# Catégorisation automatique des questions stack overflow

#### **Sommaire**

- 1. Contexte
- 2. Projet
- 3. Données et nettoyage
- 4. Exploration
- 5. Modélisations
- 6. API
- 7. Conclusion



- site web proposant des questions et réponses, thèmes concernant la programmation informatique.
- Il a été lancé le 15 septembre 2008 par Jeff Atwood et Joël Spolsky.
- En août 2015, Stack Overflow revendique plus de 10 000 000 questions.
- L'utilisation de "Tags" ("étiquettes").

#### **BDD Stack Overflow**



#### **Questions / Tags**

- 1. Nettoyage et pré-traitement des données textuelles.
- 2. Feature engineering
- Modélisations supervisées et non-supervisées.
- 4. Point d'entrée API (web app)

## DONNÉES

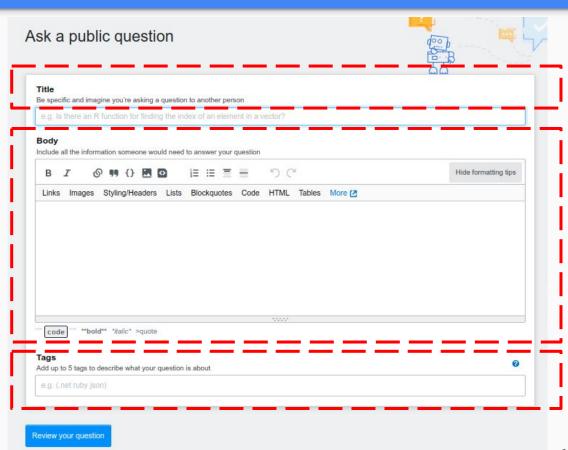
#### DONNÉES

### Stack**Exchange**

SELECT id, PostTypeId, Title, Body, Tags,CreationDate, Score FROM Posts WHERE CreationDate >= '2019/01/01' AND PostTypeId = 1 AND Score > 2 ORDER BY CreationDate

Limitation 50000 obs

Multiples requêtes successives par dates.



#### **DONNÉES**

#### **Préparation:**

- Retrait balises code
- Suppression ponctuation et stopwords
- Tokenisation et Lemmatisation

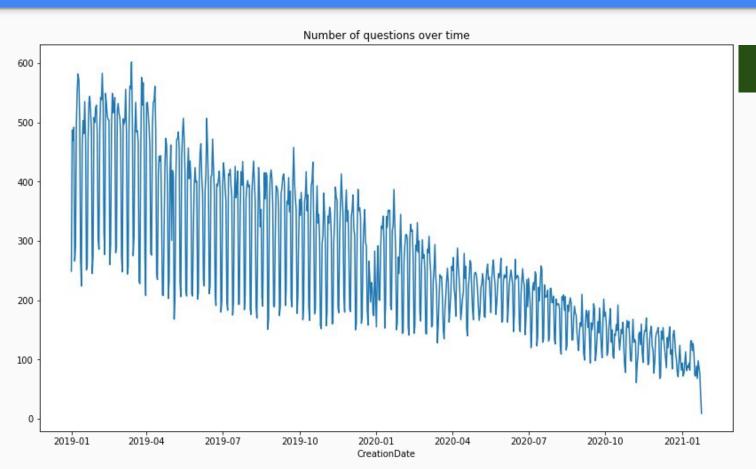
This is actually for the thread on <a href="https://stackoverflow.com/questions/49162667/unknown-er ror-call-function-result-missing-value-for-selenium-send-keys-ev en">unknown error: call function result missing 'value' for Selenium Send Keys even after chromedriver upgrade</a> but I guess my reputation isn't high enough to participate(lame).



'actually', 'thread', 'unknown', 'error', 'call', 'function', 'result', 'missing', 'value', 'selenium', 'send', 'key', 'even', 'chromedriver', 'upgrade', 'guess', 'reputation', 'high', 'enough', 'participate', 'lame'

