
IFC-Bank of Italy Workshop on “Data Science in Central Banking: Applications and tools”

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Mailbot – optimising the process of answering statistical queries¹

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¹ This contribution was prepared for the workshop. The views expressed are those of the authors and do not necessarily reflect the views of the Bank of Italy, the BIS, the IFC or the other central banks and institutions represented at the event.



EUROPEAN CENTRAL BANK

EUROSYSTEM

MailBot

Optimizing the process
of answering statistical
queries

15/02/2022, IFS workshop

Daphne Aurouet, Nina Blatnik, Samo Boh, **Andrea Colombo**,
Almir Delic, Jordi Gutiérrez, **Gavril Petrov**, Kristine Rikova



Current process for handling statistical queries



Statistical Information Request

Manually assign responsible team

From	Subject	Received	Categ...
Categories: Media (1 item)			
Rikova... RE: URGENT: Statistical query from the media		Mon 19/10/2020 20:07	Me...
Categories: Follow up (5 items)			
Statisti... FW: [EXT] AW: Input needed: RESC - Real Estate Statistics - Com...		Mon 19/10/2020 21:28	Foll...
Statisti... FW: Input needed: IDCM contributions to growth rate (#4 - 1163...		Mon 19/10/2020 16:40	Foll...

Aspects to improve

1. Slow identification; sometimes wrong BA identified



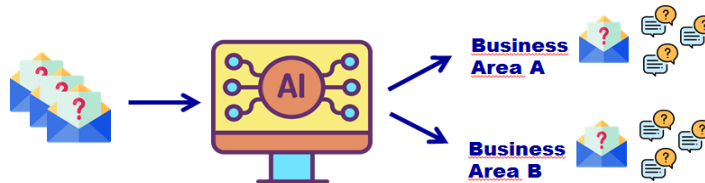
2. Similar queries answered multiple times



3. Manual handling of internal procedures

Solution

1. Classification of BAs
2. Identifying similar queries
3. Automatisatisation of procedures



Picture sources:

<https://www.ranzey.com/>

<https://www.synthesizerguide.com/synthesizers/how-to-choose-a-synthesizer/>

<https://www.flaticon.com>

Knowledge database



Simple structure → Question + Answer + Responsible BA

Text pre-processing and feature extraction

Data preparation

- Assigning IDs
- Parsing of emails – picking up original question and final reply
- Remove confidential information – greetings, signatures
- General string cleaning

NLP preprocessing

- Strip punctuation
- Tokenize
- Remove stopwords / other email vocabulary
- Lemmatizing
- Keep only nouns, pronouns, verb

Classification of BAs

Subject: Average exchange rates

I would like to know the annual average exchange rate for the year 2019, for Canadian dollar to Euros and American dollar to Euros.



92%

ESSA Exchange rates statistics

4%

Monetary statistics

1%

Market Data Provision

XGBoost

Continuous Bag of Words (CBOW) Model

Stochastic Gradient Descent

Extremely randomized trees

BERT

C or R NN

SVM

Enhanced Naïve Bayes



Extremely Randomised trees



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Similarity of queries

Subject: Average exchange rates



I would like to know the annual average exchange rate for the year 2019, for Canadian dollar to Euros and American dollar to Euros.



QUERY:

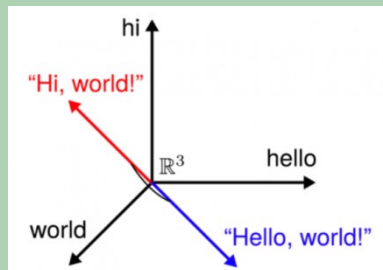
I would like to know the annual average exchange rate for the year 2018, for Canadian \$ to Euros and American \$ to Euros

ANSWER:

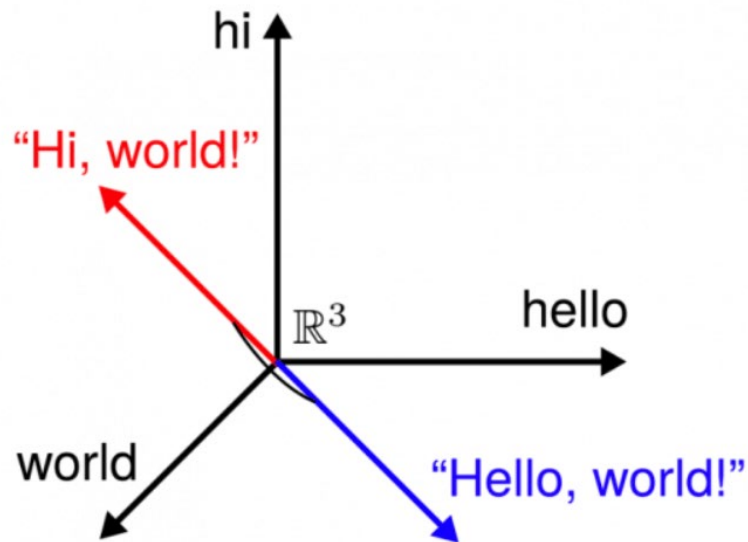
Please find exchange rates data at the following [link](#).



Cosine similarity



Similarity of queries: base model



Cosine Similarity

$$\text{similarity} = \cos(\theta) = \frac{\mathbf{A} \cdot \mathbf{B}}{\|\mathbf{A}\| \|\mathbf{B}\|} = \frac{\sum_{i=1}^n A_i B_i}{\sqrt{\sum_{i=1}^n A_i^2} \sqrt{\sum_{i=1}^n B_i^2}}$$

Source: machinelearningplus.com,
Wikipedia

Application demo