

# What's new in DrWhy.AI?

Hubert Baniecki, Warsaw, 09.2020

# DrWhy.AI



Model Oriented

MI2DataLab @ Warsaw University of T... <http://drwhy.ai/>

Repositories 45 Packages People 21

## Pinned repositories



moDel Agnostic Language for Exploration and eXplanation

Python 649 97



DrWhy is the collection of tools for eXplainable AI (XAI). It's based on shared principles and simple grammar for exploration, explanation and visualisation of predictive models.

R 381 51



A set of tools to understand what is happening inside a Random Forest

R 162 25



Interactive Studio for Explanatory Model Analysis

R 134 16



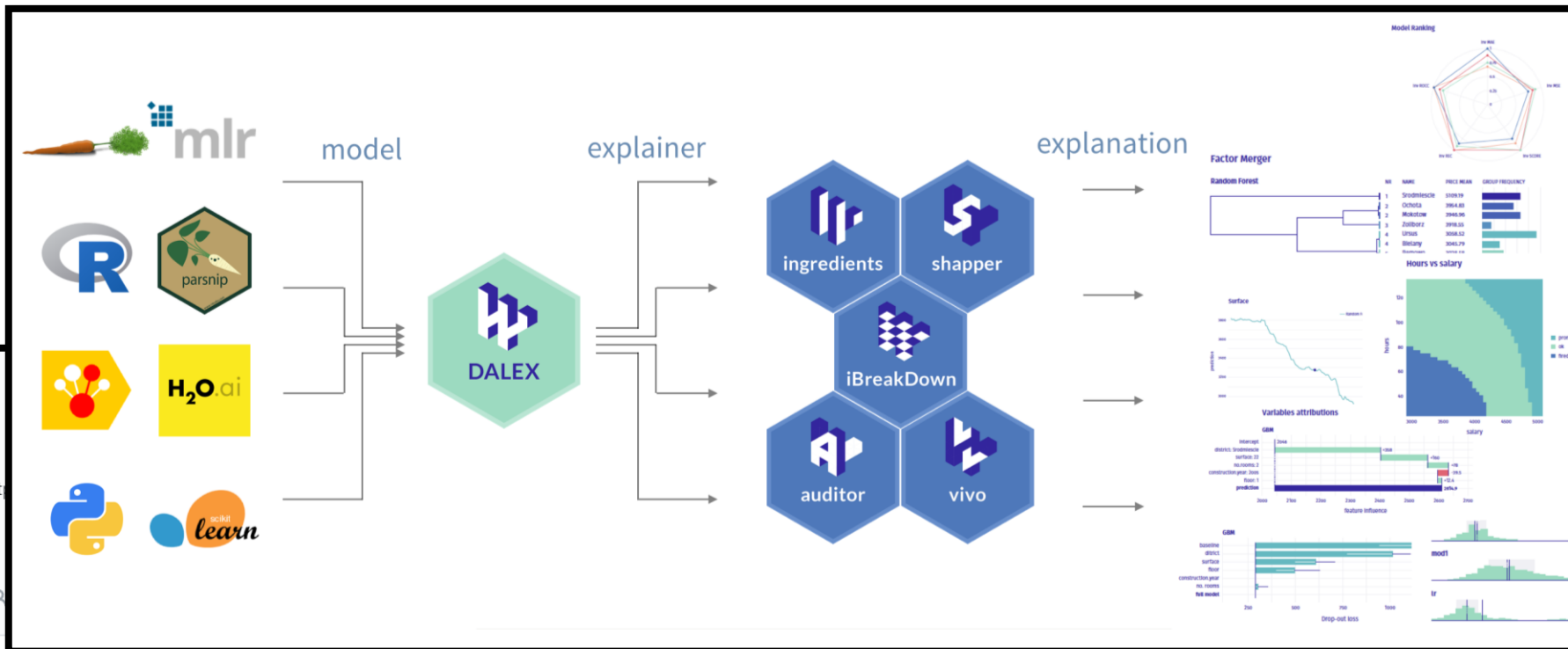
modelDown generates a website with HTML summaries for predictive models