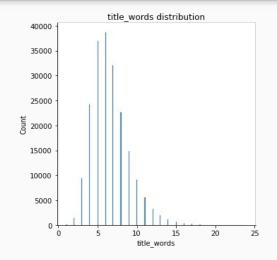
## **ANALYSE EXPLORATOIRE**

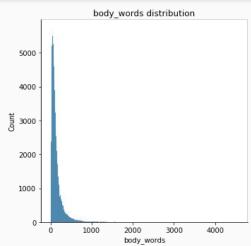
#### **Questions**



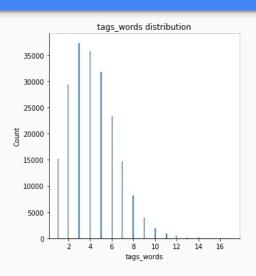
**202 861 questions** 

#### **Tendances centrales**

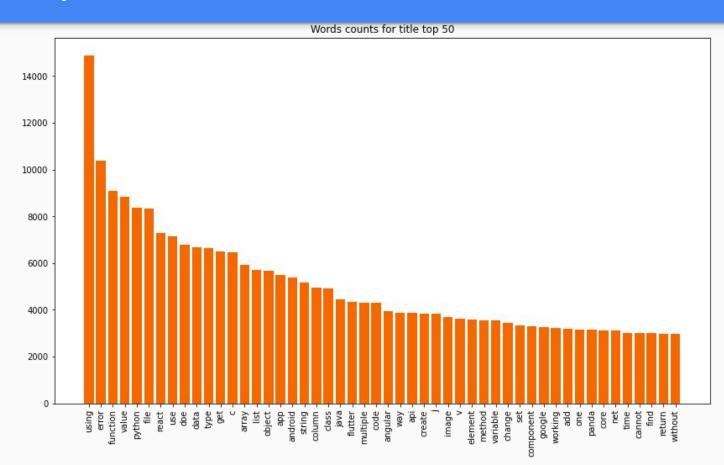




count         body_words         title_words         tags_words           count         202861.000000         202861.000000         202861.000000           mean         150.741715         6.614480         4.277436           std         200.680904         2.374406         2.131873           min         1.000000         1.000000         1.000000           25%         55.000000         5.000000         3.000000           50%         96.00000         6.000000         4.000000           75%         171.000000         8.000000         6.000000           max         4550.00000         24.00000         17.000000			LOUY_WOTUS		
mean         150.741715         6.614480         4.277436           std         200.680904         2.374406         2.131873           min         1.000000         1.000000         1.000000           25%         55.000000         5.000000         3.000000           50%         96.000000         6.000000         4.000000           75%         171.000000         8.000000         6.000000		body_words	title_words	tags_words	
std         200.680904         2.374406         2.131873           min         1.000000         1.000000         1.000000           25%         55.000000         5.000000         3.000000           50%         96.000000         6.000000         4.000000           75%         171.000000         8.000000         6.000000	count	202861.000000	202861.000000	202861.000000	
min         1.000000         1.000000         1.000000           25%         55.000000         5.000000         3.000000           50%         96.00000         6.000000         4.000000           75%         171.000000         8.000000         6.000000	mean	150.741715	6.614480	4.277436	
25%       55.000000       5.000000       3.000000         50%       96.000000       6.000000       4.000000         75%       171.000000       8.000000       6.000000	std	200.680904	2.374406	2.131873	
50%       96.000000       6.000000       4.000000         75%       171.000000       8.000000       6.000000	min	1.000000	1.000000	1.000000	
<b>75%</b> 171.000000 8.000000 6.000000	25%	55.000000	5.000000	3.000000	
	50%	96.000000	6.000000	4.000000	
<b>max</b> 4560.000000 24.000000 17.000000	75%	171.000000	8.000000	6.000000	
	max	4560.000000	24.000000	17.000000	

