

# NLP for RE

## Introduction of RE and NLP

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Electrical and Software Engineering; \*Biomedical Engineering

# Tutorial outline

A. Introduction of RE  
and NLP (not  
interactive) (25 mins)

B. Data gathering  
(interactive)(1hr)

C. Pre-processing using  
NLP operations for a  
dataset from Bugzilla  
(interactive) (1hr)

D. Modeling and  
evaluation (interactive)  
(30 mins)

# Intros



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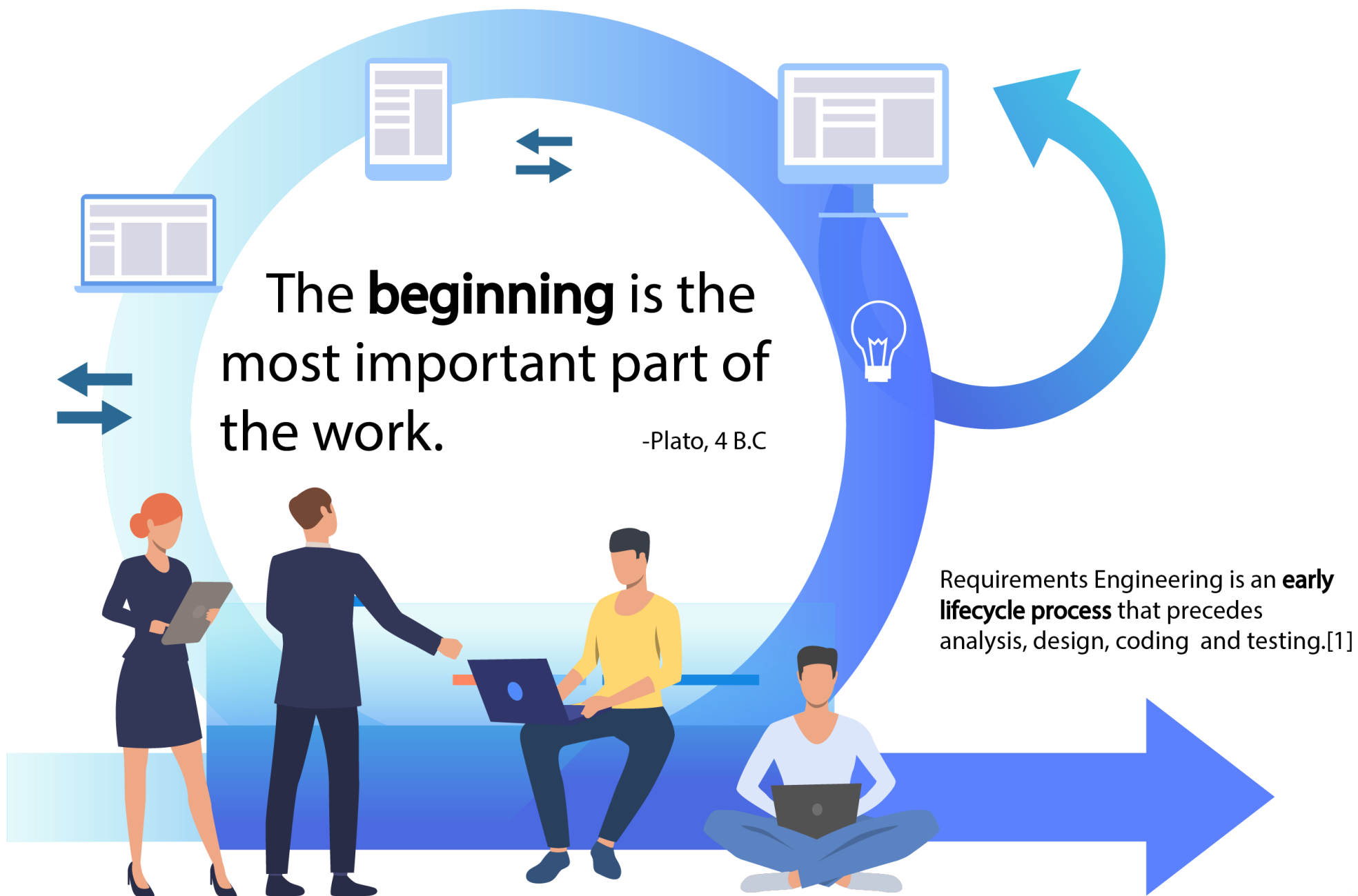
# Learning Goals

