## Package ‘sboost’

**May 26, 2022**

<table>
<thead>
<tr>
<th>Type</th>
<th>Package</th>
</tr>
</thead>
<tbody>
<tr>
<td>Title</td>
<td>Machine Learning with AdaBoost on Decision Stumps</td>
</tr>
<tr>
<td>Version</td>
<td>0.1.2</td>
</tr>
<tr>
<td>Description</td>
<td>Creates classifier for binary outcomes using Adaptive Boosting (AdaBoost) algorithm on decision stumps with a fast C++ implementation. For a description of AdaBoost, see Freund and Schapire (1997) <a href="">doi:10.1006/jcss.1997.1504</a>. This type of classifier is nonlinear, but easy to interpret and visualize. Feature vectors may be a combination of continuous (numeric) and categorical (string, factor) elements. Methods for classifier assessment, predictions, and cross-validation also included.</td>
</tr>
<tr>
<td>License</td>
<td>MIT + file LICENSE</td>
</tr>
<tr>
<td>URL</td>
<td><a href="https://github.com/jadonwagstaff/sboost">https://github.com/jadonwagstaff/sboost</a></td>
</tr>
<tr>
<td>BugReports</td>
<td><a href="https://github.com/jadonwagstaff/sboost/issues">https://github.com/jadonwagstaff/sboost/issues</a></td>
</tr>
<tr>
<td>Encoding</td>
<td>UTF-8</td>
</tr>
<tr>
<td>LazyData</td>
<td>true</td>
</tr>
<tr>
<td>Depends</td>
<td>R (&gt;= 3.4.0)</td>
</tr>
<tr>
<td>LinkingTo</td>
<td>Rcpp (&gt;= 0.12.17)</td>
</tr>
<tr>
<td>Imports</td>
<td>dplyr (&gt;= 0.7.6), rlang (&gt;= 0.2.1), Rcpp (&gt;= 0.12.17), stats (&gt;= 3.4)</td>
</tr>
<tr>
<td>RoxygenNote</td>
<td>7.1.2</td>
</tr>
<tr>
<td>Suggests</td>
<td>testthat</td>
</tr>
<tr>
<td>NeedsCompilation</td>
<td>yes</td>
</tr>
<tr>
<td>Author</td>
<td>Jadon Wagstaff [aut, cre]</td>
</tr>
<tr>
<td>Maintainer</td>
<td>Jadon Wagstaff <a href="mailto:jadonw@gmail.com">jadonw@gmail.com</a></td>
</tr>
<tr>
<td>Repository</td>
<td>CRAN</td>
</tr>
<tr>
<td>Date/Publication</td>
<td>2022-05-26 13:10:02 UTC</td>
</tr>
</tbody>
</table>
### assess

**Assess**

Assesses how well an sboost classifier classifies the data.

**Usage**

```r
assess(object, features, outcomes, include_scores = FALSE)
```

**Arguments**

- `object` - `sboost_classifier` S3 object output from `sboost`.
- `features` - feature set data.frame.
- `outcomes` - outcomes corresponding to the features.
- `include_scores` - if true feature_scores are included in output.

**Value**

An `sboost_assessment` S3 object containing:

- **performance** - Last row of cumulative statistics (i.e. when all stumps are included in assessment).
- **cumulative_statistics** - `stump` - the index of the last decision stump added to the assessment.
  - `true_positive` - number of true positive predictions.
  - `false_negative` - number of false negative predictions.
  - `true_negative` - number of true negative predictions.
  - `false_positive` - number of false positive predictions.
  - `prevalence` - true positive / total.
  - `accuracy` - correct predictions / total.
  - `sensitivity` - correct predicted positive / true positive.
  - `specificity` - correct predicted negative / true negative.
  - `ppv` - correct predicted positive / predicted positive.
  - `npv` - correct predicted negative / predicted negative.
  - `f1` - harmonic mean of sensitivity and ppv.
- **feature_scores** - If include_scores is TRUE, for each feature in the classifier lists scores for each row in the feature set.
### classifier
sboost classifier object used for assessment.