R 99 11



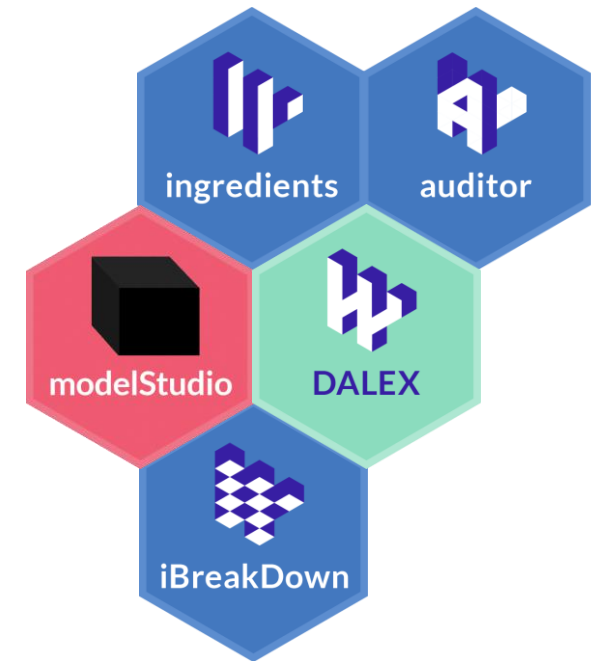
Break Down with interactions for local explanations (SHAP, BreakDown, iBreakDown)

R 53 8




# Hi!

- Data Science student at Warsaw University of Technology
- contributing and maintaining the DrWhy.AI universe
- interested in Explainable AI and model-human interaction



Aim: find a useful tool, resource, idea

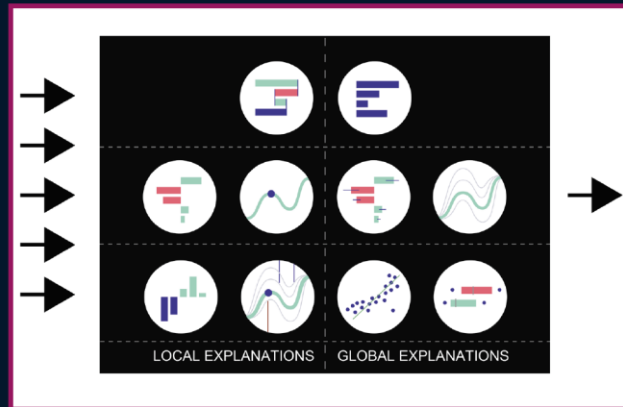
# What's new?

- **book:** Explanatory Model Analysis
- **tools:** arenar, fairmodels, xai2cloud
- **explanations:** vivo, triplot, treeshap
- **blog:** Responsible ML
- dalex in **Python** 

DATA SCIENCE SERIES

# EXPLANATORY MODEL ANALYSIS

Explore, Explain, and  
Examine Predictive Models



PRZEMYSŁAW BIECEK  
TOMASZ BURZYKOWSKI

 **CRC Press**  
Taylor & Francis Group  
A CHAPMAN & HALL BOOK

<https://pbiecek.github.io/ema/>

## Model Exploration Stack

What is the model prediction  
for the selected instance?

$f(x)$  AUC  
RMSE

How good is the model?

ROC curve  
LIFT, Gain charts  
Chapter 15

Which variables contribute to  
the selected prediction?

Break Down  
SHAP, LIME  
Chapters 6, 7, 8, 9

Which variables are important  
to the model?

Permutational  
Variable Importance  
Chapter 16

How does a variable  
affect the prediction?

Ceteris Paribus  
Chapters 10, 11

How does a variable affect  
the average prediction?

Partial Dependence Profile  
Accumulated Local Effects  
Chapters 17, 18

Does the model  
fit well around  
the prediction?

