

# NLP and LLMs for Regulatory Reporting Obligations

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### Introduction

- Large corpus of regulatory texts from European Commission are Difficult to read and interpret.
- Especially, Reporting Obligations, are one type of regulations that are crucial for many organization.
- Failure to comply the result in subsequent fines.
- In this work, we present a framework for transforming regulatory texts in reporting obligations into into structured format which enable to find out who was a reporter, to report what, to whom and by when.
- We proposed 2 approaches to extract addresser, addressee, action result, reported verb.

#### **Dataset**

- Eur-lex: https://eur-lex.europa.eu/homepage.html
- Language: EnglishSize: 5000 texts



Figure 1. Dataset Source: Eur-Lex

# **Learning Reporting Verbs**

- 1. Unsupervised using Word2Vec language model.
- 2. Cosine similarity for word vector distances

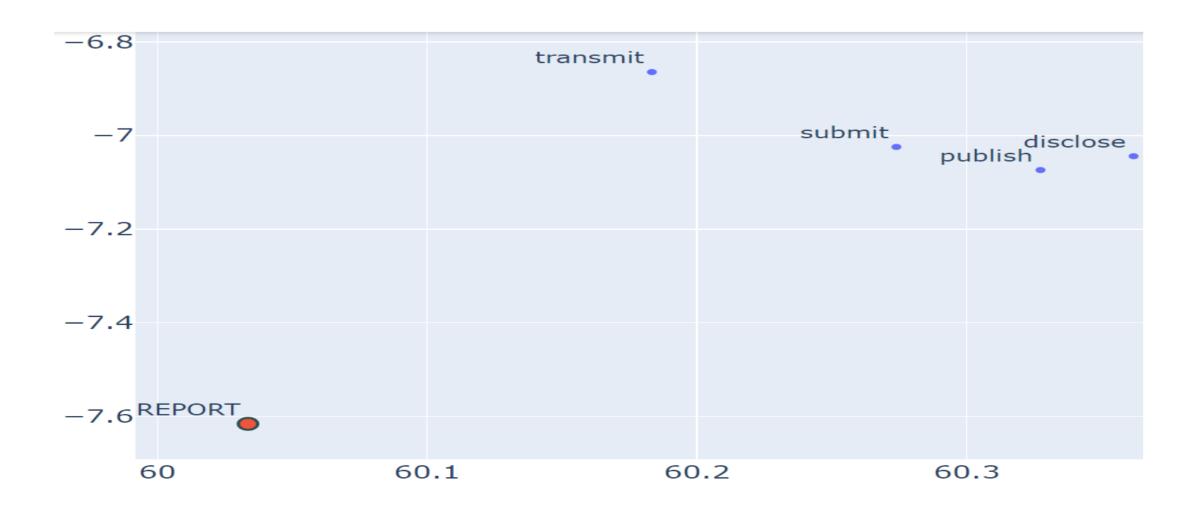


Figure 2. Word Vectors

## **Extracting Concepts based on Syntactic Structure**

- 1. Generate syntactic tree using dependency parser
- 2. Parse tree to locate concepts based on syntactic roles
- nsubj:addresser
- dobj: addressee
- pobj: action result
- pobj: date
- Handle conjunction, passive forms
- 3. Extract concepts

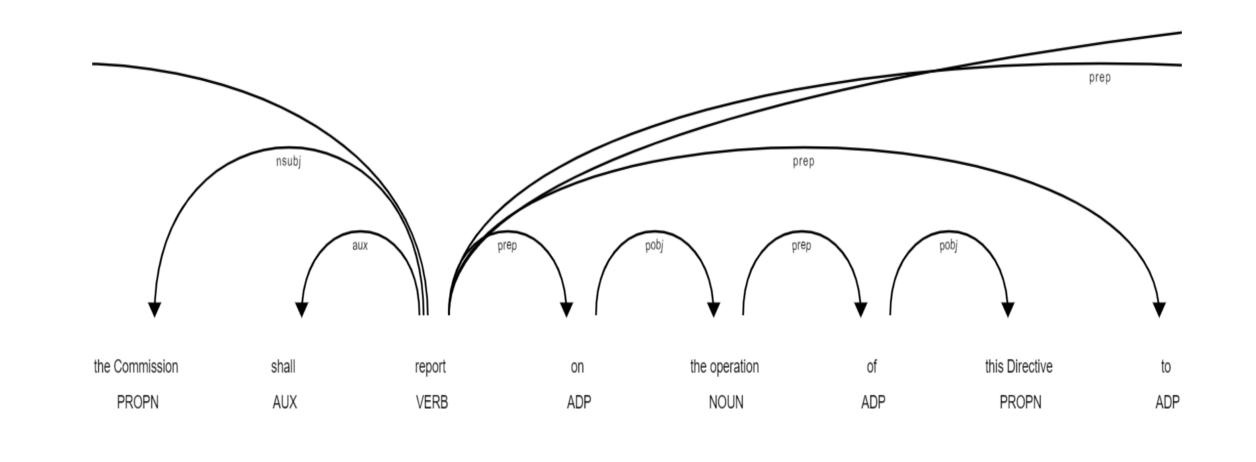


Figure 3. Syntactic Dependencies

By 5 September 2010, the Commission shall report on the operation of this Directive to the European Parliament and the Council, including on its impact on small and medium-sized issuers and on the application of sanctions, in particular whether ...

Figure 4. Extracted Concepts

# **Extracting Concepts using LLM**

- 1. Model: Llama3-8B-Instruct
- 2. Design Specific Prompting
- 3. Use few shot prompting



Figure 5. Llama LLM

# **LLM Prompts and Results**

## Sample prompts:

- LLM prompted to act as a Compliance Office
- Provided with a handful of examples for learning (few-shot)

You are a virtual annotation. For each sentence, you annotate the addresser, addressee, actionResult, date. Here are some samples:

sentence: EU commission will report the result to the each member.

addresser: eu commission

Action: report

ActionResult: the result

addressee: the\_each\_member

Date: None

sentence: By 31 December 2010 and, thereafter, at least every three years, the Commission shall review the provisions concerning its implementing powers and present a report to the European Parliament and to the Council ...

addresser: the commission

Action: present

ActionResult: a report on the functioning of those powers

addressee: the\_european\_parliament, the\_council

Date: By 31 December 2010

Figure 6. Example Prompts

### Sample results:

Concepts automatically detected by LLMs

### assistant

Here are the annotations:

sentence: The Commission shall, no later than 5 September 2010, submit a report to the European Parliament and to the Council on the ...

addresser: the Commission

Action: submit

ActionResult: a report

addressee: the\_european\_parliament, the\_council

Date: no later than 5 September 2010

sentence: The result will be reported by EU Commission to the each member.

addresser: EU Commission

Action: report

ActionResult: the result

addressee: the\_each\_member

Date: None

Figure 7. Results