Forestfire Regresyon Problemi

Final Ödevi

Deniz BALCI

Orman yangınlari veriseti(Regresyon problemi)

problem tanımı

Bu verisetindeki amacımız yanmış alanı tahmin etmektir.

Veri kaynağı: https://archive.ics.uci.edu/dataset/162/forest+fires

- 1. X Montesinho park haritası içindeki x ekseni uzamsal koordinatı: 1'den 9'a kadar
- 2. Y Montesinho park haritası içinde y ekseni uzamsal koordinatı: 2 ila 9
- 3. ay yılın ayı: 'jan' ila 'dec'
- 4. gün haftanın günü: 'mon' ile 'sun' arası
- 5. FFMC FWI sisteminden FFMC endeksi: 18,7 ila 96,20
- 6. DMC FWI sisteminden alınan DMC endeksi: 1,1 ila 291,3
- 7. DC FWI sisteminden alınan DC endeksi: 7,9 ila 860,6
- 8. ISI FWI sisteminden ISI endeksi: 0,0 ila 56,10
- 9. temp Santigrat derece cinsinden sıcaklık: 2,2 ila 33,30
- 10. RH % cinsinden bağıl nem: 15,0 ila 100
- 11. rüzgar km/sa cinsinden rüzgar hızı: 0.40 ila 9.40
- 12. yağmur mm/m2 cinsinden dış yağmur: 0.0 ila 6.4
- 13. alan ormanın yanmış alanı (hektar olarak): 0.00 ila 1090.84 (bu çıktı değişkeni 0.0'a doğru çok çarpıktır, bu nedenle logaritma dönüşümü ile modellemek mantıklıdır).

Veri ön işleme

Paketlerin yüklenmesi

library(caret)

```
Loading required package: ggplot2
Loading required package: lattice
  library(xgboost)
  library(caret)
  library(lightgbm)
Attaching package: 'lightgbm'
The following object is masked from 'package:xgboost':
    slice
  library(rsample)
  library(party)
Loading required package: grid
Loading required package: mvtnorm
Loading required package: modeltools
Loading required package: stats4
Loading required package: strucchange
Loading required package: zoo
Attaching package: 'zoo'
The following objects are masked from 'package:base':
    as.Date, as.Date.numeric
Loading required package: sandwich
```

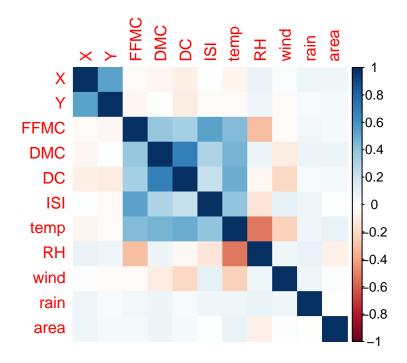
```
library(caTools)
  library(randomForest)
randomForest 4.7-1.1
Type rfNews() to see new features/changes/bug fixes.
Attaching package: 'randomForest'
The following object is masked from 'package:ggplot2':
    margin
  library(corrplot)
corrplot 0.92 loaded
  library(dplyr)
Attaching package: 'dplyr'
The following object is masked from 'package:randomForest':
    combine
The following object is masked from 'package:party':
    where
The following object is masked from 'package:lightgbm':
    slice
```

```
The following object is masked from 'package:xgboost':
    slice
The following objects are masked from 'package:stats':
    filter, lag
The following objects are masked from 'package:base':
    intersect, setdiff, setequal, union
  df <- read.csv('/home/deniz/Masaüstü/yükseklisans/ayz/xaifinal/forestfires.csv', sep=',')</pre>
  # Get unique values for each column
  unique_values <- sapply(df, function(y) sum(length(unique(y))))</pre>
  head(unique_values)
    Х
          Y month
                    day FFMC
                                 DMC
    9
               12
          7
                           106
                                 215
  # Display unique values
  na_count <-sapply(df, function(y) sum(length(which(is.na(y)))))</pre>
  head(na_count)
                    day FFMC
                                 DMC
          Y month
  categorical_cols <- df %>% select_if(is.character)
  head(categorical_cols)
  month day
   mar fri
1
   oct tue
  oct sat
  mar fri
4
5 mar sun
   aug sun
```

```
# Select numerical columns
numerical_cols <- df %>% select_if(is.numeric)

corr_matrix <- cor(numerical_cols )

corrplot::corrplot(corr_matrix, method = "color")</pre>
```