Chapter 12

Does the model  
fit well in  
general?

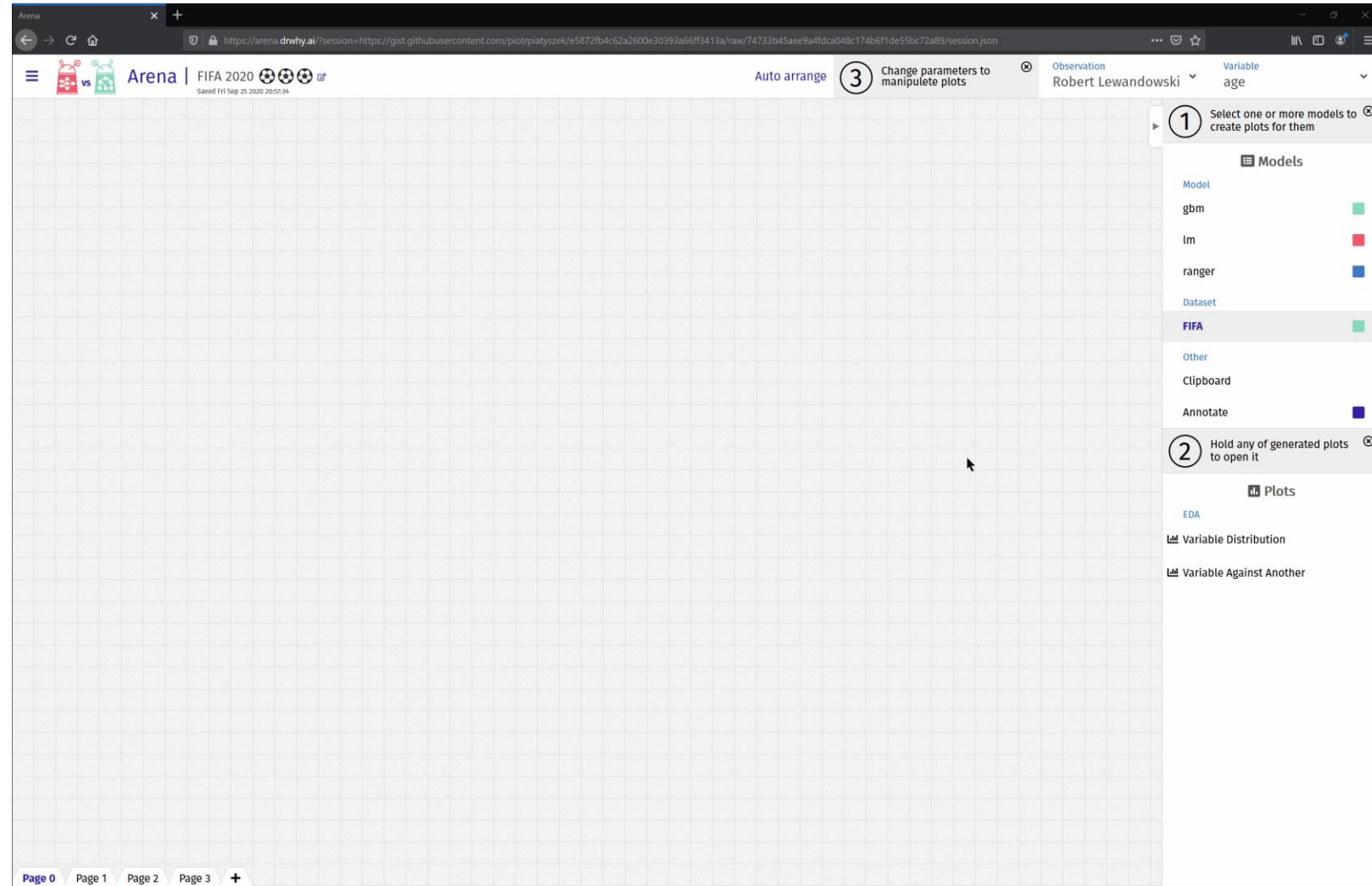
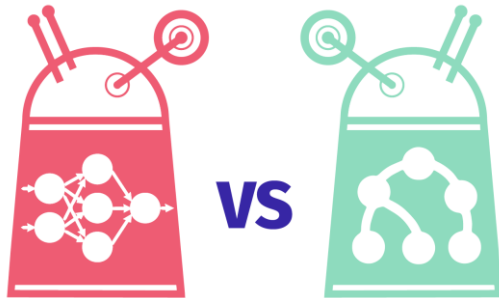
Chapter 19

