

DATA CHALLENGE

Link prediction for the French Web

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Oualid EL HAJOUJI

Othman GAIZI

Jad SAADANI HASSANI

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Introduction

Data : - **Directed graph:** enumeration of edges

Problem : - Given a couple of node Ids, predict presence of a directed link

Example : -
23 56 → 1
56 23 → 0
340 23 → 0

Feature engineering

Graph structure

- 1-hop features

Ex : $CN(u, v) = |\Gamma(u) \cap \Gamma(v)|$

$$JC(u, v) = \frac{|\Gamma(u) \cap \Gamma(v)|}{|\Gamma(u) \cup \Gamma(v)|}$$

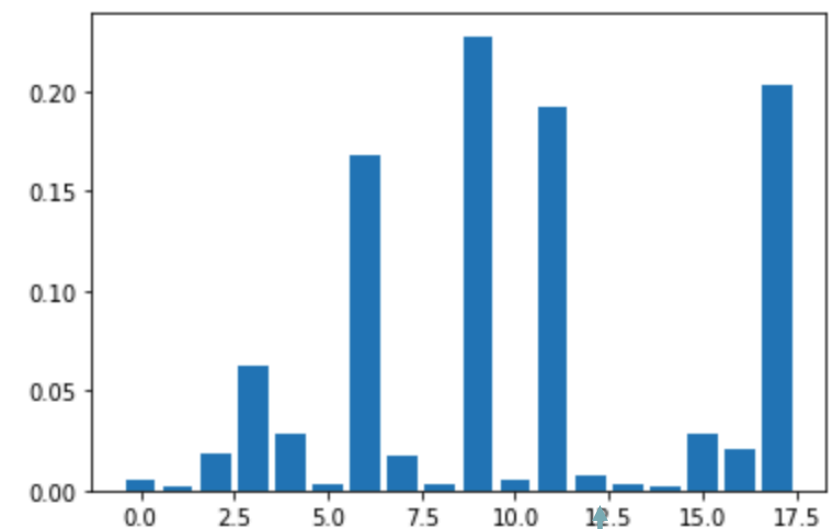
$$UD = |\Gamma(u)|$$

$$VD = |\Gamma(v)|$$

- Multi-hops features

- Number of paths of length 2/3 (Katz)
- Shortest path length
- Community (Louvain, Infomap)
- Node2Vec

- Engineering all features considering directionality ...

