# Package 'trendeval'

April 11, 2023
<b>Title</b> Evaluate Trending Models
Version 0.1.0
Description Provides a coherent interface for evaluating models fit with the trending package. This package is part of the RECON ( <a href="https://www.repidemicsconsortium.org/">https://www.repidemicsconsortium.org/</a> ) toolkit for outbreak analysis.
<pre>URL https://github.com/reconverse/trendeval</pre>
BugReports https://github.com/reconverse/trendeval/issues
License MIT + file LICENSE
Encoding UTF-8
RoxygenNote 7.2.3
<b>Imports</b> trending (>= 0.1.0), yardstick, rsample, stats, tibble, utils
Suggests testthat (>= 3.0.0), dplyr, outbreaks
Config/testthat/edition 3
NeedsCompilation no
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Repository CRAN
<b>Date/Publication</b> 2023-04-11 20:30:02 UTC
R topics documented:
calculate_aic calculate_mae calculate_rmse calculate_rsq evaluate_aic evaluate_resampling
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calculate\_aic

Generic for calculating the AIC

# **Description**

Generic calculate\_aic() returns the Akaike's 'An Information Criterion' for the given input.

# Usage

```
calculate_aic(x, ...)

## Default S3 method:
calculate_aic(x, ...)

## S3 method for class 'trending_model'
calculate_aic(x, data, as_tibble = FALSE, ...)

## S3 method for class 'list'
calculate_aic(x, data, ...)

## S3 method for class 'trending_fit'
calculate_aic(x, as_tibble = FALSE, ...)

## S3 method for class 'trending_fit_tcalculate_aic(x, ...)
```

# **Arguments**

#### **Details**

Specific methods are given for trending\_fit and trending\_fit\_tbl objects. The default method applies stats::AIC() directly.

# Value

For a single trending\_fit input, if as\_tibble = FALSE the object returned will be a list with entries:

- metric: "AIC"
- result: the resulting AIC value fit (NULL if the calculation failed)

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- warnings: any warnings generated during calculation
- errors: any errors generated during calculation

If as\_tibble = TRUE, or the input is a trending\_fit\_tbl, then the output will be a tibble with one row for each fitted model columns corresponding to output generated with single model input.

#### Author(s)

Tim Taylor

#' @examples x = rnorm(100, mean = 0) y = rpois(n = 100, lambda = exp(1.5 + 0.5\*x)) dat <-data.frame(x = x, y = y) poisson\_model <- glm\_model( $y \sim x$ , family = "poisson") negbin\_model <- glm\_nb\_model( $y \sim x$ ) fitted\_model <- fit(poisson\_model, dat) fitted\_models <- fit(list(poisson\_model, negbin\_model), data = dat)

calculate\_aic(poisson\_model, dat) calculate\_aic(fitted\_model) calculate\_aic(fitted\_model, as\_tibble = TRUE) calculate\_aic(fitted\_models)

calculate\_mae

Generic for calculating the root mean squared error

# Description

Generic calculate\_mae() returns the root mean square error for the given input.

# Usage

```
calculate_mae(x, ...)
## Default S3 method:
calculate_mae(x, ...)

## S3 method for class 'trending_model'
calculate_mae(x, data, na.rm = TRUE, as_tibble = TRUE, ...)

## S3 method for class 'list'
calculate_mae(x, data, na.rm = TRUE, ...)

## S3 method for class 'trending_fit'
calculate_mae(x, new_data, na.rm = TRUE, as_tibble = TRUE, ...)

## S3 method for class 'trending_fit_tbl'
calculate_mae(x, new_data, na.rm = TRUE, ...)

## S3 method for class 'trending_predict'
calculate_mae(x, na.rm = TRUE, as_tibble = TRUE, ...)

## S3 method for class 'trending_predict'
calculate_mae(x, na.rm = TRUE, as_tibble = TRUE, ...)
```