veri parçalama

```
# Split into training (70%) and testing set (30%)
parts <- createDataPartition(df$area, p = 0.7, list = FALSE)

train <- df[parts, ]
test <- df[-parts, ]

# Define predictor and response variables in the training set
train_x <- data.matrix(train[, -which(names(train) == 'area')])
train_y <- train[['area']]</pre>
```

```
# Define predictor and response variables in the testing set
test_x <- data.matrix(test[, -which(names(test) == 'area')])
test_y <- test[['area']]</pre>
```

BLACKBOX MODELLER

[16]

[17]

[18]

[19]

[20]

[21]

train-rmse:27.738469

train-rmse:27.132646

train-rmse:26.366780

train-rmse:25.880695

train-rmse:25.203151

train-rmse:23.969276

Aşağıdaki açıklamak için 3 farklı model kullanacağız bu bölümde modeller oluşturulacaktır. ### XBOOST

```
# Define final training and testing sets
  xgb_train <- xgb.DMatrix(data = train_x, label = train_y)</pre>
  xgb_test <- xgb.DMatrix(data = test_x, label = test_y)</pre>
  # Define watchlist
  watchlist <- list(train = xgb_train, test = xgb_test)</pre>
  # Fit XGBoost model and display training and testing data at each round
  model <- xgb.train(data = xgb_train, max.depth = 3, watchlist = watchlist, nrounds = 70, c</pre>
[1] train-rmse:67.682428
                            test-rmse:21.908867
[2] train-rmse:61.194436
                            test-rmse:22.800268
[3] train-rmse:56.160732
                            test-rmse:23.131703
[4] train-rmse:52.661168
                            test-rmse:26.124551
[5] train-rmse:48.722280
                            test-rmse:27.741769
[6] train-rmse:45.593632
                            test-rmse:28.514046
[7] train-rmse:42.921328
                            test-rmse:32.430345
[8] train-rmse:40.584419
                            test-rmse:32.682258
[9] train-rmse:38.177613
                            test-rmse:32.985821
Γ10]
       train-rmse:36.041509
                                test-rmse:35.239242
[11]
                                test-rmse:34.736753
        train-rmse:34.411412
Γ12]
       train-rmse:32.950517
                                test-rmse:36.825519
[13]
       train-rmse:31.398830
                                test-rmse:37.093981
[14]
       train-rmse:30.374555
                                test-rmse:37.280762
[15]
       train-rmse:28.732403
                                test-rmse:37.108459
```

