xlab | A title for the x axis (see plot). |
| ylab | A title for the y axis (see plot). |
| digits | Integer indicating the number of decimal places to be used (see round). |
| ignore | A numeric value between 0 and 1. All confusion and purity values below this number are not written as string into the corresponding element. |
| first.colors | A 2-element vector of the color for the minimal and maximal class-wise sensi- tivity of the first class. The color palette is calcuated by an interpolation between the 2 given colors. |
| second.colors | A 2-element vector of the color for the minimal and maximal class-wise sen- sitivity of the second class. The color palette is calcuated by an interpolation between the 2 given colors. |
| na.color | Color, which is used for indicating the empty elements (if the given class is not part of the cascade). |
| las | See par. |
| color.key | Specifies whether a color key is drawn (TRUE) or not (FALSE). |
| cex | See par. |
| cex.lab | See par. |
| | Further arguments passed from other methods. |

Details

This function plots a heatmap of the base classifier performance.

Value

No return value, called to generate the heatmap plot.

See Also

gen.conf,plot.Subcascades,plot.ConfusionTable

Examples

plot(conf,symmetric=TRUE)

plot.ConfusionTable Extended Confusion Table Plot

Description

Plots an extended confusion table.

Usage

```
## S3 method for class 'ConfusionTable'
plot(
    x = NULL,
    classNames = NULL,
    main = "extended confusion table",
    xlab = "original class labels",
    ylab = "predictions",
    cascLab = "cascade",
    otherLab = "other classes",
    digits = 3,
    ignore = 0,
    casc.colors = c("#f5f5f5", "#8c510a"),
```

plot.ConfusionTable

```
other.colors = c("#f5f5f5", "#01665e"),
colSep = "#b2182b",
las = 1,
color.key = TRUE,
cex = 1,
cex.lab = 1,
...
```

Arguments

| x | A ConfusionTable object as it is returned by confusion.table-function. |
|--------------|--|
| classNames | Vector of the original class names. If not given the class number is used instead. |
| main | See plot. |
| xlab | A title for the x axis (see plot). |
| ylab | A title for the y axis (see plot). |
| cascLab | Character string used as header for the cascade part of the extended confusion table. |
| otherLab | Character string used as header for the other class part of the extended confusion table. |
| digits | Integer indicating the number of decimal places to be used (see round). |
| ignore | A numeric value between 0 and 1. All confusion and purity values below this number are not written as string into the corresponding element. |
| casc.colors | A 2-element vector of the color for the minimal and maximal class-wise sensi- tivity of the first class. The color palette is calcuated by an interpolation between the 2 given colors. |
| other.colors | A 2-element vector of the color for the minimal and maximal class-wise sen- sitivity of the second class. The color palette is calcuated by an interpolation between the 2 given colors. |
| colSep | Color, which is used for the vertical line separating the cascade classes and the other classes. |
| las | See par. |
| color.key | Specifies whether a color key is drawn (TRUE) or not (FALSE). |
| cex | See par. |
| cex.lab | See par. |
| | Further arguments passed from other methods. |

Value

No return value, called to generate the confusion table plot.

See Also

confusion.table,plot.Subcascades,plot.Conf

Examples

plot.Subcascades Heatmap of a Subcascades Object

Description

Plots a heatmap, that shows the performance of cascades of a Subcascades object.

Usage

```
## S3 method for class 'Subcascades'
plot(
  x = NULL,
  class.sort = "",
 row.sort = "sens",
  thresh = 0,
 main = "subcascades",
 xlab = "classes",
  ylab = "cascades",
  digits = 3,
  ignore = 0,
  casc.colors = c("#f5f5f5", "#01665e"),
  na.color = c("#f5f5f5"),
  color.key = TRUE,
  las = 1,
  cex = 1,
  cex.lab = 1,
  srt = 30,
  . . .
)
```

plot.Subcascades

Arguments

| x | A Subcascades object as it is returned by subcascades-function. |
|-------------|--|
| class.sort | The classes can be sorted either according to the first cascade in the subcacades object ("), or based on the class frequency ('max'). |
| row.sort | The cascade can be sorted either based on the maximal-minimal class-wise sen- sitivity ('sens') or according the class frequency. |
| thresh | A numeric value between 0 and 1 that is the minimal sensitivity of the Subcas- cades object used as lower bound for the color scaling. |
| main | See plot. |
| xlab | A title for the x axis (see plot). |
| ylab | A title for the y axis (see plot). |
| digits | Integer indicating the number of decimal places to be used (see round). |
| ignore | A numeric value between 0 and 1. All confusion and purity values below this number are not written as string into the corresponding element. |
| casc.colors | A 2-element vector of the color for the minimal and maximal class-wise sen- sitivity. The color palette is calcuated by an interpolation between the 2 given colors. |
| na.color | Color, which is used for indicating the empty elements (if the given class is not part of the cascade). |
| color.key | Specifies whether a color key is drawn (TRUE) or not (FALSE). |
| las | See par. |
| cex | See par. |
| cex.lab | See par. |
| srt | Angle used to rotate the strings of the x-axis and y-axis labels (see par). |
| | Further arguments passed from other methods. |

Details

This function plots a heatmap with the cascades of the Subcascades object in the rows and all classes present in any of the cascades in the columns. The colors indicate whether a given class is present in the corresponding cascade and with which sensitivity.