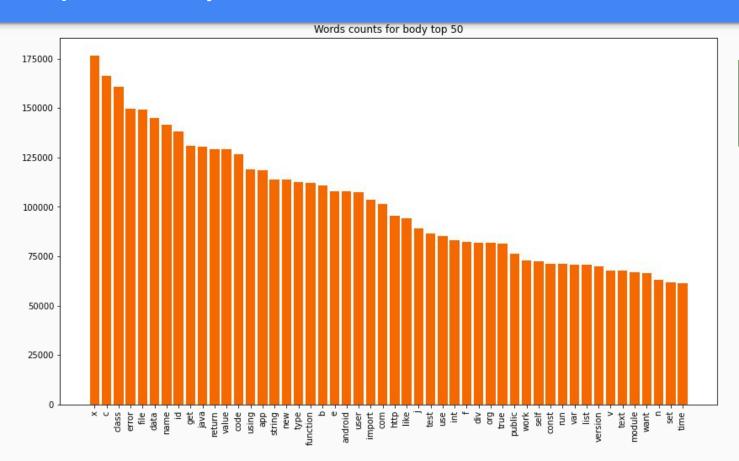


#### Fréquences: Title



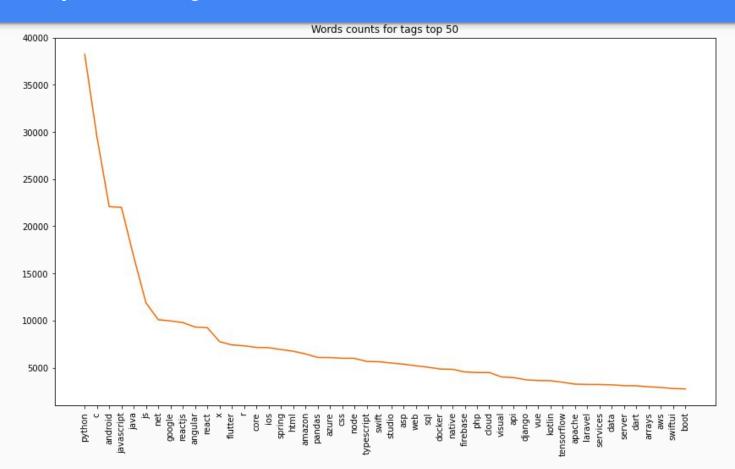
## 4 114 mots uniques

#### Fréquences: Body



541 371 mots uniques

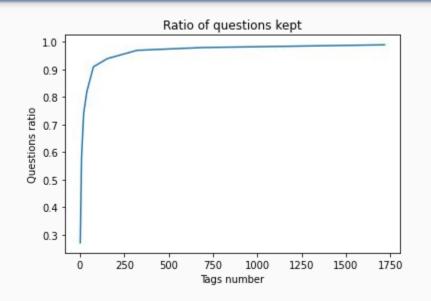
#### Fréquences: Tags

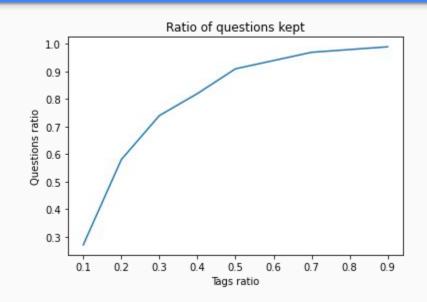


14 966 mots uniques

## MODÉLISATION (supervisée)

#### **Target: Tags**





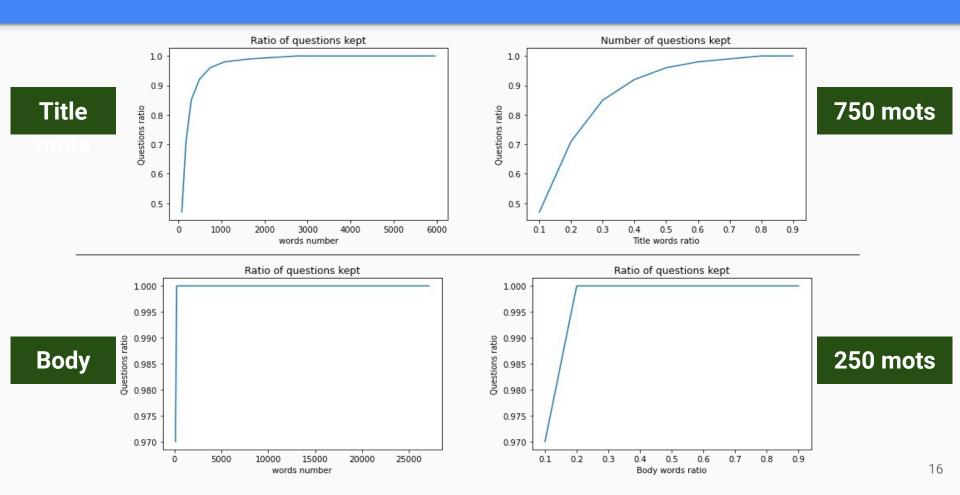
76 Tags

**Suppression 0** 

classification multi-étiquettes (OvR)