PREDICTION LEVEL  
LOCAL EXPLANATIONS

MODEL LEVEL  
GLOBAL EXPLANATIONS

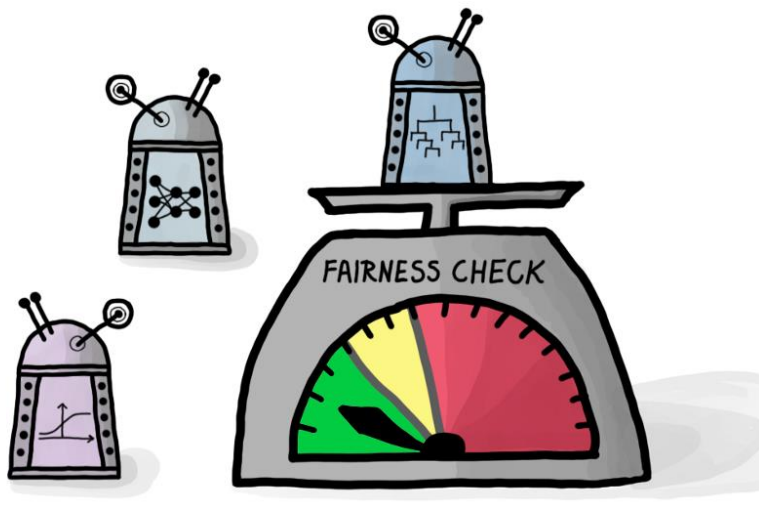
# arenar

- creates a dashboard for Explanatory Model Analysis
- interactive model and data explanation and comparison
- simple to use package
- save & share your analysis