test-rmse:37.597954

test-rmse:37.474830

test-rmse:37.707886

test-rmse:37.360117

test-rmse:37.740245

test-rmse:37.559818

```
[22]
        train-rmse:22.736642
                                 test-rmse:37.509607
[23]
        train-rmse:22.359121
                                 test-rmse:37.244913
[24]
        train-rmse:22.118872
                                 test-rmse:37.500224
[25]
        train-rmse:21.699242
                                 test-rmse:37.599427
[26]
        train-rmse:21.411891
                                 test-rmse:38.137624
[27]
        train-rmse:20.543480
                                 test-rmse:39.107216
[28]
        train-rmse:20.006608
                                 test-rmse:39.278162
        train-rmse:19.478627
[29]
                                 test-rmse:39.158466
[30]
        train-rmse:18.780187
                                 test-rmse:39.171789
                                 test-rmse:39.491736
[31]
        train-rmse:18.529866
[32]
        train-rmse:18.049611
                                 test-rmse:39.805859
[33]
        train-rmse:17.834435
                                 test-rmse:40.716070
[34]
        train-rmse:17.471120
                                 test-rmse:40.879931
[35]
        train-rmse:17.239826
                                 test-rmse:41.595157
[36]
        train-rmse:17.072987
                                 test-rmse:41.684680
[37]
        train-rmse:16.645170
                                 test-rmse:41.617660
[38]
        train-rmse:16.532223
                                 test-rmse:41.620508
[39]
                                 test-rmse:41.489057
        train-rmse:16.417010
[40]
        train-rmse:16.117951
                                 test-rmse:41.434575
Γ417
        train-rmse: 15.848955
                                 test-rmse:41.342245
[42]
        train-rmse:15.771998
                                 test-rmse:41.344755
[43]
        train-rmse:15.568584
                                 test-rmse:41.302286
[44]
        train-rmse:15.382945
                                 test-rmse:41.425517
[45]
        train-rmse:15.287118
                                 test-rmse:41.463351
[46]
        train-rmse:15.142174
                                 test-rmse:41.457358
[47]
        train-rmse:14.969452
                                 test-rmse:41.417649
[48]
        train-rmse:14.894735
                                 test-rmse:41.524491
[49]
        train-rmse:14.320939
                                 test-rmse:41.806531
[50]
        train-rmse:14.148476
                                 test-rmse:41.681424
[51]
        train-rmse:13.712226
                                 test-rmse:42.018521
[52]
        train-rmse:13.620914
                                 test-rmse:41.881199
[53]
        train-rmse:13.524812
                                 test-rmse:41.938985
[54]
        train-rmse:13.025379
                                 test-rmse:42.018115
        train-rmse:12.872613
                                 test-rmse:42.043178
[55]
[56]
        train-rmse:12.805716
                                 test-rmse:42.031781
[57]
        train-rmse:12.626518
                                 test-rmse:42.095065
[58]
        train-rmse:12.473717
                                 test-rmse:42.294344
[59]
        train-rmse:12.417053
                                 test-rmse:42.304182
[60]
        train-rmse:12.383391
                                 test-rmse:42.270117
        train-rmse:12.052947
                                 test-rmse:42.396589
[61]
        train-rmse:11.943671
[62]
                                 test-rmse:42.175739
[63]
        train-rmse:11.683088
                                 test-rmse:42.309264
[64]
        train-rmse:11.608244
                                 test-rmse:42.385798
```

```
[66]
       train-rmse:11.270778
                                test-rmse:42.436178
[67]
       train-rmse:11.060163
                                test-rmse:42.565949
[68]
     train-rmse:10.847006
                                test-rmse:42.596884
[69]
     train-rmse:10.763434 test-rmse:42.735575
[70]
        train-rmse:10.742235
                                test-rmse:42.734972
  # Make predictions on the testing set
  pred_y <- predict(model, xgb_test)</pre>
  # Calculate MSE, MAE, and RMSE
  mse <- mean((test_y - pred_y)^2)</pre>
  mae <- caret::MAE(test_y, pred_y)</pre>
  rmse <- caret::RMSE(test_y, pred_y)</pre>
  print(paste("MSE:", mse))
[1] "MSE: 1826.27784879151"
  print(paste("MAE:", mae))
[1] "MAE: 19.5748211185254"
  print(paste("RMSE:", rmse))
[1] "RMSE: 42.7349721983239"
LIGHTGBM
  dtrain = lgb.Dataset(train_x, label = train_y)
  dtest = lgb.Dataset.create.valid(dtrain, test_x, label = test_y)
  # define parameters
  params = list(
    objective = "regression"
    , metric = "12"
```

test-rmse:42.394236

[65]

train-rmse:11.323745

```
, min_data = 1L
    , learning_rate = .3
  # validataion data
  valids = list(test = dtest)
  # train model
  model1 = lgb.train(
   params = params
    , data = dtrain
    , nrounds = 5L
    , valids = valids
[LightGBM] [Info] Auto-choosing col-wise multi-threading, the overhead of testing was 0.0001
You can set `force_col_wise=true` to remove the overhead.
[LightGBM] [Info] Total Bins 509
[LightGBM] [Info] Number of data points in the train set: 364, number of used features: 12
[LightGBM] [Info] Start training from score 15.016676
[1]: test's 12:2459.98
[2]: test's 12:5859.19
[3]: test's 12:9167.5
[4]: test's 12:11918.4
[5]: test's 12:14135.2
  lgb.get.eval.result(model1, "test", "12")
[1] 2459.985 5859.187 9167.498 11918.446 14135.232
  # prediction
  pred_y1 = predict(model1, test_x)
  # accuracy check
  mse1 = mean((test_y - pred_y1)^2)
  mae1 = caret::MAE(test_y, pred_y1)
  rmse1 = caret::RMSE(test_y, pred_y1)
```

```
cat("MSE: ", mse1, "\nMAE: ", mae1, "\nRMSE: ", rmse1)
```