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```
## S3 method for class 'trending_prediction'
calculate_mae(x, na.rm = TRUE, as_tibble = TRUE, ...)
```

# **Arguments**

X	An R object.
	Not currently used.
data	a data.frame containing data (including the response variable and all predictors) used in the specified model.
na.rm	Should NA values should be removed before calculation of metric (passed to the underlying function yardstick::mae_vec).
as_tibble	Should the result be returned as tibble (as_tibble = TRUE) or a list (as_tibble = FALSE).
new_data	a data.frame containing data (including the response variable and all predictors) on which to assess the model.

#### **Details**

Specific methods are given for trending\_model (and lists of these), trending\_fit, trending\_fit\_tbl, trending\_predict\_tbl and trending\_prediction objects. Each of these are simply wrappers around the yardstick::mae\_vec with the addition of explicit error handling.

# Value

For a single trending\_fit input, if as\_tibble = FALSE the object returned will be a list with entries:

- metric: "mae"
- result: the resulting mae value (NULL if the calculation failed)
- · warnings: any warnings generated during calculation
- errors: any errors generated during calculation

If as\_tibble = TRUE, or for the other trending classes, then the output will be a tibble with one row for each fitted model columns corresponding to output generated with single model input.

# Author(s)

Tim Taylor

```
#' @examples x = rnorm(100, mean = 0) y = rpois(n = 100, lambda = exp(1.5 + 0.5*x)) dat <-data.frame(x = x, y = y) poisson_model <- glm_model(y \sim x, family = "poisson") negbin_model <-glm_nb_model(y \sim x) fitted_model <- fit(poisson_model, dat) fitted_models <- fit(list(poisson_model, negbin_model), data = dat)
```

calculate\_mae(poisson\_model, dat) calculate\_mae(fitted\_model) calculate\_mae(fitted\_model, as\_tibble
= TRUE) calculate\_mae(fitted\_models)

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calculate\_rmse

Generic for calculating the root mean squared error

# **Description**

Generic calculate\_rmse() returns the root mean square error for the given input.

# Usage

```
calculate_rmse(x, ...)
## Default S3 method:
calculate_rmse(x, ...)
## S3 method for class 'trending_model'
calculate_rmse(x, data, na.rm = TRUE, as_tibble = TRUE, ...)
## S3 method for class 'list'
calculate_rmse(x, data, na.rm = TRUE, ...)
## S3 method for class 'trending_fit'
calculate_rmse(x, new_data, na.rm = TRUE, as_tibble = TRUE, ...)
## S3 method for class 'trending_fit_tbl'
calculate_rmse(x, new_data, na.rm = TRUE, ...)
## S3 method for class 'trending_predict'
calculate_rmse(x, na.rm = TRUE, as_tibble = TRUE, ...)
## S3 method for class 'trending_predict_tbl'
calculate_rmse(x, na.rm = TRUE, ...)
## S3 method for class 'trending_prediction'
calculate_rmse(x, na.rm = TRUE, as_tibble = TRUE, ...)
```

# Arguments

X	An R object.
^	All 11 object.
	Not currently used.
data	a data.frame containing data (including the response variable and all predictors) used in the specified model.
na.rm	Should NA values should be removed before calculation of metric (passed to the underlying function yardstick::rmse_vec).
as_tibble	Should the result be returned as tibble (as_tibble = TRUE) or a list (as_tibble = FALSE).
new_data	a data. frame containing data (including the response variable and all predictors) on which to assess the model.

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#### **Details**

Specific methods are given for trending\_model (and lists of these), trending\_fit, trending\_fit\_tbl, trending\_predict\_tbl and trending\_prediction objects. Each of these are simply wrappers around the yardstick::rmse\_vec with the addition of explicit error handling.

#### Value

For a single trending\_fit input, if as\_tibble = FALSE the object returned will be a list with entries:

- metric: "rmse"
- result: the resulting rmse value (NULL if the calculation failed)
- · warnings: any warnings generated during calculation
- errors: any errors generated during calculation

If as\_tibble = TRUE, or for the other trending classes, then the output will be a tibble with one row for each fitted model columns corresponding to output generated with single model input.

#### Author(s)

Tim Taylor

#' @examples x = rnorm(100, mean = 0) y = rpois(n = 100, lambda = exp(1.5 + 0.5\*x)) dat <-data.frame(x = x, y = y) poisson\_model <- glm\_model( $y \sim x$ , family = "poisson") negbin\_model <- glm\_nb\_model( $y \sim x$ ) fitted\_model <- fit(poisson\_model, dat) fitted\_models <- fit(list(poisson\_model, negbin\_model), data = dat)

calculate\_rmse(poisson\_model, dat) calculate\_rmse(fitted\_model) calculate\_rmse(fitted\_model, as\_tibble = TRUE) calculate\_rmse(fitted\_models)

calculate\_rsq

Generic for calculating the root mean squared error

# **Description**

Generic calculate\_rsq() returns the root mean square error for the given input.

# Usage