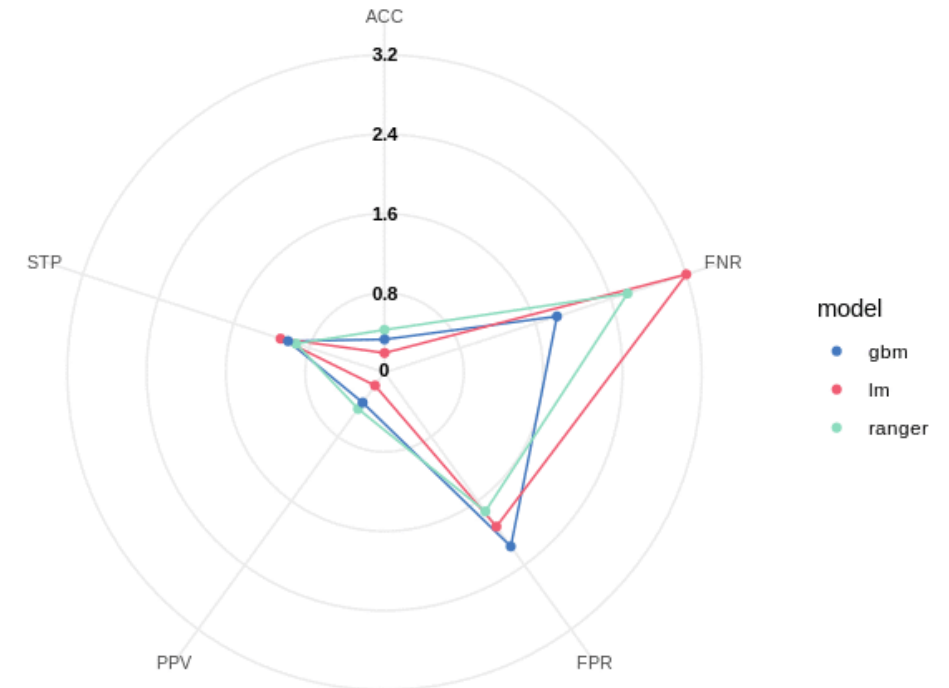


# fairmodels

- check model fairness in respect to sensitive categorical variables
- pre- and post- bias mitigation
- compare measures for multiple models
- various techniques and visualisations



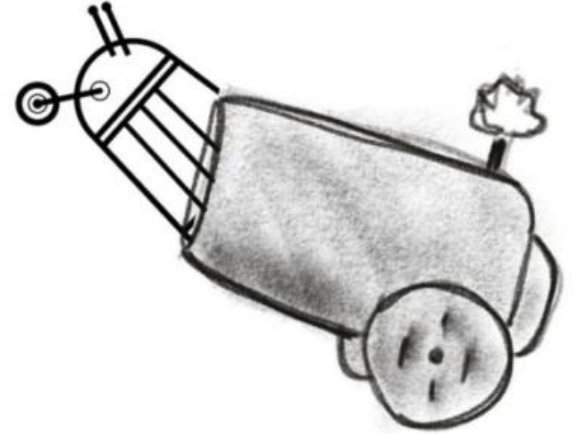
Parity loss metric radar plot



# xai2cloud



- automate the deployment of DALEX explainer into the cloud
- compute explanations and retrieve the results with REST API



