## Information Search System for Versioned Portuguese News Articles about Technology

Information Processing and Retrieval course project

**FEUP** 

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#### Milestone 3

- Revisions to the last milestone
  - Corrected precision-recall curves
- Improvement of dataset
  - Further cleaning of entities data
- Study of weights for the system
- Implementation of synonyms
- Implementation of facets
- Front-end implementation

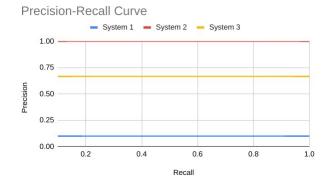
#### Revisions to the last milestone

- Recalls were being calculated incorrectly.
- As a result, the graphics were incorrect.
- Conclusions drawn from graphics analysis were revised.

#### 'aterragem em Marte' query

## Precision-Recall Curve System 1 System 2 System 3 1.00 0.75 0.50 0.25 0.00 0.2 0.4 0.6 0.8 1.0 Recall

#### 'Microsoft Teams' query



## Improvement of dataset

- Our dataset is imbalanced, most of our news are from 1 website.
- Some websites are not properly indexed by "Arquivo.pt".
- Some websites have no difference in URLs between tech news and other news.
- We found a possible addition to our dataset "tek.sapo.pt".
  - All the available websites are Wireframes, which meant we couldn't get the news from it.
- With no increase in the number of documents, we only fixed some errors we found as we were working.

## Weights

- System 1: High importance to the title of the news
  - o qf: article.title^10 article.entities.title article.text article.summary
- System 2: High importance to the entities in the text
  - o article.title article.entities.title 10 article.text article.summary
- System 3: Overall importance
  - o article.title^5 article.entities.title^5 article.text article.summary^3

### **Microsoft Teams**

System 1:

k	1	2	3	4	5	6	7	8	9	10
Relevant	R	R	R	R	R	R	N	N	N	N
P@k	1	1	1	1	1	1	0.86	0.75	0.67	0.6
R@k	0.17	0.33	0.5	0.67	0.83	1	1	1	1	1

System 2:

k	1	2	3	4	5	6	7	8	9	10
Relevant	N	N	R	N	N	N	N	N	N	N
P@k	0	0	0.33	0.25	0.2	0.17	0.14	0.13	0.11	0.1
R@k	0	0	1	1	1	1	1	1	1	1

System 3:

k	1	2	3	4	5	6	7	8	9	10
Relevant	N	R	R	R	R	R	R	N	N	R
P@k	0	0.5	0.67	0.75	0.8	0.83	0.86	0.75	0.67	0.7
R@k	0	0.14	0.29	0.43	0.57	0.71	0.86	0.86	0.86	1

### Prémio Nobel

System 1:

k	1	2	3	4	5	6	7	8	9	10
Relevant	N	R	R	R	R	R	R	R	N	N
P@k	0	0.5	0.67	0.75	0.8	0.83	0.86	0.88	0.78	0.7
R@k	0	0.14	0.29	0.43	0.57	0.71	0.86	1	1	1

System 2:

k	1	2	3	4	5	6	7	8	9	10
Relevant	N	N	R	N	N	N	N	N	N	R
P@k	0	0	0.33	0.25	0.2	0.17	0.14	0.13	0.11	0.2
R@k	0	0	0.5	0.5	0.5	0.5	0.5	0.5	0.5	1

System 3:

k	1	2	3	4	5	6	7	8	9	10
Relevant	N	R	R	R	R	R	R	N	N	R
P@k	0	0.5	0.67	0.75	0.8	0.83	0.86	0.75	0.67	0.7
R@k	0	0.14	0.29	0.43	0.57	0.71	0.86	0.86	0.86	1

#### Precision-Recall curves

0.8

1.0

#### **Microsoft Teams**

# Precision-Recall Curve Title Entities Overall 1.00 0.75 50 0.25 0.00

0.6

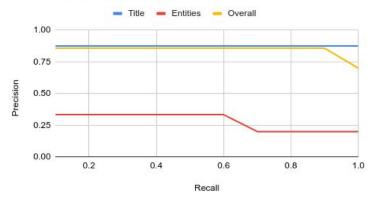
Recall

0.4

0.2

#### Prémio Nobel





## **Synonyms**

- We wanted a more robust system that would search for documents with synonyms of the words we used on the query.
- Since our dataset is focused in news related to technologies, our synonyms list has terms associated with technology:
  - TV, televisão, ecrã, plasma
  - App, aplicação, software
  - o aterrar, chegar, pousar
- In Solr we used **solr.SynonymGraphFilterFactory** filter with a synonyms file.