**Jaccard Score** 

#### **Features**



#### **Approche et performances**

Title Body

Input BOW Input tf-idf

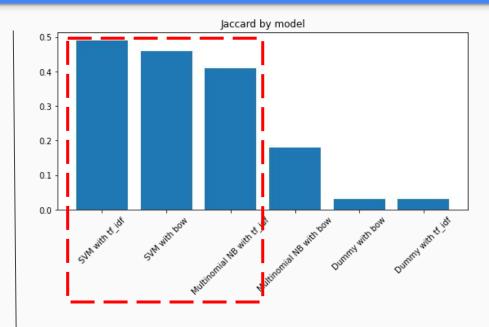
Multinomial NB classifier

Linear SVC

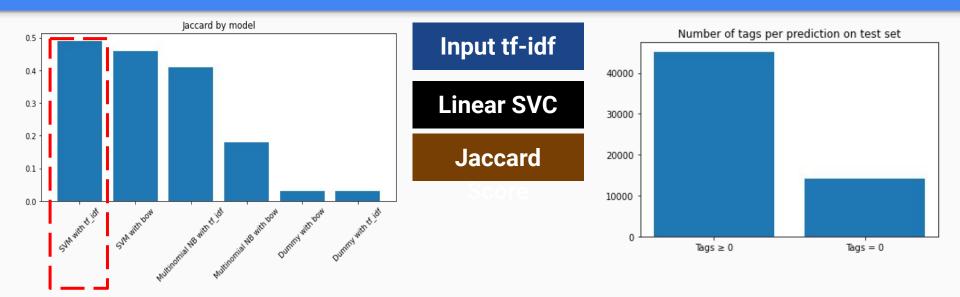
classification multi-étiquettes (OvR)

**Jaccard Score** 

$$J = \frac{M_{11}}{M_{01} + M_{10} + M_{11}}$$



#### Gridsearch

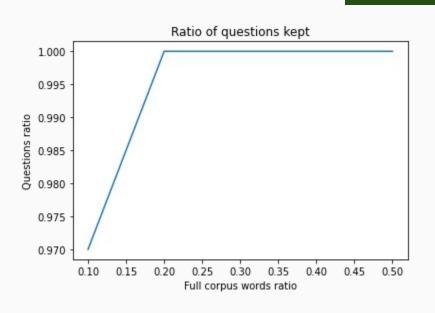


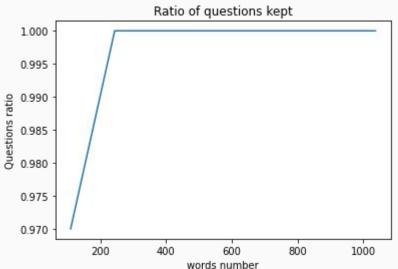
```
Gridsearch with Linear SVC and tf- idf
Gridsearch best params: {'estimator__C': 10, 'estimator__penalty': 'l2'}
Gridsearch Jaccard score on test split: 0.49
Gridsearch Jaccard score on train split: 0.51
```

## MODÉLISATION (non supervisée)

#### **Features**

#### Title + Body



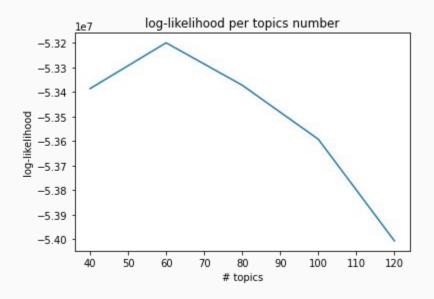


**250 mots** 

#### **Approche**

#### **Input BOW**

#### **Latent Dirichlet Allocation**



60 topics

4 mots / tags

Topic 0: info task debug level Topic 1: size input output max Topic 2: true false state prop Topic 3: service net core token Topic 4: aws location resource permission Topic 5: end next vector double Topic 6: std template foo bar Topic 7: server client val stream Topic 8: option na select cell Topic 9: view io firebase fun Topic 10: map child flutter context Topic 11: db database sql spark Topic 12: java org internal gradle

## **API**



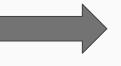
Démarche:

Sitags = 0

Modèle supervisé

Modèle non-supervisé







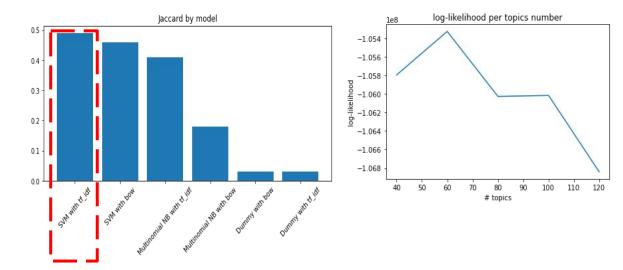
https://stack-overflow-auto-tag.herokuapp.com/

## CONCLUSION









## Dash Heroku

### **PERSPECTIVES**

#### **Perspectives**

- Nettoyage termes spécifiques contexte (ex : X, y). Bruit.
- Accès direct Stack Exchange API pour suggestions plus fines des tendances récentes.
- Utilisation réseaux de neurones.
- Exploration word embedding (word2vec)
- Augmenter le nombre tags conservés.
- n grams

#### MERCI!



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