**POST** **/predict**

Details

Response body

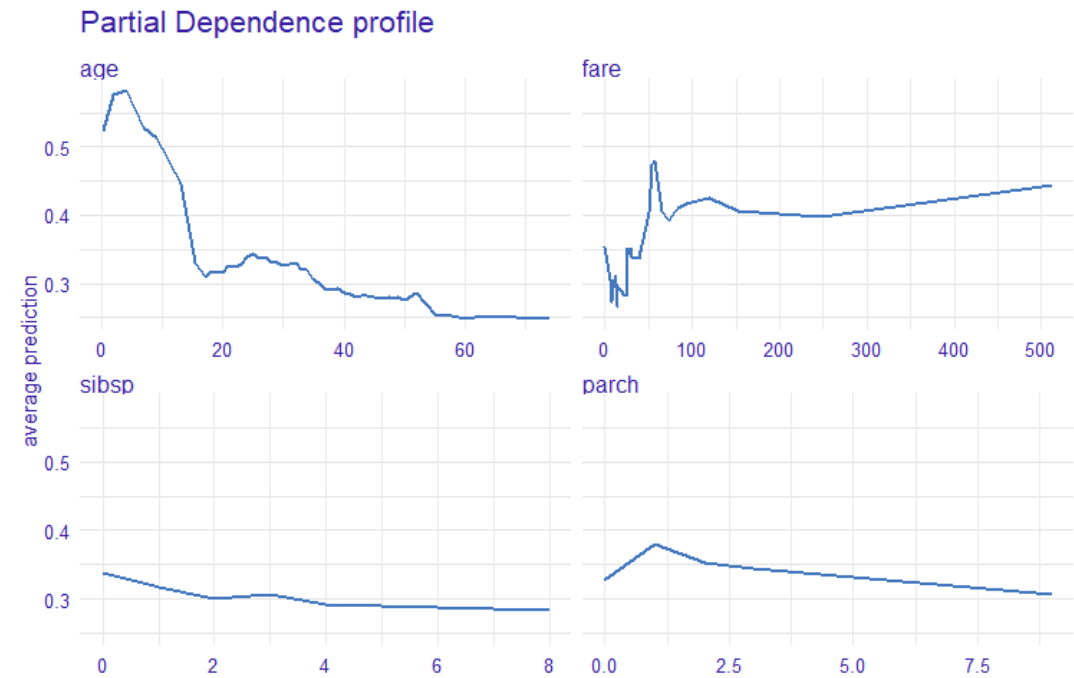
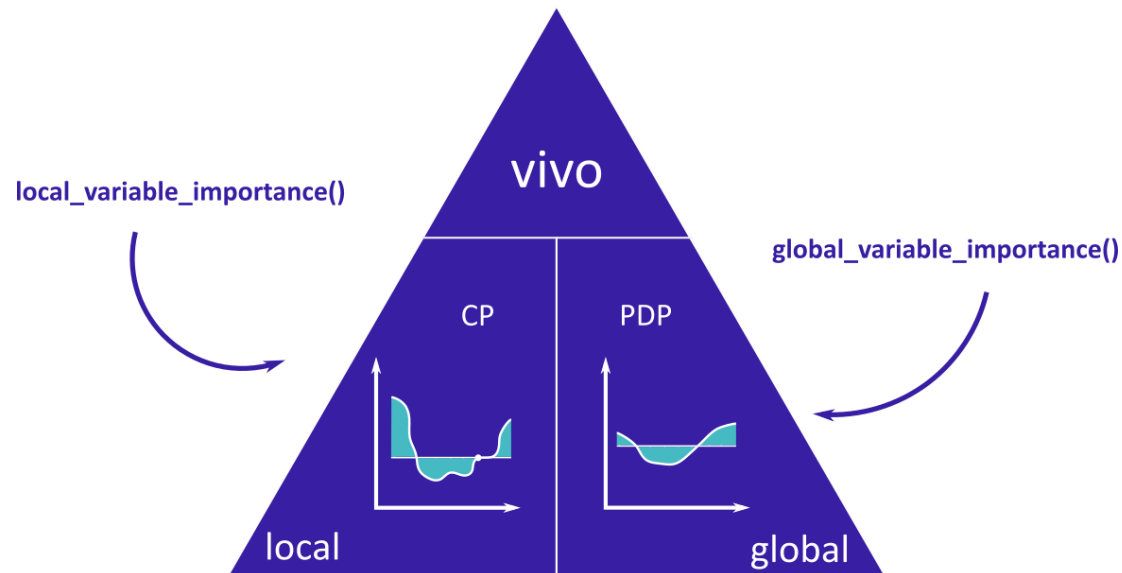
```
{
  "result_text": [
    "Predicted value 0.433942505714518"
  ],
  "result": [
    0.4339
  ],
  "raw_body": []
}
```