```
calculate_rsq(x, ...)
## Default S3 method:
calculate_rsq(x, ...)
## S3 method for class 'trending_model'
calculate_rsq(x, data, na.rm = TRUE, as_tibble = TRUE, ...)
```

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```
## S3 method for class 'list'
calculate_rsq(x, data, na.rm = TRUE, ...)

## S3 method for class 'trending_fit'
calculate_rsq(x, new_data, na.rm = TRUE, as_tibble = TRUE, ...)

## S3 method for class 'trending_fit_tbl'
calculate_rsq(x, new_data, na.rm = TRUE, ...)

## S3 method for class 'trending_predict'
calculate_rsq(x, na.rm = TRUE, as_tibble = TRUE, ...)

## S3 method for class 'trending_predict_tbl'
calculate_rsq(x, na.rm = TRUE, ...)

## S3 method for class 'trending_prediction'
calculate_rsq(x, na.rm = TRUE, as_tibble = TRUE, ...)
```

# **Arguments**

X	An R object.
	Not currently used.
data	a data.frame containing data (including the response variable and all predictors) used in the specified model.
na.rm	Should NA values should be removed before calculation of metric (passed to the underlying function yardstick::rsq_vec).
as_tibble	Should the result be returned as tibble (as_tibble = TRUE) or a list (as_tibble = FALSE).
new_data	a data.frame containing data (including the response variable and all predictors) on which to assess the model.

#### **Details**

Specific methods are given for trending\_model (and lists of these), trending\_fit, trending\_fit\_tbl, trending\_predict\_tbl and trending\_prediction objects. Each of these are simply wrappers around the yardstick::rsq\_vec with the addition of explicit error handling.

# Value

For a single trending\_fit input, if as\_tibble = FALSE the object returned will be a list with entries:

- metric: "rsq"
- result: the resulting rsq value (NULL if the calculation failed)
- · warnings: any warnings generated during calculation
- errors: any errors generated during calculation

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If as\_tibble = TRUE, or for the other trending classes, then the output will be a tibble with one row for each fitted model columns corresponding to output generated with single model input.

# Author(s)

Tim Taylor

#' @examples x = rnorm(100, mean = 0) y = rpois(n = 100, lambda = exp(1.5 + 0.5\*x)) dat <-data.frame(x = x, y = y) poisson\_model <- glm\_model( $y \sim x$ , family = "poisson") negbin\_model <-glm\_nb\_model( $y \sim x$ ) fitted\_model <- fit(poisson\_model, dat) fitted\_models <- fit(list(poisson\_model, negbin\_model), data = dat)

calculate\_rsq(poisson\_model, dat) calculate\_rsq(fitted\_model) calculate\_rsq(fitted\_model, as\_tibble
= TRUE) calculate\_rsq(fitted\_models)

evaluate\_aic

Generic for calculating the AIC

#### **Description**

evaluate\_aic() is a a generic for evaluating the Akaike's 'An Information Criterion' for a given input