### outcomes
Shows which outcome was considered as positive and which negative.

### call
Shows the parameters that were used for assessment.

#### See Also
sboost documentation.

#### Examples

```r
# malware
malware_classifier <- sboost(malware[-1], malware[1], iterations = 5, positive = 1)
assess(malware_classifier, malware[-1], malware[1])

# mushrooms
mushroom_classifier <- sboost(mushrooms[-1], mushrooms[1], iterations = 5, positive = "p")
assess(mushroom_classifier, mushrooms[-1], mushrooms[1])
```

---

### malware

<table>
<thead>
<tr>
<th>malware</th>
<th>Malware System Calls</th>
</tr>
</thead>
<tbody>
<tr>
<td></td>
<td></td>
</tr>
</tbody>
</table>

#### Description
System call data for apps identified as malware and not malware.

#### Usage
malware

#### Format
A data frame with 7597 rows and 361 variables: outcomes 1 if malware, 0 if not. X1... X360 system calls.

#### Details
Experimental data generated in this research paper:

Data used for kaggle competition: [https://www.kaggle.com/c/ml-fall2016-android-malware](https://www.kaggle.com/c/ml-fall2016-android-malware)

#### Source
[https://zenodo.org/record/154737#.WtoA1IjwaUl](https://zenodo.org/record/154737#.WtoA1IjwaUl)
**Mushroom Classification**

**Description**

A classic machine learning data set describing hypothetical samples from the Agaricus and Lepiota family.

**Usage**

mushrooms

**Format**

A data frame with 7597 rows and 361 variables:

- **outcomes**  p=poisonous, e=edible
- **cap_shape**  bell=b, conical=c, convex=x, flat=f, knobbed=k, sunken=s
- **cap_surface**  fibrous=f, grooves=g, scaly=y, smooth=s
- **cap_color**  brown=n, buff=b, cinnamon=c, gray=g, green=r, pink=p, purple=u, red=e, white=w, yellow=y
- **bruises**  bruises=t, no=f
- **odor**  almond=a, anise=l, creosote=c, fishy=y, foul=f, musty=m, none=n, pungent=p, spicy=s
- **gill_attachment**  attached=a, descending=d, free=f, notched=n
- **gill_spacing**  close=c, crowded=w, distant=d
- **gill_size**  broad=b, narrow=n
- **gill_color**  black=k, brown=n, buff=b, chocolate=h, gray=g, green=r, orange=o, pink=p, purple=u, red=e, white=w, yellow=y
- **stalk_shape**  enlarging=e, tapering=t
- **stalk_root**  bulbous=b, club=c, cup=u, equal=e, rhizomorphs=z, rooted=r, missing=?
- **stalk_surface_above_ring**  fibrous=f, scaly=y, silky=k, smooth=s
- **stalk_surface_below_ring**  fibrous=f, scaly=y, silky=k, smooth=s
- **stalk_color_above_ring**  brown=n, buff=b, cinnamon=c, gray=g, orange=o, pink=p, red=e, white=w, yellow=y
- **stalk_color_below_ring**  brown=n, buff=b, cinnamon=c, gray=g, orange=o, pink=p, red=e, white=w, yellow=y
- **veil_type**  partial=p, universal=u
- **veil_color**  brown=n, orange=o, white=w, yellow=y
- **ring_number**  none=n, one=o, two=t
- **ring_type**  cobwebby=c, evanescent=e, flaring=f, large=l, none=n, pendant=p, sheathing=s, zone=z
- **spore_print_color**  black=k, brown=n, buff=b, chocolate=h, green=r, orange=o, purple=u, white=w, yellow=y
- **population**  abundant=a, clustered=c, numerous=n, scattered=s, several=v, solitary=y
- **habitat**  grasses=g, leaves=l, meadows=m, paths=p, urban=u, waste=w, woods=d
**Details**

Data gathered from:


**Source**

https://archive.ics.uci.edu/ml/datasets/mushroom

---

**predict.sboost_classifier**

*Make predictions for a feature set based on an sboost classifier.*

**Description**

Make predictions for a feature set based on an sboost classifier.

**Usage**

```r
## S3 method for class 'sboost_classifier'
predict(object, features, scores = FALSE, ...)
```

**Arguments**

- `object`: `sboost_classifier` S3 object output from sboost.
- `features`: feature set data.frame.
- `scores`: if true, raw scores generated; if false, predictions are generated.
- `...`: further arguments passed to or from other methods.

**Value**

Predictions in the form of a vector, or scores in the form of a vector. The index of the vector aligns the predictions or scores with the rows of the features. Scores represent the sum of all votes for the positive outcome minus the sum of all votes for the negative outcome.