Value

No return value, called to generate the heatmap plot of the subcascades Object.

See Also

subcascades, plot.Conf, plot.ConfusionTable

Examples

```
plot(subcascades,thresh=0.7,row.sort='max')
```

subcascades

Subcascades Evaluation

Description

Subcascades returns all cascades found within the data or evaluates a set of specific cascades.

Usage

```
subcascades(
   predictionMap = NULL,
   sets = NULL,
   thresh = 0,
   size = NA,
   numSol = 1000
)
```

format '1>2>4'.

Arguments

| predictionMap | A PredictionMap object as it is returned by gen.predictionMap-function. It |
|---------------|--|
| | is made up of two elements(pred and meta). The rownames of the pred-matrix |
| | (e.g. [0vs1]) show the classes of the binary base classifier. The elements are |
| | the prediction result of a specific training. The rows that correspond to base |
| | classifiers that would separate the same class consists of -1. Those rows are |
| | not used within the analysis. The meta information connects the values in the |
| | pred-matrix to a specific fold, run and contains the original label. |
| sets | Contains the set used for filtering. It is either a list of numberic vectors, a numeric vector of character representing a canada of the following |
| | meric vector, or a vector of characters representing a cascade of the following |

subcascades

| thresh | A numeric value between 0 and 1. The minimal sensitivity threshold used to filter the returned cascades. Only cascades that pass this threshold are returned. If 0 is used the returned cascades are filtered for >0 and otherwise >= thresh. For low thresholds the calculation lasts longer. |
|--------|--|
| size | A numeric value that defines the size of the cascades that should be returned. The smallest size is 2 and the largest the maximal number of classes of the current dataset. If size is NA (the default setting), all cascades from 2 to the maximal number of classes are evaluated. |
| numSol | The maximum number of cascades that should pass the first sensitivity bound and are further evaluated. |

Details

This function can either be used to evaluate the performance of a specific cascade, a set of cascades or to filter out the set of cascades of a specific size and passing a given threshold. If the sets-variable is given no size can be set.

Value

A Subcascades object comprising the evaluated cascades and their performances. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

See Also

plot.Subcascades, summarySubcascades

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
foldList = generateCVRuns(labels = labels,
                         ntimes = 2,
                         nfold
                                     = 2,
                         leaveOneOut = FALSE,
                          stratified = TRUE)
genMap = gen.predictionMap(data, labels, foldList = foldList,
classifier = tunePareto.svm(), kernel='linear')
# use default parameter settings
# -> returns cascades of all lengths that show a minimal classwise sensitivity >0.
subcascades = subcascades(genMap)
# change the threshold
# -> returns cascades of all lengths that show a minimal classwise sensitivity >=0.6.
subcascades = subcascades(genMap, thresh=0.6)
# search only for cascades of length 2 and 4
```

```
# -> returns cascades of length 2 and 4 that show a minimal classwise sensitivity >=0.6.
subcascades = subcascades(genMap, thresh=0.6, size=c(2,4))
# evaluates the performance of the cascade '0>1>2>3>4'.
subcascades = subcascades(genMap, sets = c('0>1>2>3>4'))
```

summary.Subcascades Summary Subcascades Characteristics

Description

Generates a general overview of the characteristics of the Subcascades object.

Usage

S3 method for class 'Subcascades'
summary(object = NULL, digits = 3, ...)

Arguments

| object | A Subcascades object as it is returned by subcascades-function. The Subcas- cades object is made up of a list of matrices. Each matrix comprises the evalua- tion results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
|--------|--|
| digits | Integer defining the number of decimal places as it is used in the round-function. |
| | Further arguments passed from other methods. |

Details

This function gives a general overview of characteristics of the Subcascades object, like number of cascades or maximal cascade length.

Value

An invisible Subcascades object as it is returned by subcascades-function. The function is called to print a summary of the Subcascades object to console.

See Also

subcascades, summarySubcascades, summaryGroupwise, summaryClasses

summaryClasses

Examples

summary(subcascades)

summaryClasses

Occurrence of Classes by Size

Description

summaryClasses returns the occurrence of classes by size

Usage

