

# Package: softclassval (via r-universe)

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**Type** Package

**Title** Soft Classification Performance Measures

**Description** An extension of sensitivity, specificity, positive and negative predictive value to continuous predicted and reference memberships in [0, 1].

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softclassval-package    *Soft classification performance measures*

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### Description

Extension of sensitivity, specificity, positive and negative predictive value to continuous predicted and reference memberships in [0, 1].

### Author(s)

C. Beleites

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checkrp                    *Input checks and reference preparation for performance calculation*

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### Description

Checks whether  $r$  and  $p$  are valid reference and predictions. If  $p$  is a multiple of  $r$ , recycles  $r$  to the size and shape of  $p$ . If  $r$  has additional length 1 dimensions (usually because dimensions were dropped from  $p$ ), it is shortend to the shape of  $p$ .

### Usage

```
checkrp(r, p)
```

### Arguments

$r$	reference
$p$	prediction

**Details**

In addition, any NAs in `p` are transferred to `r` so that these samples are excluded from counting in `nsamples`.

`checkrp` is automatically called by the performance functions, but doing so beforehand and then setting `.checked = TRUE` can save time when several performance measures are to be calculated on the same results.

**Value**

`r`, possibly recycled to length of `p` or with dimensions shortened to `p`.

**Author(s)**

Claudia Beleites

**Examples**

```
ref <- softclassval:::ref
ref

pred <- softclassval:::pred
pred

ref <- checkrp (r = ref, p = pred)
sens (r = ref, p = pred, .checked = TRUE)
```

---

confusion

*Performance calculation for soft classification*

---

**Description**

These performance measures can be used with prediction and reference being continuous class memberships in  $[0, 1]$ .

Calculate the soft confusion matrix

**Usage**

```
confusion(r = stop("missing reference"), p = stop("missing prediction"),
  groups = NULL, operator = "prd", drop = FALSE, .checked = FALSE)

confmat(r = stop("missing reference"), p = stop("missing prediction"), ...)
```

```
sens(r = stop("missing reference"), p = stop("missing prediction"),
  groups = NULL, operator = "prd", op.dev = dev(match.fun(operator)),
  op.postproc = postproc(match.fun(operator)), eps = 1e-08, drop = FALSE,
  .checked = FALSE)
```

```
spec(r = stop("missing reference"), p = stop("missing prediction"), ...)

ppv(r = stop("missing reference"), p = stop("missing prediction"), ...,
    .checked = FALSE)

npv(r = stop("missing reference"), p = stop("missing prediction"), ...,
    .checked = FALSE)
```

### Arguments

<code>r</code>	vector, matrix, or array with reference.
<code>p</code>	vector, matrix, or array with predictions
<code>groups</code>	grouping variable for the averaging by <code>rowsum</code> . If NULL, all samples (rows) are averaged.
<code>operator</code>	the <a href="#">operators</a> to be used
<code>drop</code>	should the results possibly be returned as vector instead of 1d array? (Note that levels of groups are never dropped, you need to do that e.g. by <a href="#">factor</a> .)
<code>.checked</code>	for internal use: the inputs are guaranteed to be of same size and shape. If TRUE, <code>confusion</code> omits input checking
<code>...</code>	handed to <code>sens</code>
<code>op.dev</code>	does the operator measure deviation?
<code>op.postproc</code>	if a post-processing function is needed after averaging, it can be given here. See the example.
<code>eps</code>	limit below which denominator is considered 0

### Details

The rows of `r` and `p` are considered the samples, columns will usually hold the classes, and further dimensions are preserved but ignored.

`r` must have the same number of rows and columns as `p`, all other dimensions may be filled by recycling.

`spec`, `ppv`, and `npv` use the symmetry between the performance measures as described in the article and call `sens`.

### Value

numeric of size  $(n_{groups} \times \dim(p) [-1])$  with the respective performance measure

### Author(s)

Claudia Beleites

### References

see the literature in citation ("`softclassval`")

**See Also**

Operators: [prd](#)

For the complete confusion matrix, [confmat](#)

**Examples**

```
ref <- softclassval:::ref
ref

pred <- softclassval:::pred
pred

## Single elements or diagonal of confusion matrix
confusion (r = ref, p = pred)

## complete confusion matrix
cm <- confmat (r = softclassval:::ref, p = pred) [1,,]
cm

## Sensitivity-Specificity matrix:
cm / rowSums (cm)

## Matrix with predictive values:
cm / rep (colSums (cm), each = nrow (cm))

## sensitivities
sens (r = ref, p = pred)

## specificities
spec (r = ref, p = pred)

## predictive values
ppv (r = ref, p = pred)
npv (r = ref, p = pred)
```

---

dev

*Mark operator as deviation measure*

---

**Description**

The operators measure either a performance (i.e. accordance between reference and prediction) or a deviation. `dev (op) == TRUE` marks operators measuring deviation.