MSE: 2459.985 MAE: 20.83134 RMSE: 49.59823

GBM MODEL

```
library(gbm)
```

Loaded gbm 2.1.8.1

```
train$month <- as.factor(train$month)</pre>
train$day <- as.factor(train$day)</pre>
# Assuming you have a data frame named 'train' with the response variable 'Diabetes_012'
gbmmodel <- gbm(area ~ ., data = train, distribution = "gaussian", n.trees = 20,</pre>
                 shrinkage = 0.01, interaction.depth = 4)
# Assuming your 'test_x' is a data frame
# Convert it to a data frame if it's a matrix
test_x_df <- as.data.frame(test_x)</pre>
# Predict using the gbm model
pred_y2 <- predict(gbmmodel, newdata = test_x_df, n.trees = 20, type = "response")</pre>
# Assuming 'test_y' is the true response variable
# accuracy check
mse2 <- mean((test_y - pred_y2)^2)</pre>
mae2 <- caret::MAE(test_y, pred_y2)</pre>
rmse2 <- caret::RMSE(test_y, pred_y2)</pre>
cat("MSE: ", mse2, "\nMAE: ", mae2, "\nRMSE: ", rmse2)
```

MSE: 476.8477 MAE: 14.9188 RMSE: 21.83684

AÇIKLAYICI YAPAY ZEKA BÖLÜMÜ

İlk olarak local açıklayıcılar ile başlayacağız. Eğitim verisindeki 1.veri ile çalışmaya başlayacağız ### LOCAL AÇIKLAYICILAR

XGBOOST MODELI

BREAKDOWN

```
library(DALEX)
Welcome to DALEX (version: 2.4.3).
Find examples and detailed introduction at: http://ema.drwhy.ai/
Attaching package: 'DALEX'
The following object is masked from 'package:dplyr':
    explain
  explain_xboost_breakdown <- DALEX::explain(model = model,
                                            data = train_x,
                                            y = train_y,
                                            label = "xboost")
Preparation of a new explainer is initiated
  -> model label
                   : xboost
  -> data
                      : 364 rows 12 cols
  -> target variable : 364 values
  -> predict function : yhat.default will be used ( default )
  -> predicted values : No value for predict function target column. ( default )
  -> model_info
                      : package Model of class: xgb.Booster package unrecognized , ver. Un
  \rightarrow predicted values : numerical, min = -11.86818 , mean = 14.96462 , max = 1034.895
  -> residual function : difference between y and yhat ( default )
                      : numerical, min = -45.70413, mean = 0.05205815, max = 66.76136
  -> residuals
  A new explainer has been created!
```

```
# Assuming train_x[[1]] is a numeric vector or matrix
new_observation <- as.data.frame(train_x[1, , drop = FALSE])

# Extract feature names from the XGBoost model
model_feature_names <- colnames(model$feature_names)

# Check and set correct feature names in the new observation
if (!identical(colnames(new_observation), model_feature_names)) {
    colnames(new_observation) <- model_feature_names
}

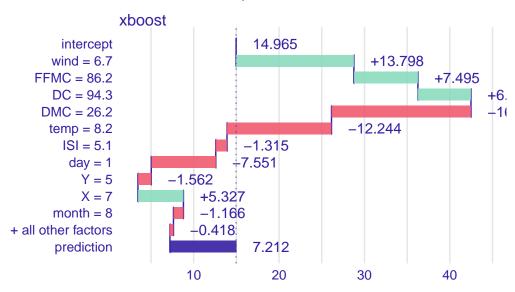
# Convert the new observation to a matrix
new_observation_matrix <- as.matrix(new_observation)

# Predict using the XGBoost model
prediction <- predict(model, newdata = new_observation_matrix)

# Calculate breakdown values
bd_xboost <- predict_parts(explain_xboost_breakdown, new_observation = new_observation_matrix)

# Plot breakdown values
plot(bd_xboost)</pre>
```

Break Down profile



xboost yönteminde ve breakdown methodunda en çok katkıyı DC,DMC değişkenleri yap-