# Usage

```
evaluate_aic(x, ...)
## Default S3 method:
evaluate_aic(x, ...)
## S3 method for class 'trending_model'
evaluate_aic(x, data, as_tibble = FALSE, ...)
## S3 method for class 'list'
evaluate_aic(x, data, ...)
```

#### **Arguments**

x An R object.
 ... Not currently used.
 data a data. frame containing data (including the response variable and all predictors) used in the specified model.
 as\_tibble Should the result be returned as tibble (as\_tibble = TRUE) or a list (as\_tibble = FALSE).

# **Details**

Specific methods are given for trending\_fit and lists of these models.

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#### Value

If as\_tibble = TRUE, or the input is a list of models then the output will be a tibble with one row for each fitted model columns corresponding to output generated with single model input.

#### Author(s)

```
\label{thm:continuous} \begin{tabular}{ll} Tim Taylor \\ \#' @examples $x = rnorm(100, mean = 0)$ $y = rpois(n = 100, lambda = exp(1.5 + 0.5*x))$ dat <-data.frame($x = x$, $y = y$) poisson_model <- glm_model($y \sim x$, family = "poisson") negbin_model <- glm_nb_model($y \sim x$) evaluate_aic(poisson_model, dat) evaluate_aic(list(poisson_model, negbin_model), data = dat) \\ \end{tabular}
```

evaluate\_resampling

Resampling approach for model evaluation

# Description

evaluate\_resampling() uses repeated K-fold cross-validation and the Root Mean Square Error (RMSE) of testing sets to measure the predictive power of a single model. Methods are provided for trending::trending\_model (and lists of these) objects.

# Usage

```
evaluate\_resampling(x, ...)
## Default S3 method:
evaluate_resampling(x, ...)
## S3 method for class 'trending_model'
evaluate_resampling(
  data,
 metric = c("rmse", "rsq", "mae"),
 metric_arguments = list(na.rm = TRUE),
  v = nrow(data),
  repeats = 1,
)
## S3 method for class 'list'
evaluate_resampling(
  Х,
  data,
 metric = c("rmse", "rsq", "mae"),
  metric_arguments = list(na.rm = TRUE),
  v = nrow(data),
```

evaluate\_resampling

```
repeats = 1, ...
```

# **Arguments**

x An R object.

... Not currently used.

data a data. frame containing data (including the response variable and all predic-

tors) used in the specified model.

metric One of "rmse" (see calculate\_rmse), "mae" (see calculate\_mae) and "rsq" (see

calculate\_rsq).

metric\_arguments

A named list of arguments passed to the underlying functions that calculate the

metrics.

v the number of equally sized data partitions to be used for K-fold cross-validation;

v cross-validations will be performed, each using v - 1 partition as training set, and the remaining partition as testing set. Defaults to the number of row in data, so that the method uses leave-one-out cross validation, akin to Jackknife except that the testing set (and not the training set) is used to compute the fit statistics.

repeats the number of times the random K-fold cross validation should be repeated for;

defaults to 1; larger values are likely to yield more reliable / stable results, at the

expense of computational time

#### **Details**

These functions wrap around existing functions from several packages. evaluate\_resampling.trending\_model() and evaluate\_resampling.list() both use rsample::vfold\_cv() for sampling and, for the calculating the different metrics, the yardstick package.

#### See Also

```
calculate_aic(), calculate_rmse(), calculate_mae() and calculate_rsq().
```

# **Examples**

```
x <- rnorm(100, mean = 0)
y <- rpois(n = 100, lambda = exp(x + 1))
dat <- data.frame(x = x, y = y)
model <- trending::glm_model(y ~ x, poisson)
models <- list(
   poisson_model = trending::glm_model(y ~ x, poisson),
   linear_model = trending::lm_model(y ~ x)
)
evaluate_resampling(model, dat)
evaluate_resampling(models, dat)</pre>
```

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