Package 'AutoNLS'

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```
Type Package
Title Automated Non-Linear Regression
Version 1.0.0
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Description AutoNLS is a comprehensive package for automated non-linear
     regression modeling, evaluation, and visualization. It supports dynamic
     selection of non-linear models, tools for scoring and comparing models,
     and powerful visualizations using the 'echarts4r' package. The package
     is designed for ease of use and extensibility, making it ideal for
     analysts, data scientists, and researchers.
Imports R6,
     data.table,
     dplyr,
     echarts4r,
     minpack.lm,
     mgcv
Suggests testthat,
     shiny,
     DT,
     bs4Dash,
     readxl
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```

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dummy_data

Dummy Data for AutoNLS Examples

Description

A synthetic dataset for testing and demonstrating AutoNLS functions.

Usage

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dummy_data

Format

A data.frame with 100 rows and 3 variables:

X-Value Numeric predictor variable.

GroupVar Categorical grouping variable.

Target Numeric response variable.

Source

Generated synthetically for the AutoNLS package.

EDA

EDA (Exploratory Data Analysis) Class

Description

Provides tools for automated exploratory data analysis, including summary statistics, correlation matrices, and customizable visualizations using echarts4r.

Methods

- initialize(data): Initializes the class with a data.table.
- summarize(): Computes summary statistics.
- correlate(): Computes a correlation matrix for numeric columns.
- visualize_distributions(): Creates histogram and density visualizations for numeric columns.
- visualize_scatterplots(): Creates pairwise scatterplots for numeric columns.

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Public fields

```
data A data.table containing the dataset for analysis.
summary_stats A data.table storing the summary statistics of the dataset.
correlation_matrix A correlation matrix for numeric columns.
plots A list of echarts4r plots generated during the analysis. Initialize the EDA class
```

Methods

Public methods:

- EDA\$new()
- EDA\$summarize()
- EDA\$correlate()
- EDA\$visualize_distributions()
- EDA\$visualize_scatterplots()
- EDA\$clone()

Method new():

```
Usage:
```

EDA\$new(data)

Arguments:

data A data. table containing the dataset for analysis.

Method summarize(): Calculates mean, median, sd, and the count of missing values for each column.

Usage:

EDA\$summarize()

Returns: A data.table containing the summary statistics.

Method correlate(): Calculates both Pearson and Spearman correlations between the target_col and all (or listed via input_cols) numeric columns.

```
Usage:
```

```
EDA$correlate(target_col = NULL, input_cols = NULL)
```

Arguments:

target_col the target variable in the data set

input_cols the independent variables

Returns: A data.table with the Pearson and Spearman correlation values for each numeric predictor.

Method visualize_distributions(): Generates histograms for numeric columns and optionally overlays density lines.

Usage:

```
EDA$visualize_distributions(
  input_cols = NULL,
  title_prefix = "Distribution of",
  bins = 20,
  add_density = TRUE,
  tooltip_trigger = "axis",
  theme = "westeros",
  density_opacity = 0.4
)
```

```
Arguments:
 input_cols Names of numeric variables to plot
 title_prefix Character. Prefix for the plot title.
 bins Integer. Number of bins for the histogram. Defaults to Sturges' formula.
 add_density Logical. Whether to add a density line. Defaults to TRUE.
 tooltip_trigger "axis"
 theme Character. Theme for the plot
 density_opacity numeric. default 0.4
 Returns: A list of echarts4r histogram plots.
Method visualize_scatterplots(): Generates scatterplots for all target and input pairs of
```

numeric columns and overlays fitted lines from Generalized Additive Models (GAM) for different k values.

```
Usage:
EDA$visualize_scatterplots(
  target_col = NULL,
  input_cols = NULL,
  title_prefix = "Scatterplot of",
  theme = "westeros",
  k_{values} = c(3, 5, 7)
)
Arguments:
target_col Name of target variable
input_cols Names of input variables
title_prefix Character. Prefix for the plot title.
theme Character. Theme for the plot
k_values Numeric vector. Values of k (basis dimension) for GAM fits. Defaults to c(3, 5,
```

Returns: A list of echarts4r scatter plots with GAM fitted lines.

Method clone(): The objects of this class are cloneable with this method.

```
Usage:
EDA$clone(deep = FALSE)
Arguments:
```

deep Whether to make a deep clone.

NonLinearFitter

NonLinearFitter

Description

NonLinearFitter

NonLinearFitter

Details

An R6 class for automatically fitting non-linear regression models. Includes a library of pre-defined models to simplify selection.

This method returns a list containing information about the supported non-linear models, including their names, descriptions, and the formulas they use. It serves as a convenient reference for users to understand the available options and select the most appropriate models for their dataset and objectives.

This method enables the inclusion of both built-in and custom models in the fitting process. Users can select a predefined model from the library or provide the necessary components to define a custom model, including a formula, starting parameters, and a function to calculate predictions.

For custom models, the following components must be provided:

- name: Name of the model
- formula: A mathematical representation of the model.
- start_params: A named list of starting parameter values for optimization.
- model_function: A function that takes input x and parameter values as arguments and returns the predicted y values.