**Usage**

```
dev(op)
```

```
dev (op) <- value
```

**Arguments**

op                    the operator (function)  
value                logical indicating the operator type

**Value**

logical indicating the type of operator. NULL if the attribute is missing.

**Author(s)**

Claudia Beleites

**See Also**

[sens post](#)

**Examples**

```
dev (wRMSE)
myop <- function (r, p) p * (r == 1)
dev (myop) <- TRUE
```

---

factor2matrix

*Convert hard class labels to membership matrix*

---

**Description**

Converts a factor with hard class memberships into a membership matrix

**Usage**

```
factor2matrix(f)
```

**Arguments**

f                    factor with class labels

**Value**

matrix of size length (f) x nlevels (f)

**Author(s)**

Claudia Beleites

**See Also**

[hardclasses](#) for the inverse

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hard	<i>Mark operator as hard measure</i>
------	--------------------------------------

---

### Description

The operators may work only for hard classes (see [and](#)). `hard (op) == TRUE` marks hard operators.

### Usage

```
hard(op)
```

```
hard (op) <- value
```

### Arguments

op	the operator (function)
value	logical indicating the operator type

### Value

logical indicating the type of operator. NULL if the attribute is missing.

### Author(s)

Claudia Beleites

### See Also

[sens and](#)

### Examples

```
hard (and)
myop <- function (r, p) p * (r == 1)
hard (myop) <- TRUE
```

---

hardclasses	<i>Convert to hard class labels</i>
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---

### Description

hardclasses converts the soft class labels in `x` into a factor with hard class memberships and NA for soft samples.

### Usage

```
hardclasses(x, classdim = 2L, soft.name = NA, tol = 1e-05, drop = TRUE)
```

```
harden(x, classdim = 2L, tol = 1e-06, closed = TRUE)
```

### Arguments

<code>x</code>	matrix or array holding the class memberships
<code>classdim</code>	dimension that holds the classes, default columns
<code>soft.name</code>	level for soft samples
<code>tol</code>	tolerance: samples with membership $\geq 1 - \text{tol}$ are considered to be hard samples of the respective class.
<code>drop</code>	see <a href="#">drop1d</a>
<code>closed</code>	logical indicating whether the system should be treated as closed-world (i.e. all memberships add to 1)

### Details

harden hardens the soft

### Value

factor array of shape `dim(x) [-classdim]`

### Author(s)

Claudia Beleites

### See Also

[factor2matrix](#) for the inverse



**Examples**

```

softclassval:::pred
harden (softclassval:::pred)
harden (softclassval:::pred, closed = FALSE)

## classical threshold at 0.5
harden (softclassval:::pred, tol = 0.5)

## grey zone: NA for memberships between 0.25 and 0.75
harden (softclassval:::pred, tol = 0.25)

## threshold at 0.7 = 0.5 + 0.2:
harden (softclassval:::pred - 0.2, tol = 0.5)
harden (softclassval:::pred - 0.2, tol = 0.5, closed = FALSE)

```

---

nsamples	<i>Number of samples</i>
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---

**Description**

Count number of samples

**Usage**

```
nsamples(r = r, groups = NULL, operator = "prd", hard.operator)
```

**Arguments**

r	reference class labels with samples in rows.
groups	grouping variable for the averaging by <code>rowsum</code> . If NULL, all samples (rows) are averaged.
operator	the <code>operator</code> to be used
hard.operator	optional: a logical determining whether only hard samples should be counted

**Details**

Basically, the reference is summed up. For hard operators, the reference is hardened first: soft values, i.e.  $r$  in  $(0, 1)$  are set to NA.

**Value**

number of samples in each group (rows) for each class (columns) and all further dimensions of ref.

**Author(s)**

Claudia Beleites

## Examples

```
ref <- softclassval:::ref
ref
nsamples (ref)
nsamples (ref, hard.operator = TRUE)
```

---

postproc	<i>Attach postprocessing function to operator</i>
----------	---

---

## Description

The postprocessing function is applied during performance calculation after averaging but before [dev](#) is applied. This is the place where the root is taken of root mean squared errors.