SHAPLEY DEĞERLERİ

```
explain_xboost_shap <- DALEX::explain(model = model,</pre>
                                             data = train_x,
                                             y = train_y,
                                             label = "xboost shapley değerleri")
Preparation of a new explainer is initiated
                      : xboost shapley değerleri
  -> model label
                      : 364 rows 12 cols
  -> data
  -> target variable : 364 values
  -> predict function : yhat.default will be used ( default )
  -> predicted values : No value for predict function target column. ( default )
                      : package Model of class: xgb.Booster package unrecognized , ver. Un
  -> model_info
  \rightarrow predicted values : numerical, min = -11.86818 , mean = 14.96462 , max = 1034.895
  -> residual function : difference between y and yhat ( default )
  -> residuals
                      : numerical, min = -45.70413, mean = 0.05205815, max = 66.76136
  A new explainer has been created!
  prediction xboost <- predict(model, newdata = new observation matrix)</pre>
  sh xboost <- predict parts(explain xboost shap, new observation = new observation matrix,
  plot(sh_xboost)
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot
substituted for <c4>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot
substituted for <9f>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot
substituted for <c4>
```

Warning in grid.Call(C_textBounds, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <9f>

Warning in grid.Call(C_textBounds, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <c4>

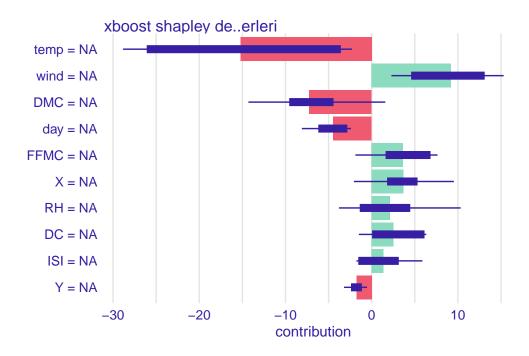
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <9f>

Warning in grid.Call(C_textBounds, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <c4>

Warning in grid.Call(C_textBounds, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <9f>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <c4>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'xboost shapley değerleri' in 'mbcsToSbcs': dot substituted for <9f>



xboost yönteminde ve shapley methodunda en çok katkıyı DC,DMC değişkenleri yapmıştır. ###LİGHTGBM MODELİ

BREAKDOWN

Preparation of a new explainer is initiated

-> model label : lightgbm

-> data : 364 rows 12 cols

-> target variable : 364 values

-> predict function : yhat.default will be used (default)

-> predicted values : No value for predict function target column. (default)

productive variety. No variety for production rangest column. (dordary)

-> model_info : package Model of class: lgb.Booster package unrecognized , ver. Uni

-> predicted values : numerical, min = 10.51167 , mean = 15.01668 , max = 337.7636

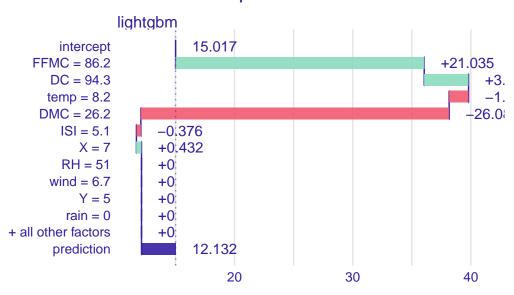
 \rightarrow residual function : difference between y and yhat (default)

 \rightarrow residuals : numerical, min = -16.84876 , mean = 3.386657e-08 , max = 753.07

A new explainer has been created!

```
# Calculate breakdown values
bd_lightbm <- predict_parts(explain_lightbm_breakdown, new_observation = new_observation_m
# Plot breakdown values
plot(bd_lightbm )</pre>
```

Break Down profile



Lightg
bm yönteminde ve breakdown methodunda en çok katkıyı Y,TEMP değişkenleri yapmıştır. #### SHAPLEY DEĞERLERİ