## **App Televisão**

Without synonyms:

k	1	2	3	4	5	6	7	8	9	10
Relevant	R	R	R	R	N	N	N	N	N	N
P@k	1	1	1	1	0.8	0.67	0.57	0.5	0.44	0.4
R@k	0.25	0.5	0.75	1	1	1	1	1	1	1

With synonyms:

k	1	2	3	4	5	6	7	8	9	10
Relevant	R	N	R	R	N	N	R	R	N	N
P@k	1	0.5	0.67	0.75	0.6	0.5	0.57	0.63	0.56	0.5
R@k	0.2	0.2	0.4	0.6	0.6	0.6	0.8	1	1	1

## Aterragem em Marte

Without synonyms:

k	1	2	3	4	5	6	7	8	9	10
Relevant	R	R	R	R	N	N	N	N	N	N
P@k	1	1	1	1	0.8	0.67	0.57	0.5	0.44	0.4
R@k	0.25	0.5	0.75	1	1	1	1	1	1	1

With synonyms:

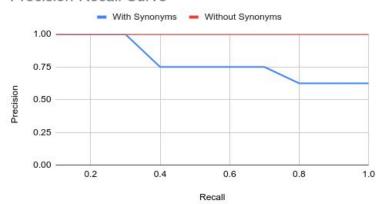
k	1	2	3	4	5	6	7	8	9	10
Relevant	R	R	R	R	R	R	N	R	R	R
P@k	1	1	1	1	1	1	0.86	0.88	0.89	0.9
R@k	0.11	0.22	0.33	0.44	0.56	0.67	0.67	0.78	0.89	1



#### **Precision-Recall Curves**

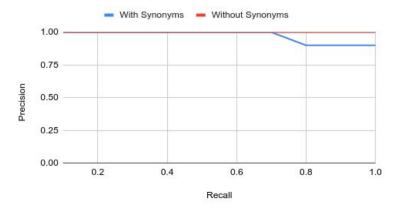
#### App Televisão:

#### Precision-Recall Curve



#### Aterragem em Marte:

#### Precision-Recall Curve



#### **Facets**

- To allow the end user to filter the results provided by the search system, the facets utility provided by solr was used.
- With 'facet=true' the query returns the number of documents that are categorized in each of the facet values.
- Facets introduced:
  - o Article entities' title
  - Article authors
  - Newspaper

#### **Facets**

- Since the *PortugueseStemFilterFactory* is being applied, the facet results were, at first, not the expected ones.
- The KeywordRepeatFilterFactory was added as documentation states:
  - 'If placed before a stemmer, the result will be that you will get the unstemmed token preserved on the same position as the stemmed one.'
- Even though the obtained results were better, they were not the intended ones.
- Final solution was to duplicate the fields and store them as strings.

#### **Frontend**

#### **Portuguese Tech News Explorer**

Authors  Exame Informática (701)  Hugo Séneca (343)  Paulo Matos (140)  Rui da Rocha Ferreira (127)  Márcio Florindo (104)	Entities  Google (2404) □  Android (775) □  Bennu (534) □  UA (424) □  Pedro Barroca (416) □	Newspapers exameinformatica (3016) □ noticiasaominuto (54) □ jornaldenegocios (3) □
Hugo Séneca (343) □ Paulo Matos (140) □ Rui da Rocha Ferreira (127) □	Android (775) □ Bennu (534) □ UA (424) □	noticiasaominuto (54) 🗆
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Rui da Rocha Ferreira (127) 🗆	UA (424) 🗆	jornaldenegocios (3) □
Márcio Florindo (104) □	Pedro Barroca (416)	
	redio Balloca (410)	
Google Iança Google Instant Google Instant Google Instant Google Instant Google	novo serviço de pesquisas instantâneas, que nos	apresenta resultados à medida que vamo
	lo a Google	

## **Future Improvements**

- Improve frontend for a better experience allow navigating between different same-article versions.
- Search results ranking based on user behaviour.