Package ‘rBayesianOptimization’

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Type Package
Title Bayesian Optimization of Hyperparameters
Version 1.2.1
Description A Pure R implementation of Bayesian Global Optimization with Gaussian Processes.
URL https://github.com/yanyachen/rBayesianOptimization
BugReports https://github.com/yanyachen/rBayesianOptimization/issues
Depends R (>= 2.10)
Imports stats, utils, data.table (>= 1.9.6), magrittr, foreach, GPfit
Suggests xgboost
License GPL-2
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Author Yachen Yan [aut, cre]
Maintainer Yachen Yan <yanyachen21@gmail.com>
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Bayesian Optimization

Description

Bayesian Optimization of Hyperparameters.

Usage

BayesianOptimization(
    FUN,
    bounds,
    init_grid_dt = NULL,
    init_points = 0,
    n_iter,
    acq = "ucb",
    kappa = 2.576,
    eps = 0,
    kernel = list(type = "exponential", power = 2),
    verbose = TRUE,
    ...
)

Arguments

FUN The function to be maximized. This Function should return a named list with 2 components. The first component "Score" should be the metrics to be maximized, and the second component "Pred" should be the validation/cross-validation prediction for ensembling/stacking.

bounds A named list of lower and upper bounds for each hyperparameter. The names of the list should be identical to the arguments of FUN. All the sample points in init_grid_dt should be in the range of bounds. Please use "L" suffix to indicate integer hyperparameter.

init_grid_dt User specified points to sample the target function, should be a data.frame or data.table with identical column names as bounds. User can add one "Value" column at the end, if target function is pre-sampled.

init_points Number of randomly chosen points to sample the target function before Bayesian Optimization fitting the Gaussian Process.

n_iter Total number of times the Bayesian Optimization is to be repeated.

acq Acquisition function type to be used. Can be "ucb", "ei" or "poi".
  • ucb GP Upper Confidence Bound
  • ei Expected Improvement
  • poi Probability of Improvement
BayesianOptimization

kappa tunable parameter kappa of GP Upper Confidence Bound, to balance exploitation against exploration, increasing kappa will make the optimized hyperparameters pursuing exploration.

eps tunable parameter epsilon of Expected Improvement and Probability of Improvement, to balance exploitation against exploration, increasing epsilon will make the optimized hyperparameters are more spread out across the whole range.

kernel Kernel (aka correlation function) for the underlying Gaussian Process. This parameter should be a list that specifies the type of correlation function along with the smoothness parameter. Popular choices are square exponential (default) or matern 5/2

verbose Whether or not to print progress.

... Other arguments passed on to GP_fit.

Value

a list of Bayesian Optimization result is returned:

- Best_Par a named vector of the best hyperparameter set found
- Best_Value the value of metrics achieved by the best hyperparameter set
- History a data.table of the bayesian optimization history
- Pred a data.table with validation/cross-validation prediction for each round of bayesian optimization history

References


Examples

```r
# Example 1: Optimization
## Set Pred = 0, as placeholder
Test_Fun <- function(x) {
  list(Score = exp(-(x - 2)^2) + exp(-(x - 6)^2/10) + 1/ (x^2 + 1),
       Pred = 0)
}
## Set larger init_points and n_iter for better optimization result
OPT_Res <- BayesianOptimization(Test_Fun,
                                 bounds = list(x = c(1, 3)),
                                 init_points = 2, n_iter = 1,
                                 acq = "ucb", kappa = 2.576, eps = 0.0,
                                 verbose = TRUE)

## Not run:
# Example 2: Parameter Tuning
library(xgboost)
data(agaricus.train, package = "xgboost")
dtrain <- xgb.DMatrix(agaricus.train$data,
                      label = agaricus.train$label)
cv_folds <- KFold(agaricus.train$label, nfolds = 5,
```
xgb_cv_bayes <- function(max_depth, min_child_weight, subsample) {
  cv <- xgb.cv(params = list(booster = "gbtree", eta = 0.01,
                           max_depth = max_depth,
                           min_child_weight = min_child_weight,
                           subsample = subsample, colsample_bytree = 0.3,
                           lambda = 1, alpha = 0,
                           objective = "binary:logistic",
                           eval_metric = "auc"),
              data = dtrain, nround = 100,
              folds = cv_folds, prediction = TRUE, showsd = TRUE,
              early_stopping_rounds = 5, maximize = TRUE, verbose = 0)
  list(Score = cv$evaluation_log$test_auc_mean[cv$best_iteration],
       Pred = cv$pred)
}
OPT_Res <- BayesianOptimization(xgb_cv_bayes,
  bounds = list(max_depth = c(2L, 6L),
                min_child_weight = c(1L, 10L),
                subsample = c(0.5, 0.8)),
  init_grid_dt = NULL, init_points = 10, n_iter = 20,
  acq = "ucb", kappa = 2.576, eps = 0.0,
  verbose = TRUE)

## End(Not run)

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**K Fold**

*K-Folds cross validation index generator*

**Description**

Generates a list of indices for K-Folds Cross-Validation.

**Usage**

`K Fold(target, nfolds = 10, stratified = FALSE, seed = 0)`

**Arguments**

- `target` Samples to split in K folds.
- `nfolds` Number of folds.
- `stratified` whether to apply Stratified KFold.
- `seed` random seed to be used.

**Value**

a list of indices for K-Folds Cross-Validation
rBayesianOptimization

rBayesianOptimization: Bayesian Optimization of Hyperparameters

Description

A Pure R implementation of bayesian global optimization with gaussian processes.

Author(s)

Maintainer: Yachen Yan <yanyachen21@gmail.com>

See Also

Useful links:

- https://github.com/yanyachen/rBayesianOptimization
- Report bugs at https://github.com/yanyachen/rBayesianOptimization/issues
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