The choice of fitting method depends on the arguments:

- If force_optim = TRUE, the function will use optim() regardless of whether weights are supplied.
- If weights is supplied, optim() will be used even if force_optim = FALSE.
- If neither force_optim nor weights is supplied, the function defaults to nls() for unweighted fitting.

Behavior Examples:

- 1. **Default behavior**: nls() is used when weights = NULL and force_optim = FALSE.
- 2. Weighted fitting: optim() is used when weights is provided, even if force_optim = FALSE.
- 3. **Forced optimization**: optim() is used when force_optim = TRUE, regardless of whether weights is supplied.

This method overlays the predictions of selected fitted models onto the observed data across a specified range of the independent variable. The output is an interactive plot generated using the echarts4r package, allowing users to visually assess the goodness of fit, trends, and differences among models.

By default, predictions are normalized to allow fair comparison across models with different scales. Users can customize the plotting range and apply specific visual themes for enhanced interpretability.

Public fields

data A data.table containing the dataset for modeling.

models A list of non-linear models to test.

fit_results A list to store the results of model fits.

evaluation_metrics A list to store evaluation metrics for each model.

plots A list to store plots of model fits.

model_library A pre-defined library of common non-linear models. Initialize the NonLinearFitter class

Methods

Public methods:

```
NonLinearFitter$new()
NonLinearFitter$list_models()
NonLinearFitter$add_model()
NonLinearFitter$fit_models()
NonLinearFitter$model_comparison_plot()
NonLinearFitter$clone()
```

Method new():

Usage:

NonLinearFitter\$new(data)

Arguments:

data A data.table containing the dataset for modeling. Must include the predictor and response variable columns.

Returns: A new instance of the NonLinearFitter class.

Method list_models(): Retrieves a list of all non-linear models available for fitting in the NonLinearFitter class, along with their descriptions and key details. This method provides an overview of the models users can select for analysis.

```
Usage:
NonLinearFitter$list_models()
Returns: A list summarizing available models.
```

Method add_model(): Adds a specified non-linear model to the list of models to be fitted. This method allows users to include predefined models or define their own custom models for analysis.

```
Usage:
NonLinearFitter$add_model(
    name,
    formula = NULL,
    start_params = NULL,
    model_function = NULL
)

Arguments:
name The name of the model (e.g., "Hill").
formula The non-linear formula for the model (optional if using pre-defined model).
start_params A list of starting parameters for the model (optional if using pre-defined model).
model_function A function used in fitting and prediction. See model_library for examples
Returns: NULL
```

Method fit_models(): fit_models() first standardizes your data before fitting the model. The fitting method depends on whether a weights_col is provided: nls() is used for unweighted fitting, while optim() is used for weighted fitting. The returned parameters are based on the standardized data. However, when scoring models, the results are back-transformed to align with the original data scale.

Usage:

```
NonLinearFitter$fit_models(
   x_col,
   y_col,
   weights_col = NULL,
   control = list(maxiter = 1024),
    force_optim = FALSE,
 )
 Arguments:
 x_col The name of the predictor variable.
 y_col The name of the response variable.
 weights_col The name of the weights variable.
 control A list of control parameters for the optimizer, such as maxiter. Default is list(maxiter
     = 200).
 force_optim Logical; if TRUE, forces the use of optim() regardless of whether weights are
     supplied. Defaults to FALSE.
 ... Additional arguments to be passed to the underlying fitting functions (nlsLM for unweighted
     models or optim for weighted models). Examples include trace, lower, and upper for
     nlsLM, or reltol, parscale, and others for optim.
 Returns: A list of fitted model objects.
Method model_comparison_plot(): Creates a visual comparison of multiple fitted non-linear
models against the observed data. This method helps evaluate the performance and fit of different
models in a single, intuitive plot.
 Usage:
 NonLinearFitter$model_comparison_plot(
    x_range = seq(1, 100, by = 1),
   normalize = TRUE,
    theme = "macarons"
 )
 Arguments:
 x_range A numeric vector specifying the range of x values to evaluate.
 normalize Logical. If TRUE, normalizes the y values for each model to fall between 0 and 1.
     Defaults to TRUE.
 theme A string specifying the plot theme (e.g., "macarons").
 Returns: An echarts4r object representing the comparison plot.
Method clone(): The objects of this class are cloneable with this method.
 NonLinearFitter$clone(deep = FALSE)
 Arguments:
```

deep Whether to make a deep clone.

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NonLinearModelEvaluator

NonLinearModelEvaluator

Description

NonLinearModelEvaluator NonLinearModelEvaluator

Details

An R6 class to evaluate non-linear regression models. Includes tools to generate tables of statistics and visualizations to compare models against data.

This method evaluates each fitted model by calculating various metrics such as Akaike Information Criterion (AIC), Bayesian Information Criterion (BIC), residual standard error, and R-squared values. It ensures compatibility across all models and gracefully handles cases where a model fails to fit properly by excluding it from the final summary.