```
summaryClasses(subcascades = NULL)
```

Arguments

subcascades A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

Details

This function gives an overview of the classes of the Subcascades object. For each length in the Subcascades object the occurence of classes is given.

Value

A matrix summarizing the overview characteristics of the Subcascades object.

See Also

subcascades, summarySubcascades, summaryGroupwise

Examples

```
summaryClasses(subcascades)
```

summaryGroupwise Overview Class Groups

Description

summaryGroupwise returns a summarizing overview. For each length the number of permutations consisting of the same set of classes is given.

Usage

```
summaryGroupwise(subcascades = NULL, maxCl = 50)
```

Arguments

| subcascades | A Subcascades object as it is returned by subcascades-function. The Subcas- |
|-------------|---|
| | cades object is made up of a list of matrices. Each matrix comprises the evalua- |
| | tion results of cascades of a specific length and is sorted row-wise according to |
| | the achieved minimal classwise sensitivities of the cascades (decreasing). The |
| | rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade. |
| maxCl | An integer defining the lower bound for the maximal number of classes. Has only to be set if the analyzed dataset has more than 50 classes. |

Details

This function gives an overview of the subgroup characteristics of the Subcascades object. The number of permutations per size is given. A permutation means that the corresponding cascades contain the same classes but with different order.

Value

A matrix summarizing the overview characteristics of the Groupwise object.

See Also

subcascades, summarySubcascades, summaryClasses

Examples

```
summaryGroupwise(subcascades)
```

summarySubcascades Overview Subcascades

Description

summarySubcascades returns a summarizing overview. For each length the number of cascades and the minimal class-wise sensitivity is given.

Usage

summarySubcascades(subcascades = NULL)

Arguments

subcascades A Subcascades object as it is returned by subcascades-function. The Subcascades object is made up of a list of matrices. Each matrix comprises the evaluation results of cascades of a specific length and is sorted row-wise according to the achieved minimal classwise sensitivities of the cascades (decreasing). The rownames show the class order by a character string of type '1>2>3' and the entries the sensitivity for each position of the cascade.

Details

This function gives an overview of the Subcascades object. For each length in the Subcascades object the number of cascades of that length, as well as their minimal classwise sensitivity is given.

Value

A matrix summarizing the overview characteristics of the Subcascades object. For each size (rows) the number of cascades within the Subcascades object (number) and the minimal classwise sensitivity (min.class.sens) are given.

See Also

plot.Subcascades, subcascades, summaryGroupwise, summaryClasses

Examples

```
library(TunePareto)
data(esl)
data <- esl$data
labels <- esl$labels</pre>
foldList <- generateCVRuns(labels = labels,</pre>
                           ntimes
                                        = 2,
                           nfold
                                        = 2,
                           leaveOneOut = FALSE,
                           stratified = TRUE)
genMap <- gen.predictionMap(data, labels, foldList = foldList,</pre>
classifier = tunePareto.svm(), kernel='linear')
# use default parameter settings
subcascades <- subcascades(genMap,thresh=0.7)</pre>
summarySubcascades(subcascades)
```

tunePareto.occ Ordinal Classifier Cascade Tune Pareto Object

Description

TunePareto wrapper for the ordinal classifier cascade.

tunePareto.occ

Usage

tunePareto.occ(base.classifier)

Arguments

base.classifier

A predefined TuneParetoClassifier object used as binary classifier for the ordinal classifier cascade. There exist five classifier types that can be used: tune-Pareto.knn(), tunePareto.svm(), tunePareto.tree(), tunePareto.randomForest(), tune-Pareto.NaiveBayes(). For more information about these classifier functions please refer to the corresponding help page of like TunePareto::tunePareto.knn.

Details

The "tunePareto.occ" encapsulates the classifier of an ordinal classifier cascade. Additionally, to the parameters of the corresponding base classifier the "class.order" parameter can be provided.

Value

Returns an object of class TuneParetoClassifier (see: TunePareto::tuneParetoClassifier). This can be passed to the function trainTuneParetoClassifier (see: TunePareto::trainTuneParetoClassifier).

Examples

```
library(TunePareto)
data(esl)
data = esl$data
labels = esl$labels
# train classifier
model <- trainTuneParetoClassifier(</pre>
         classifier = tunePareto.occ( base.classifier = tunePareto.svm()),
         trainData = data,
         trainLabels = labels,
         class.order = as.character(c(4,3,1,0)),
         kernel
                 = "linear",
         cost
                     = 1)
# predict labels
prediction <- predict(object = model, newdata = data)</pre>
```

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