## Usage

```
postproc(op)

postproc (op) <- value
```

## Arguments

op	the operator (function)
value	function (or its name or symbol) to do the post-processing. NULL deletes the postprocessing function.

## Details

postproc (op) retrieves the postprocessing function (or NULL if none is attached)

## Value

logical indicating the type of operator. NA if the attribute is missing.

## Author(s)

Claudia Beleites

## See Also

[sens post](#)

## Examples

```
postproc (wRMSE)
myop <- function (r, p) p * (r == 1)
postproc (myop) <- `sqrt`
```

---

softclassval.unittest *Run the unit tests*

---

### Description

Run the unit tests attached to the functions via [svUnit](#)

### Usage

```
softclassval.unittest()
```

### Value

invisibly TRUE if the tests pass, NA if [svUnit](#) is not available. Stops if errors are encountered.

### Author(s)

Claudia Beleites

### See Also

[svUnit](#)

---

strong *And (conjunction) operators*

---

### Description

And operators for the soft performance calculation. The predefined operators are:

Name	Definition	<a href="#">dev?</a>	<a href="#">postproc?</a>	<a href="#">hard?</a>	Explanation
gd1	$\text{pmin}(r, p)$	FALSE		FALSE	the Gödel-operator (weak conjunction)
luk	$\text{pmax}(r + p - 1, 0)$	FALSE		FALSE	Łukasiewicz-operator (strong conjunction)
prd	$r * p$	FALSE		FALSE	product operator
and	$r * p$	FALSE		TRUE	Boolean conjunction: accepts only 0 or 1, otherwise yields 0
wMAE	$r * \text{abs}(r - p)$	TRUE		FALSE	for weighted mean absolute error
wRMAE	$r * \text{abs}(r - p)$	TRUE	sqrt	FALSE	for weighted root mean absolute error (bound for RMSE)
##' wMSE	$r * (r - p)^2$	TRUE		FALSE	for weighted mean squared error
wRMSE	$r * (r - p)^2$	TRUE	sqrt	FALSE	for root weighted mean squared error

**Usage**

`strong(r, p)`

`luk(r, p)`

`weak(r, p)`

`gd1(r, p)`

`prd(r, p)`

`and(r, p)`

`wMAE(r, p)`

`wRMAE(r, p)`

`wMSE(r, p)`

`wRMSE(r, p)`

**Arguments**

`r` reference vector, matrix, or array with numeric values in  $[0, 1]$ , for and in  $\{0, 1\}$   
`p` prediction vector, matrix, or array with numeric values in  $[0, 1]$ , for and in  $\{0, 1\}$

**Value**

numeric of the same size as `p`

**Author(s)**

Claudia Beleites

**References**

see the literature in citation ("`softclassval`")

**See Also**

Performance measures: [sens](#)

**Examples**

```
ops <- c("luk", "gd1", "prd", "and", "wMAE", "wRMAE", "wMSE", "wRMSE")  
## make a nice table
```

```

lastline <- function (f){
  body <- body (get (f))  ## function body
  body <- deparse (body)
  body [length (body) - 1] ## last line is closing brace
}

data.frame (source = sapply (ops, lastline),
            dev = sapply (ops, function (f) dev (get (f))),
            hard = sapply (ops, function (f) hard (get (f))),
            postproc = I (lapply (ops, function (f) postproc (get (f))))
)

x <- softclassval:::v
x

luk (0.7, 0.8)

## The behaviour of the operators
## op (x, 1)
cbind (x, sapply (c ("luk", "gdl", "prd", "wMAE", "wRMAE", "wMSE", "wRMSE"),
                 function (op, x) get (op) (x, 1), x))

## op (x, 0)
cbind (x, sapply (c ("luk", "gdl", "prd", "wMAE", "wRMAE", "wMSE", "wRMSE"),
                 function (op, x) get (op) (x, 0), x))

## op (x, x)
cbind (x, sapply (c ("luk", "gdl", "prd", "wMAE", "wRMAE", "wMSE", "wRMSE"),
                 function (op, x) get (op) (x, x), x))

## Note that the deviation operators are not commutative
## (due to the weighting by reference)
zapsmall (
  cbind (sapply (c ("luk", "gdl", "prd", "wMAE", "wRMAE", "wMSE", "wRMSE"),
                function (op, x) get (op) (1, x), x)) -
  cbind (sapply (c ("luk", "gdl", "prd", "wMAE", "wRMAE", "wMSE", "wRMSE"),
                function (op, x) get (op) (x, 1), x))
)

```

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