Preparation of a new explainer is initiated

-> model label : lightgbm shapley değerleri

-> data : 364 rows 12 cols

-> target variable : 364 values

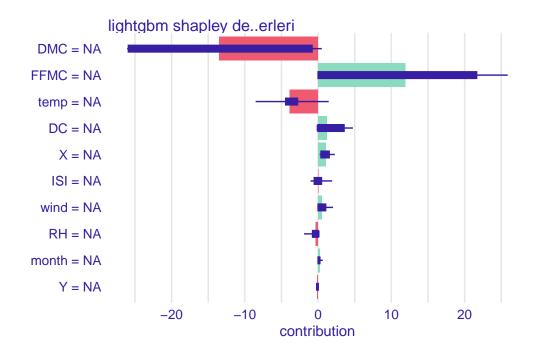
```
-> predict function : yhat.default will be used ( default )
 -> predicted values : No value for predict function target column. ( default )
                : package Model of class: lgb.Booster package unrecognized , ver. Un
 -> model_info
 -> predicted values : numerical, min = 10.51167 , mean = 15.01668 , max = 337.7636
 -> residual function : difference between y and yhat ( default )
                      : numerical, min = -16.84876, mean = 3.386657e-08, max = 753.076
  -> residuals
  A new explainer has been created!
  sh lightgbm <- predict parts(explain lightgbm shap, new observation = new observation matr
  plot(sh_lightgbm )
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
substituted for <c4>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
substituted for <9f>
Warning in grid.Call(C textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
substituted for <c4>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
substituted for <9f>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
substituted for <c4>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
substituted for <9f>
Warning in grid.Call(C_textBounds, as.graphicsAnnot(x$label), x$x, x$y, :
conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot
```

substituted for <c4>

Warning in grid.Call(C_textBounds, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot substituted for <9f>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot substituted for <c4>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on 'lightgbm shapley değerleri' in 'mbcsToSbcs': dot substituted for <9f>

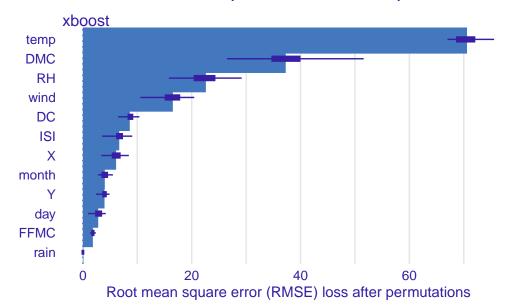


Lightgb
m yönteminde ve shapley methodunda en çok katkıyı Y,TEMP değişkenleri yapmıştır.

GLOBAL AÇIKLAYICILAR

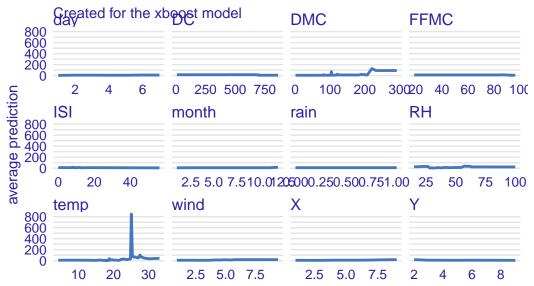
XBOOST

Mean variable-importance over 50 permutations



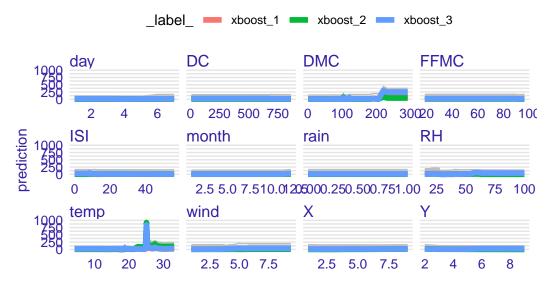
```
partialvip_xboost <- model_profile(explainer = explain_xboost_breakdown)
library("ggplot2")
plot(partialvip_xboost) + ggtitle("Partial-dependence profile for area")</pre>
```

Partial-dependence profile for area



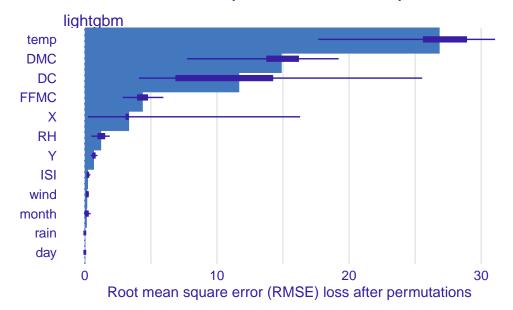
plot(pdp_rf_clust, geom = "profiles") +
 ggtitle("Clustered partial-dependence profiles for area")