# Explanations

## vivo

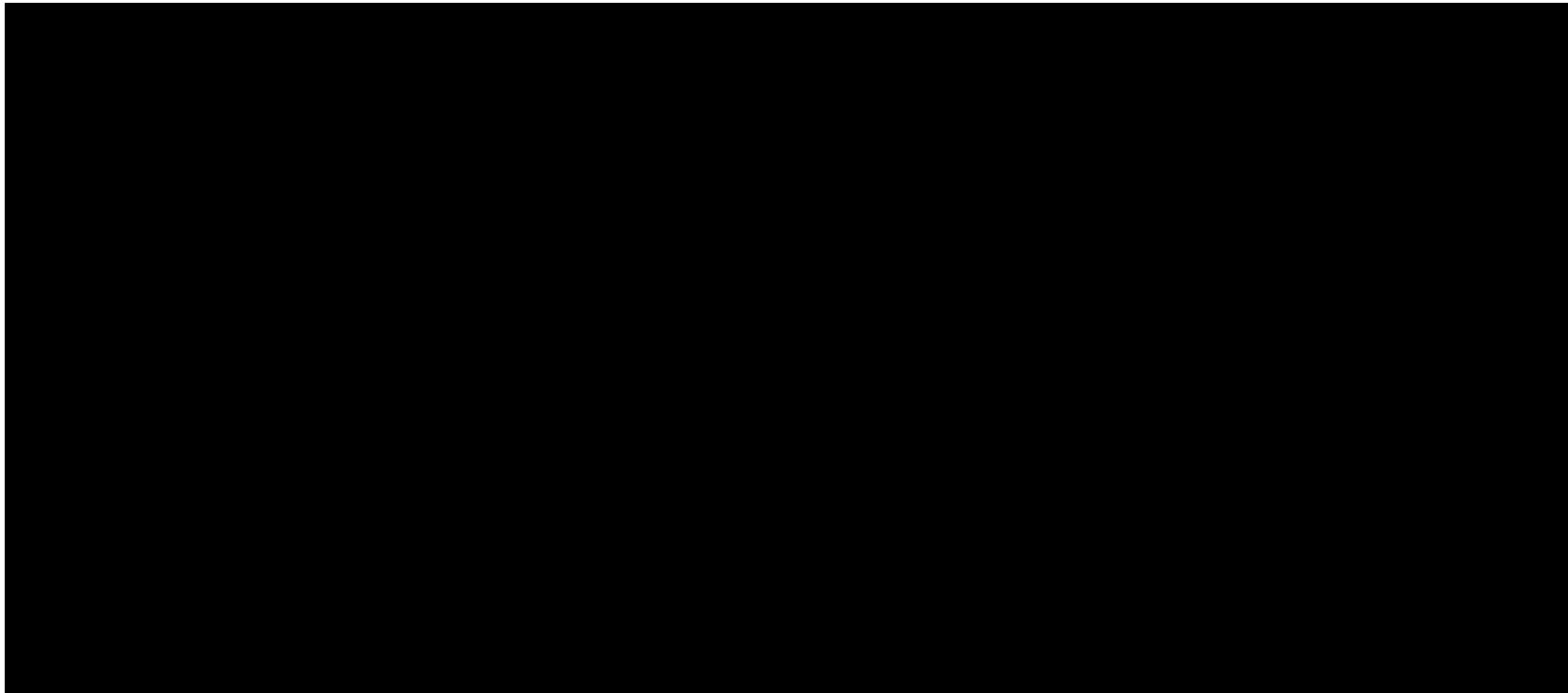
- alternative, model-agnostic way of calculating variable importance based on the Ceteris Paribus and Partial Dependence Profiles
- no random component



# Explanations

## triplot

- a lot of variables → a lot of correlated variables
- importance of groups of correlated variables – global and local



