EIX:: Explain Interactions in XGBoost



The **EIX** (**Explain Interactions in XGBoost**) package supports structure mining from XGBoost and LightGBM models.

Key functionalities of this package cover: visualisation of tree-based ensembles models, identification of interactions, measuring of variable importance, measuring of interaction importance, explanation of single prediction with break down plots (based on **xgboostExplainer** and **breakDown** packages).

devtools :: install_github("ekarbowiak/EIX")
library("EIX")

library("Matrix")

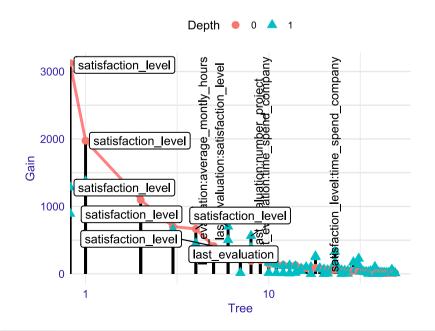
sm <- sparse.model.matrix(left ~ . - 1, data = HR_data)
library("xgboost")</pre>

param <- list(objective = "binary:logistic", max_depth = 2)
xgb_model <- xgboost(sm, params = param, label =
HR_data[, left] == 1, nrounds = 50)

Visualisation of model

The **lollipop plot** shows the model with labels of the most important variables and interactions.

lolli <- lollipop(xgb_model, sm)
plot(lolli, labels = "topAll", log_scale = TRUE)</pre>

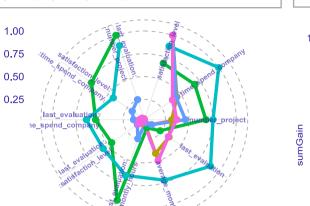


Importance of variables and interactions

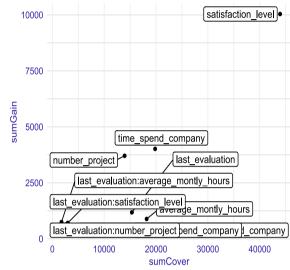
The **importance table** includes different measures of importance for variables and interactions. It is possible to visualise it in two ways using **plot**() function.

- option = "variables" object consists only single variables
- option = "interactions" only interactions
- option = "both" object shows importance both single variables and interactions.
 Default option.

Available measures: sumGain, sumCover, mean5Gain (mean gain from 5 occurrences of given variable with the highest gain), meanGain, meanCover, frequency

For single variables additionally: numberOfRoots, meanDepth, weightedRoot (last two weighted by Gain of variable) 

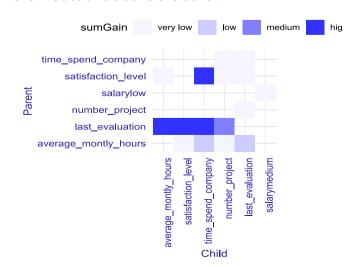
plot(imp, radar = FALSE, xmeasure = "sumCover", ymeasure = "sumGain", top = 10)



Interactions

The **interactions table** makes the ranking of interactions in the model. Importance of interactions it can also be visualised with **plot**() function.

- option = "interactions" these pairs of variables in which variable on the bottom (child) has higher gain than variable on the top (parent). Default option.
- **option = "pairs"** all pairs of variables, which occur in the model one above the other.



Explanation of a single prediction

The **waterfall plot** shows, which variables have influence on the prediction of a single observation.

new_observation <- sm[9,]
data <- HR_data[9,-7]
wf <- waterfall(xgb_model, new_observation, data, option = "interactions")
plot(wf)</pre>