Clustered partial-dependence profiles for area created for the xboost model



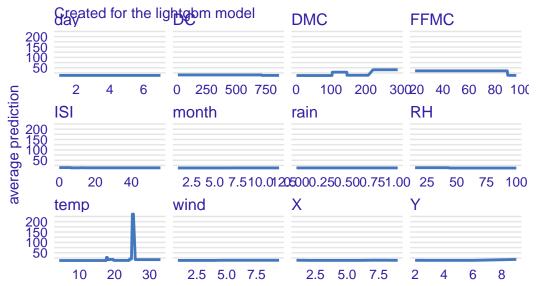
LIGHTGBM

Mean variable-importance over 50 permutations



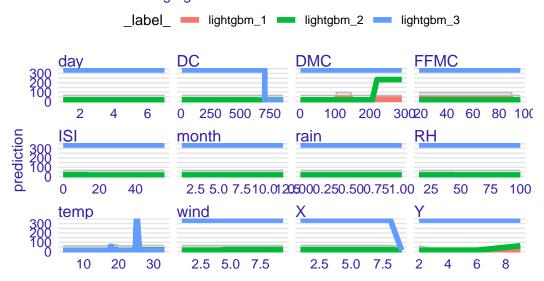
```
partialvip_lightbm <- model_profile(explainer =explain_lightbm_breakdown )
library("ggplot2")
plot(partialvip_lightbm) + ggtitle("Partial-dependence profile for area")</pre>
```

Partial-dependence profile for area



plot(lightbm_clust, geom = "profiles") +
 ggtitle("Clustered partial-dependence profiles for area")

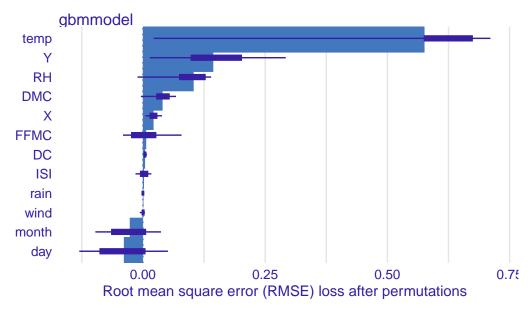
Clustered partial-dependence profiles for area created for the lightgbm model



GLOBAL GBMMODEL

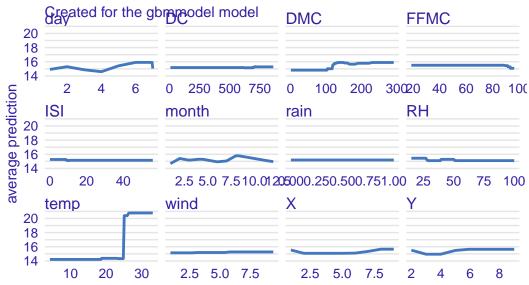
```
explainer_gbmmodel <- DALEX::explain(model = gbmmodel,</pre>
                                         data =as.data.frame( train_x),
                                         y = train_y,
                                         is multiclass = FALSE,
                                         label = "gbmmodel")
Preparation of a new explainer is initiated
 -> model label
                     : gbmmodel
 -> data
                     : 364 rows 12 cols
 -> target variable : 364 values
 -> predict function : yhat.gbm will be used ( default )
 -> predicted values : No value for predict function target column. ( default )
                  : package gbm , ver. 2.1.8.1 , task regression ( default )
 -> model_info
 -> predicted values : numerical, min = 12.97268 , mean = 15.17264 , max = 25.17661
 -> residual function : difference between y and yhat ( default )
                      : numerical, min = -24.49661, mean = -0.1559598, max = 1068.442
 -> residuals
  A new explainer has been created!
  vip_gbmmodel_clust<- model_parts(explainer =explainer_gbmmodel ,</pre>
                                 loss_function = loss_root_mean_square,
                                 B = 50,
                                 type = "difference")
  # Plot variable importance
  library("ggplot2")
  plot(vip_gbmmodel_clust ) +
    ggtitle("Mean variable-importance over 50 permutations", "")
```

Mean variable-importance over 50 permutations



```
partialvip_gbmmodel <- model_profile(explainer =explainer_gbmmodel )
library("ggplot2")
plot(partialvip_gbmmodel) + ggtitle("Partial-dependence profile for area")</pre>
```

Partial-dependence profile for area



Clustered partial-dependence profiles for area created for the gbmmodel model