This method generates a comparison plot for each fitted model, allowing users to visually assess how well the models align with the observed data. It supports customization options such as theming and dynamic adjustment of the x-axis range. Models that fail to fit are gracefully excluded, ensuring clean and informative outputs.

Public fields

fit_results A list of fitted model objects.

 $evaluation_metrics \ A \ data. table \ containing \ model \ evaluation \ metrics.$

plots A list of visualizations comparing models against data.

data The original dataset used for fitting models. Initialize the NonLinearModelEvaluator class

Methods

Public methods:

- NonLinearModelEvaluator\$new()
- NonLinearModelEvaluator\$generate_metrics()
- NonLinearModelEvaluator\$generate_comparison_plot()
- NonLinearModelEvaluator\$clone()

Method new():

Usage:

NonLinearModelEvaluator\$new(fit_results, data)

Arguments:

fit_results A list of fitted model objects (e.g., output from NonLinearFitter).

data The original dataset used for fitting models.

Returns: A new instance of the NonLinearModelEvaluator class.

Method generate_metrics(): Computes and summarizes key performance metrics for all fitted models, including goodness-of-fit statistics, residual standard errors, and information criteria. The metrics provide a comprehensive evaluation of each model's performance on the given dataset.

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```
Usage:
NonLinearModelEvaluator$generate_metrics(y_col = NULL, x_col = NULL)
Arguments:
y_col target variable
x_col x variable
Returns: A data.table of evaluation metrics with fitted equations.
```

Method generate_comparison_plot(): Creates visualizations comparing the fitted models

against the observed data to assess their fit and predictive behavior. The plots include the fitted curves overlaid on the original data points for easy comparison.

```
NonLinearModelEvaluator$generate_comparison_plot(
  data,
  x_col,
  y_col,
  theme = "westeros"
Arguments:
data A data.table or data.frame containing the dataset used for evaluation.
x_col A string specifying the name of the x variable in the dataset.
y_col A string specifying the name of the y variable in the dataset.
theme Echarts theme
Returns: An echarts4r plot showing observed vs. predicted data, with weighted comparisons
```

if available.

Method clone(): The objects of this class are cloneable with this method.

```
NonLinearModelEvaluator$clone(deep = FALSE)
Arguments:
deep Whether to make a deep clone.
```

NonLinearModelScorer NonLinearModelScorer

Description

NonLinearModelScorer NonLinearModelScorer

Details

An R6 class to score non-linear regression models on new data and visualize the results.

The score_new_data method enables users to evaluate how well the fitted models generalize to unseen data. It uses the stored parameters of the fitted models and applies them to the specified independent variable (x_col) in the new dataset. If the fitted models include transformations, the predictions are back-transformed to match the scale of the original data.

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The output is a data frame containing the original data and the predicted values for each model, making it easy to compare model predictions side-by-side.

The generate_score_plot method produces an interactive plot comparing the predicted values of a fitted model against the actual observed values from the new dataset. The independent variable (x_col) is used on the x-axis, while the predicted and actual dependent variable values are displayed on the y-axis. This visualization can be used to assess how well the model generalizes to new data and to identify areas where predictions deviate from observations.

The plot leverages the echarts4r package for interactive and customizable visualizations.

Public fields

```
fit_results A list of fitted model objects.
scored_data A list of data.tables containing scored data.
score_plots A list of plots visualizing scored data.
```

Methods

Public methods:

- NonLinearModelScorer\$new()
- NonLinearModelScorer\$score_new_data()
- NonLinearModelScorer\$generate_score_plot()
- NonLinearModelScorer\$clone()

Method new():

```
Usage:
```

NonLinearModelScorer\$new(fit_results)

Arguments

fit_results A list of fitted model objects (e.g., output from NonLinearFitter).

Returns: A new instance of the NonLinearModelScorer class.

Method score_new_data(): Generates predictions for new data using the fitted non-linear models. This method applies each model to the new dataset and returns the predicted values.

```
Usage:
```

```
NonLinearModelScorer$score_new_data(new_data, x_col)
```

Arguments:

new_data A data.table containing the new data to score.

x_col The predictor column in new_data.

Returns: A list of data.tables with predicted values for each model.

Method generate_score_plot(): Creates a visual representation of predictions versus actual values for a given fitted model and a new dataset. This plot helps evaluate the model's performance on unseen data.

```
Usage:
NonLinearModelScorer$generate_score_plot(
  model_name,
  new_data,
  x_col,
  theme = "westeros"
```

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Arguments:

model_name The name of the model to plot.

new_data The original new data used for scoring.

x_col The predictor column in new_data.

theme Echarts theme

Returns: A plot visualizing the scored data.

Method clone(): The objects of this class are cloneable with this method.

Usage:

NonLinearModelScorer\$clone(deep = FALSE)

Arguments:

deep Whether to make a deep clone.

run_shiny_app

Run the AutoNLS Shiny App

Description

This function launches the interactive Shiny application for AutoNLS.

Usage

```
run_shiny_app(launch_browser = TRUE)
```

Arguments

launch_browser Logical. If TRUE, the app opens in the default web browser. Defaults to TRUE.

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