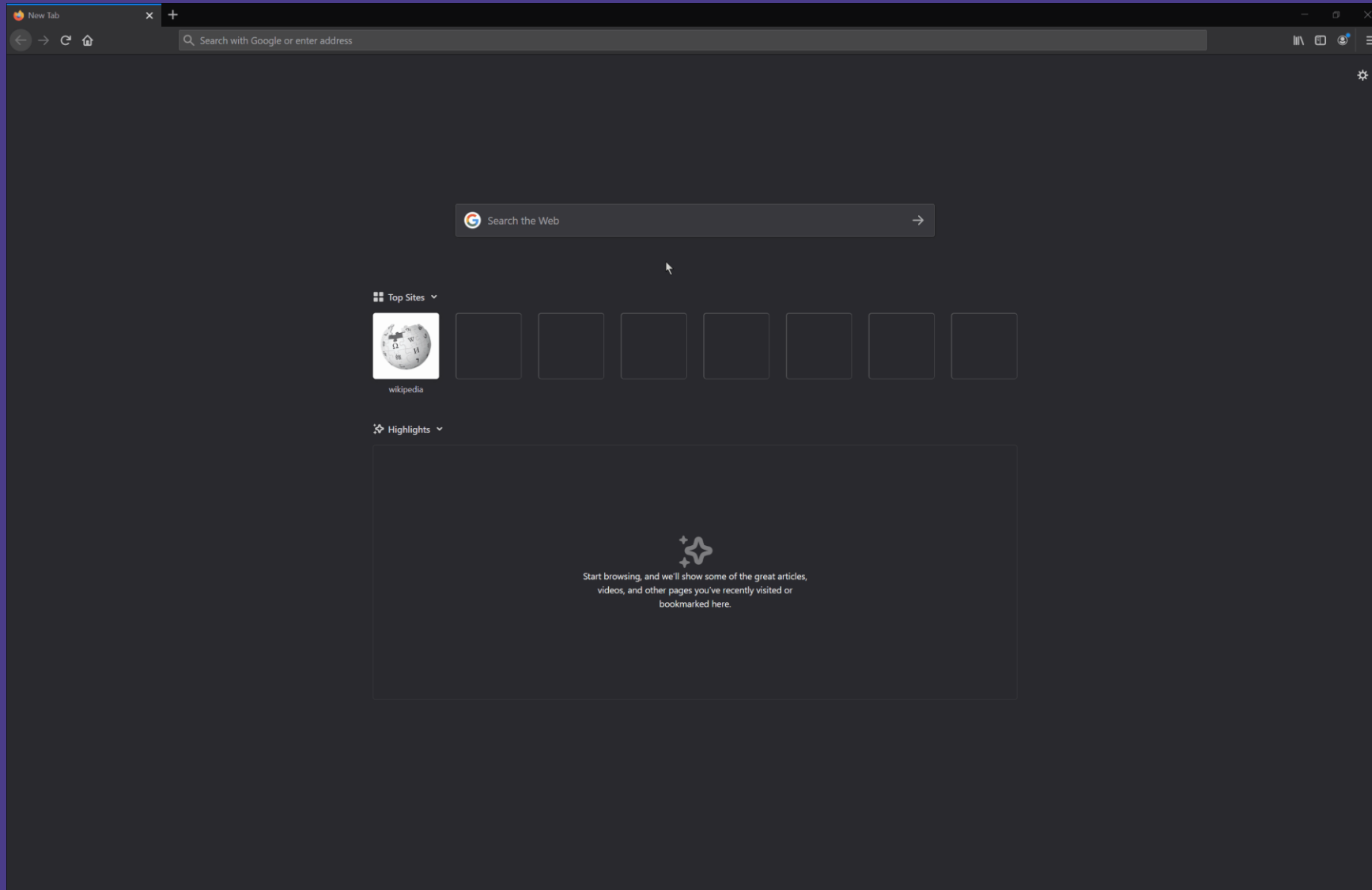
# Explanations

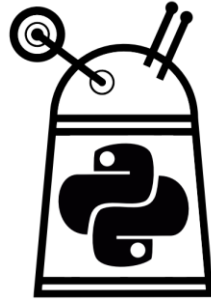
## **treeshap (beta)**

- fast C++ implementation of SHAP values computation in R for tree ensemble models
- global and local plots
- supports models produced with:
  - xgboost, lightgbm, catboost, gbm
  - ranger, randomForest
  - propose more!

# DrWhy.AI blog: Responsible ML

<https://medium.com/responsibleml>





DALEX

moDel Agnostic Language for Exploration and eXplanation

Python 649 97

Python-check passing pypi package 0.2.2 downloads 11k

# MODEL

- scikit-learn
- tensorflow, keras
- xgboost, lightgbm
- ANY

# DATA

- pandas
- numpy

pip install dalex

import dalex as dx

dx.Explainer

# EXPLANATIONS

- result attribute (pandas)
- plot method (plotly)

# METHODS

predict/model + parts/profile/diagnostics  
/surrogate/performance

# Share & send feedback

GitHub	<a href="https://github.com/ModelOriented">https://github.com/ModelOriented</a>
ResponsibleML	<a href="https://medium.com/responsibleml">https://medium.com/responsibleml</a>
Contact me	<a href="https://linkedin.com/in/hbaniecki">https://linkedin.com/in/hbaniecki</a>