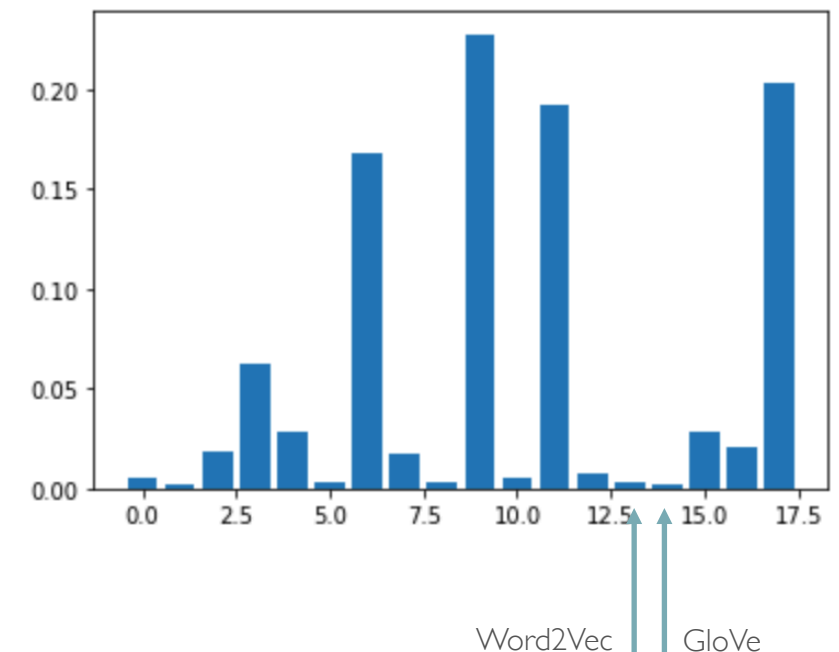


Node2vec

Feature engineering

Nodes text

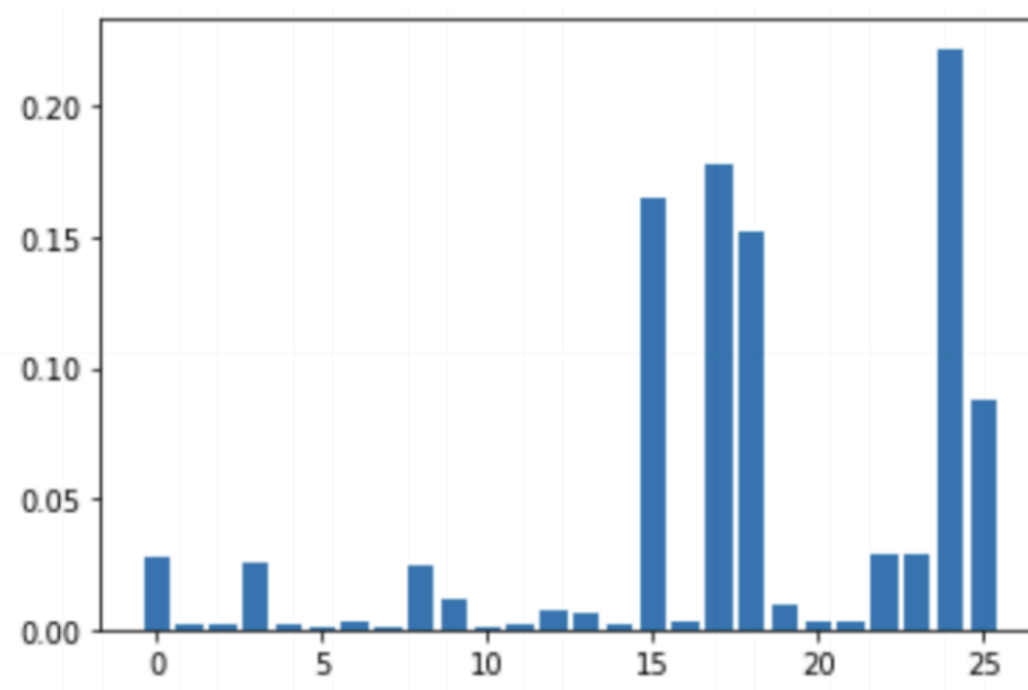
- TF-IDF
- Keywords extraction with PageRank
- Word2Vec/GloVe (pretrained models)



- Recomputing all features after cleaning the data with nltk library

Parameter tuning

- Model used: XGBoost



Features importance of our final model. 0-21: basic neighborhood features, 22: TF-IDF, 23: shortest path length, 24: community, 25: number of paths of length 3.

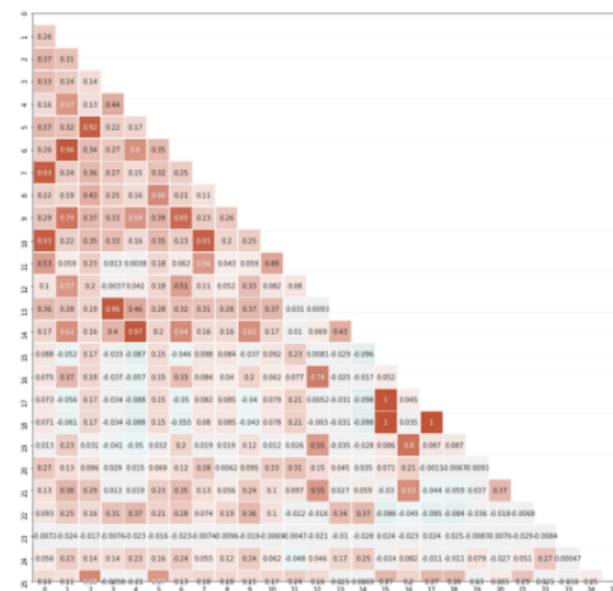
It is this tool that helped us throughout our experiments to evaluate our model and features selection.

Parameter tuning

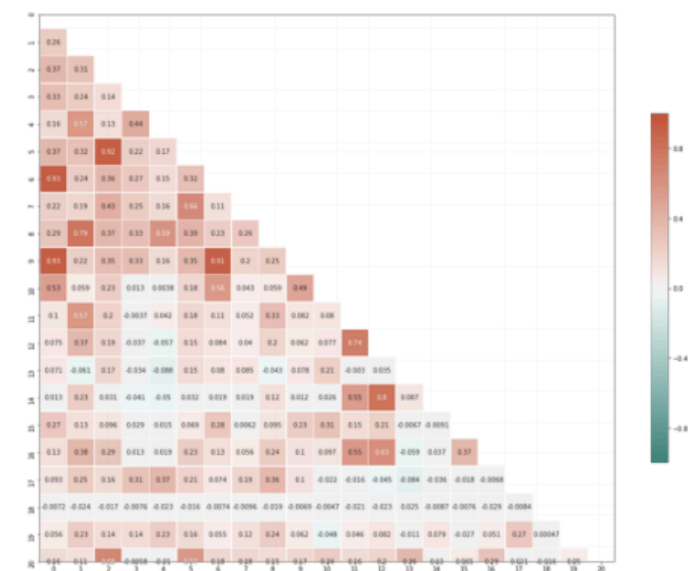
- **Xgboost caveats :** - large number of parameter (depth complexity, learning rate, number of trees, regularization)
- Overfitting
- **Constraint :** 5 submissions / day
- **Strategy :**
 - Dividing data into training/test set for local evaluation
 - Parameters grid search with cross validation

Final model

- Features correlation



All features correlation



Filtered features correlation

- Comparison and voting classifier

- Logistic Regressor,
- Decision Tree Classifier,
- SVM,
- Naive bayes classifier

- Linear Discriminant Analysis,
- Quadratic Discriminant Analysis,
- Random Forest Classifier,
- KNN Classifier ...