# Package 'lambdaTS'

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#### Type Package

Title Variational Seq2Seq Model with Lambda Transformer for Time Series Analysis

Version 1.1

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#### Description

Time series analysis based on lambda transformer and variational seq2seq, built on 'Torch'.

License GPL-3

**Encoding** UTF-8

LazyData true

RoxygenNote 7.1.1

**Depends** R (>= 3.6)

**Imports** car, purrr, abind, ggplot2, readr, stringr, lubridate, narray, fANCOVA, imputeTS, modeest, scales, tictoc, bizdays, torch

NeedsCompilation no

**Repository** CRAN

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bitcoin\_gold\_oil bitcoin\_gold\_oil data set

#### Description

A data frame with different time series (prices and volumes) for bitcoin, gold and oil.

#### Usage

```
bitcoin_gold_oil
```

#### Format

A data frame with 18 columns and 1827 rows.

#### Source

Yahoo Finance

lambdaTS	lambdaTS: Variational Seq2Seq Lambda Transformer Model for Time
	Series Analysis

#### Description

Time series analysis based on Lambda Transformer and Variational Seq2Seq, built on 'Torch'.

#### Usage

```
lambdaTS(
 data,
  target,
  future,
 past = future,
  ci = 0.8,
  deriv = 1,
  yjt = TRUE,
  shift = 0,
  smoother = FALSE,
  k_{embed} = 30,
  r_proj = ceiling(k_embed/3) + 1,
  n_{heads} = 1,
  n_bases = 1,
  activ = "linear",
  loss_metric = "elbo",
  optim = "adam",
```

#### lambdaTS

```
epochs = 30,
lr = 0.01,
patience = epochs,
verbose = TRUE,
sample_n = 100,
seed = 42,
dev = "cpu",
starting_date = NULL,
dbreak = NULL,
days_off = NULL,
min_set = future,
holdout = 0.5,
batch_size = 30
```

#### Arguments

)

data	A data frame with ts on columns and possibly a date column (not mandatory)
target	String. Time series names to be jointly analyzed within the seq2seq model
future	Positive integer. The future dimension with number of time-steps to be predicted
past	Positive integer. The past dimension with number of time-steps in the past used for the prediction. Default: future
ci	Confidence interval. Default: 0.8
deriv	Positive integer. Number of differentiation operations to perform on the original series. $0 = $ no change; 1: one diff; 2: two diff, and so on.
yjt	Logical. Performing Yeo-Johnson Transformation on data is always advisable, especially when dealing with different ts at different scales. Default: TRUE
shift	Vector of positive integers. Allow for target variables to shift ahead of time. Zero means no shift. Length must be equal to the number of targets. Default: 0.
smoother	Logical. Perform optimal smooting using standard loess. Default: FALSE
k_embed	Positive integer. Number of Time2Vec embedding dimensions. Minimum value is 2. Default: 30
r_proj	Positive integer. Number of dimensions for the reduction space (to reduce quadratic complexity). Must be largely less than k_embed size. Default: ceiling(k_embed/3) + 1
n_heads	Positive integer. Number of heads for the attention mechanism. Computation- ally expensive, use with care. Default: 1
n_bases	Positive integer. Number of normal curves to build on each parameter. Compu- tationally expensive, use with care. Default: 1
activ	String. The activation function for the linear transformation of the attention ma- trix into the future sequence. Implemented options are: "linear", "leaky_relu", "celu", "elu", "gelu", "selu", "softplus", "bent", "snake", "softmax", "softmin", "softsign", "sigmoid", "tanh", "tanhshrink", "swish", "hardtanh", "mish". De- fault: "linear".

loss_metric	String. Loss function for the variational model. Two options: "elbo" or "crps". Default: "crps".
optim	String. Optimization methods available are: "adadelta", "adagrad", "rmsprop", "rprop", "sgd", "asgd", "adam". Default: "adam".
epochs	Positive integer. Default: 30.
lr	Positive numeric. Learning rate. Default: 0.01.
patience	Positive integer. Waiting time (in epochs) before evaluating the overfit perfor- mance. Default: epochs.
verbose	Logical. Default: TRUE
sample_n	Positive integer. Number of samples from the variational model to evalute the mean forecast values. Computationally expensive, use with care. Default: 100.
seed	Random seed. Default: 42.
dev	String. Torch implementation of computational platform: "cpu" or "cuda" (gpu). Default: "cpu".
starting_date	Date. Initial date to assign temporal values to the series. Default: NULL (pro- gressive numbers).
dbreak	String. Minimum time marker for x-axis, in liberal form: i.e., "3 months", "1 week", "20 days". Default: NULL.
days_off	String. Weekdays to exclude (i.e., c("saturday", "sunday")). Default: NULL.
min_set	Positive integer. Minimun number for validation set in case of automatic resize of past dimension. Default: future.
holdout	Positive numeric. Percentage of time series for holdout validation. Default: 0.5.
batch_size	Positive integer. Default: 30.

#### Value

This function returns a list including:

- prediction: a table with quantile predictions, mean and std for each ts
- history: plot of loss during the training process for the joint-transformed ts
- plot: graph with history and prediction for each ts
- learning\_error: errors for the joint-ts in the transformed scale (rmse, mae, mdae, mpe, mape, smape, rrse, rae)
- feature\_errors: errors for each ts in the original scale (rmse, mae, mdae, mpe, mape, smape, rrse, rae)
- pred\_stats: for each predicted time feature, IQR to range, KL-divergence, risk ratio, upside probability, averaged across time-points and compared at the terminal points.
- time\_log

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### Examples

```
## Not run:
lambdaTS(bitcoin_gold_oil, c("gold_close", "oil_Close"), 30, deriv = 1)
```

## End(Not run)

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