**See Also**

`sboost` documentation.
Examples

```r
# malware
malware_classifier <- sboost(malware[-1], malware[1], iterations = 5, positive = 1)
predict(malware_classifier, malware[-1], scores = TRUE)
predict(malware_classifier, malware[-1])

# mushrooms
mushroom_classifier <- sboost(mushrooms[-1], mushrooms[1], iterations = 5, positive = "p")
predict(mushroom_classifier, mushrooms[-1], scores = TRUE)
predict(mushroom_classifier, mushrooms[-1])
```

sboost

**sboost Learning Algorithm**

**Description**

A machine learning algorithm using AdaBoost on decision stumps.

**Usage**

`sboost(features, outcomes, iterations = 1, positive = NULL, verbose = FALSE)`

**Arguments**

- `features`: feature set data.frame.
- `outcomes`: outcomes corresponding to the features.
- `iterations`: number of boosts.
- `positive`: the positive outcome to test for; if NULL, the first outcome in alphabetical (or numerical) order will be chosen.
- `verbose`: If true, progress bar will be displayed in console.

**Details**

Factors and characters are treated as categorical features. Missing values are supported.


For original paper describing AdaBoost see:

Value

An `sboost_classifier` S3 object containing:

- **classifier**: stump - the index of the decision stump
- **feature**: name of the column that this stump splits on.
- **vote**: the weight that this stump has on the final classifier.
- **orientation**: shows how outcomes are split. If **feature** is numeric shows split orientation, if **feature** value is less than **split** then vote is cast in favor of left side outcome, otherwise the vote is cast for the right side outcome. If **feature** is categorical, vote is cast for the left side outcome if **feature** value is found in **left_categories**, otherwise vote is cast for right side outcome.
- **split**: if **feature** is numeric, the value where the decision stump splits the outcomes; otherwise, NA.
- **left_categories**: if **feature** is categorical, shows the **feature** values that sway the vote to the left side outcome on the **orientation** split; otherwise, NA.

- **outcomes**: Shows which outcome was considered as positive and which negative.

- **training stumps**: how many decision stumps were trained.
- **features**: how many features the training set contained.
- **instances**: how many instances or rows the training set contained.
- **positive_prevalence**: what fraction of the training instances were positive.

**call** Shows the parameters that were used to build the classifier.

See Also

- `predict.sboost_classifier` - to get predictions from the classifier.
- `assess` - to evaluate the performance of the classifier.
- `validate` - to perform cross validation for the classifier training.

Examples

```r
# malware
malware_classifier <- sboost(malware[-1], malware[1], iterations = 5, positive = 1)
malware_classifier
malware_classifier$classifier

# mushrooms
mushroom_classifier <- sboost(mushrooms[-1], mushrooms[1], iterations = 5, positive = "p")
mushroom_classifier
mushroom_classifier$classifier
```

validate  

**sboost Validation Function**

Description

A k-fold cross validation algorithm for sboost.
Usage

validate(
  features,
  outcomes,
  iterations = 1,
  k_fold = 6,
  positive = NULL,
  verbose = FALSE
)

Arguments

features feature set data.frame.
outcomes outcomes corresponding to the features.
iterations number of boosts.
k_fold number of cross-validation subsets.
positive is the positive outcome to test for; if NULL, the first in alphabetical order will be chosen.
verbose If true, progress bars will be displayed in console.

Value

An sboost_validation S3 object containing:

- **performance** Final performance statistics for all stumps.
- **training_summary_statistics** Mean and standard deviations for test statistics generated by assess cumulative statistics for each of the training sets.
- **testing_summary_statistics** Mean and standard deviations for test statistics generated by assess cumulative statistics for each of the testing sets.
- **training_statistics** sboost sboost_assessment cumulative statistics objects used to generate training_statistics.
- **testing_statistics** sboost sboost_assessment cumulative statistics objects used to generate testing_statistics.
- **classifier_list** sboost sboost_classifier objects created from training sets.
- **outcomes** Shows which outcome was considered as positive and which negative.
- **k_fold** number of testing and training sets used in the validation.
- **call** Shows the parameters that were used for validation.

See Also

sboost documentation.
Examples

# malware
validate(malware[-1], malware[1], iterations = 5, k_fold = 3, positive = 1)

# mushrooms
validate(mushrooms[-1], mushrooms[1], iterations = 5, k_fold = 3, positive = "p")
Index

* datasets
  malware, 3
  mushrooms, 4

assess, 2, 7, 8

malware, 3
mushrooms, 4

predict.sboost_classifier, 5, 7

sboost, 3, 5, 6, 8

validate, 7, 7