

# Package ‘Iscores’

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**Type** Package

**Title** Proper Scoring Rules for Missing Value Imputation

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**Description**

Implementation of a KL-based scoring rule to assess the quality of different missing value imputations in the broad sense as introduced in Michel et al. (2021) <[arXiv:2106.03742](https://arxiv.org/abs/2106.03742)>.

**License** GPL-3

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`class.balancing`      *Balancing of Classes*

### Description

Balancing of Classes

### Usage

```
class.balancing(X.proj.complete, Y.proj, drawA, Xhat, ids.with.missing, vars)
```

### Arguments

<code>X.proj.complete</code>	matrix with complete projected observations.
<code>Y.proj</code>	matrix with projected imputed observations.
<code>drawA</code>	vector of indices corresponding to current missingness pattern.
<code>Xhat</code>	matrix of full imputed observations.
<code>ids.with.missing</code>	vector of indices of observations with missing values.
<code>vars</code>	vectors of variables in projection.

### Value

a list of new X.proj.complete and Y.proj.

`combine2Forests`      *Combining projection forests*

### Description

Combining projection forests

### Usage

```
combine2Forests(mod1, mod2)
```

### Arguments

<code>mod1</code>	first forest
<code>mod2</code>	second forest

### Value

a new forest combining the first and the second forest

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combineForests	<i>Combining a list of forest</i>
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**Description**

Combining a list of forest

**Usage**

```
combineForests(list.rf)
```

**Arguments**

list.rf	a list of forests
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**Value**

a forest combination of the forests stored in list.rf

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compute_drScore	<i>compute the density ratio score</i>
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**Description**

compute the density ratio score

**Usage**

```
compute_drScore(object, Z = Z, num.trees.per.proj, num.proj)
```

**Arguments**

object	a crf object.
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Z	a matrix of candidate points.
---	-------------------------------

num.trees.per.proj	an integer, the number of trees per projection.
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num.proj	an integer specifying the number of projections.
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**Value**

a numeric value, the DR I-Score.

**densityRatioScore**      *Computation of the density ratio score*

## Description

Computation of the density ratio score

## Usage

```
densityRatioScore(
  X,
  Xhat,
  x = NULL,
  num.proj = 10,
  num.trees.per.proj = 1,
  projection.function = NULL,
  min.node.size = 1,
  normal.proj = T
)
```

## Arguments

- X                a matrix of the observed data containing missing values.
- Xhat             a matrix of imputations having same size as X.
- x                pattern of missing values.
- num.proj        an integer specifying the number of projections.
- num.trees.per.proj        an integer, the number of trees per projection.
- projection.function        a function providing the user-specific projections.
- min.node.size    the minimum number of observations in a leaf of a tree.
- normal.proj      a boolean, if TRUE, sample from the NA of the pattern and additionally from the non NA. If FALSE, sample only from the NA of the pattern.

## Value

a fitted random forest based on random projections

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**doevaluation***doevaluation: compute the imputation KL-based scoring rules*

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## Description

doevaluation: compute the imputation KL-based scoring rules

## Usage

```
doevaluation(  
  imputations,  
  methods,  
  X.NA,  
  m,  
  num.proj,  
  num.trees.per.proj,  
  min.node.size,  
  n.cores = 1,  
  projection.function = NULL  
)
```

## Arguments

- |                                  |   |
|----------------------------------|---|
| <code>imputations</code>         | a list of list of imputations matrices containing no missing values of the same size as <code>X.NA</code>   |
| <code>methods</code>             | a vector of characters indicating which methods are considered for imputations. It should have the same length as the list <code>imputations</code> . |
| <code>X.NA</code>                | a matrix containing missing values, the data to impute.   |
| <code>m</code>                   | the number of multiple imputation to consider, defaulting to the number of provided multiple imputations.   |
| <code>num.proj</code>            | an integer specifying the number of projections to consider for the score.  |
| <code>num.trees.per.proj</code>  | an integer, the number of trees per projection.   |
| <code>min.node.size</code>       | the minimum number of nodes in a tree.  |
| <code>n.cores</code>             | an integer, the number of cores to use.   |
| <code>projection.function</code> | a function providing the user-specific projections.   |

## Value

a vector made of the scores for each imputation method.

**Iscores***Iscores: compute the imputation KL-based scoring rules***Description**

`Iscores`: compute the imputation KL-based scoring rules

**Usage**

```
Iscores(
  imputations,
  methods,
  X.NA,
  m = length(imputations[[1]]),
  num.proj = 100,
  num.trees.per.proj = 5,
  min.node.size = 10,
  n.cores = 1,
  projection.function = NULL,
  rescale = TRUE
)
```

**Arguments**

<code>imputations</code>	a list of list of imputations matrices containing no missing values of the same size as <code>X.NA</code>
<code>methods</code>	a vector of characters indicating which methods are considered for imputations. It should have the same length as the list <code>imputations</code> .
<code>X.NA</code>	a matrix containing missing values, the data to impute.
<code>m</code>	the number of multiple imputation to consider, defaulting to the number of provided multiple imputations.
<code>num.proj</code>	an integer specifying the number of projections to consider for the score.
<code>num.trees.per.proj</code>	an integer, the number of trees per projection.
<code>min.node.size</code>	the minimum number of nodes in a tree.
<code>n.cores</code>	an integer, the number of cores to use.
<code>projection.function</code>	a function providing the user-specific projections.
<code>rescale</code>	a boolean, <code>TRUE</code> if the scores should be rescaled such that the max score is 0.

**Value**

a vector made of the scores for each imputation method.

## Examples

```

n <- 100
X <- cbind(rnorm(n),rnorm(n))
X.NA <- X
X.NA[,1] <- ifelse(stats::runif(n)<=0.2, NA, X[,1])

imputations <- list()

imputations[[1]] <- lapply(1:5, function(i) {
  X.loc <- X.NA
  X.loc[is.na(X.NA[,1]),1] <- mean(X.NA[,1],na.rm=TRUE)
  return(X.loc)
})

imputations[[2]] <- lapply(1:5, function(i) {
  X.loc <- X.NA
  X.loc[is.na(X.NA[,1]),1] <- sample(X.NA[!is.na(X.NA[,1])],1,
  size = sum(is.na(X.NA[,1])), replace = TRUE)
  return(X.loc)
})

methods <- c("mean","sample")

Iscores(imputations,
methods,
X.NA,
num.proj=5
)

```

sample.vars.proj      *Sampling of Projections*

## Description

Sampling of Projections

## Usage

```
sample.vars.proj(ids.x.na, X, projection.function = NULL, normal.proj = T)
```

## Arguments

ids.x.na	a vector of indices corresponding to NA in the given missingness pattern.
X	a matrix of the observed data containing missing values.
projection.function	a function providing the user-specific projections.
normal.proj	a boolean, if TRUE, sample from the NA of the pattern and additionally from the non NA. If FALSE, sample only from the NA of the pattern.

**Value**

a vector of variables corresponding to the projection.

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**truncProb***Truncation of probability*

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**Description**

Truncation of probability

**Usage**

`truncProb(p)`

**Arguments**

`p` a numeric value between 0 and 1 to be truncated

**Value**

a numeric value, the truncated probability.

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