Introduction to  
RE

Introduction to  
NLP

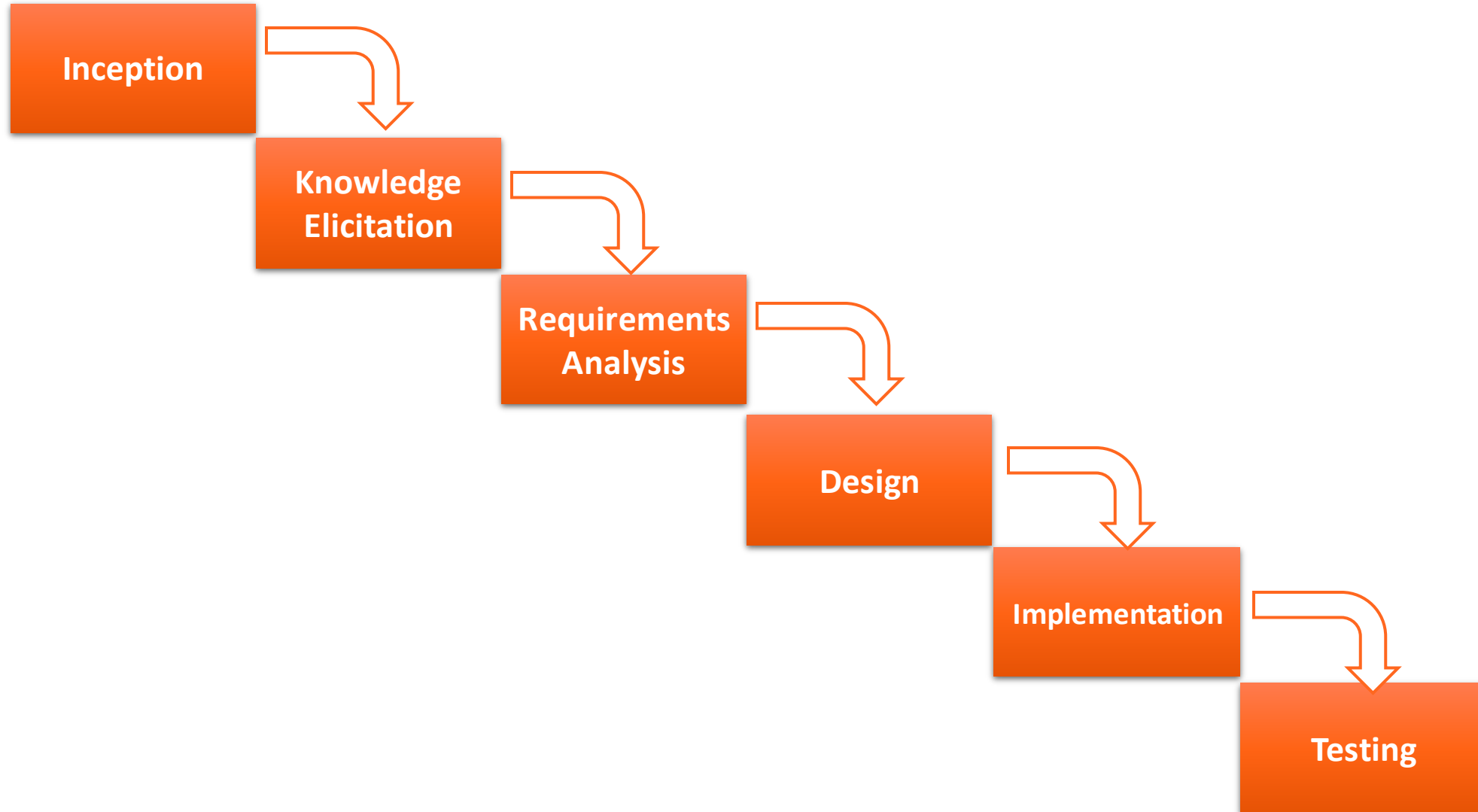
# Introduction of RE





# Brief Introduction to Software Development Process

- A simplified Linear model of software development process:



# Software requirements Specification



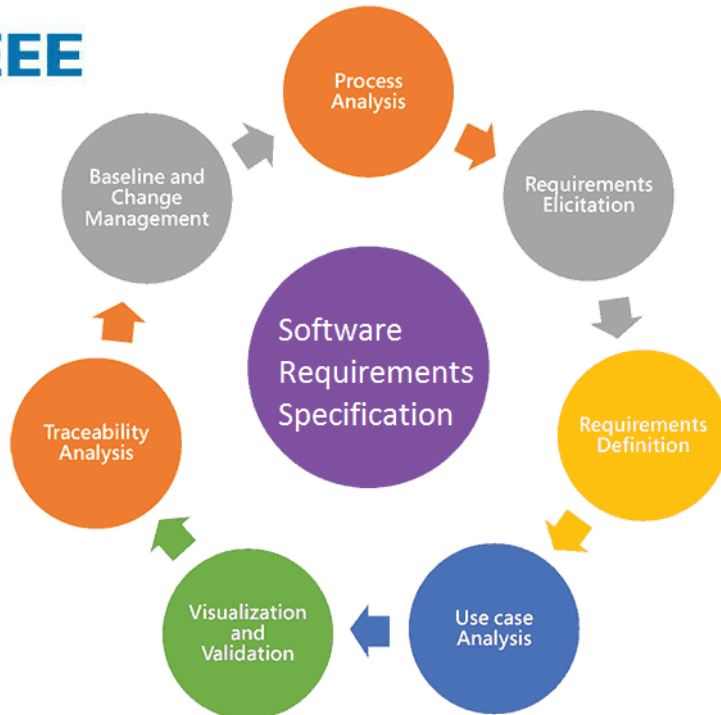
**Introduction:** For Software product and defined by the customer



**Overall Description:** Functions, Users, Constraints, etc.












**Overall Description:** Functional, non-functional, interfaces, etc.





# Requirements Elicitation Techniques

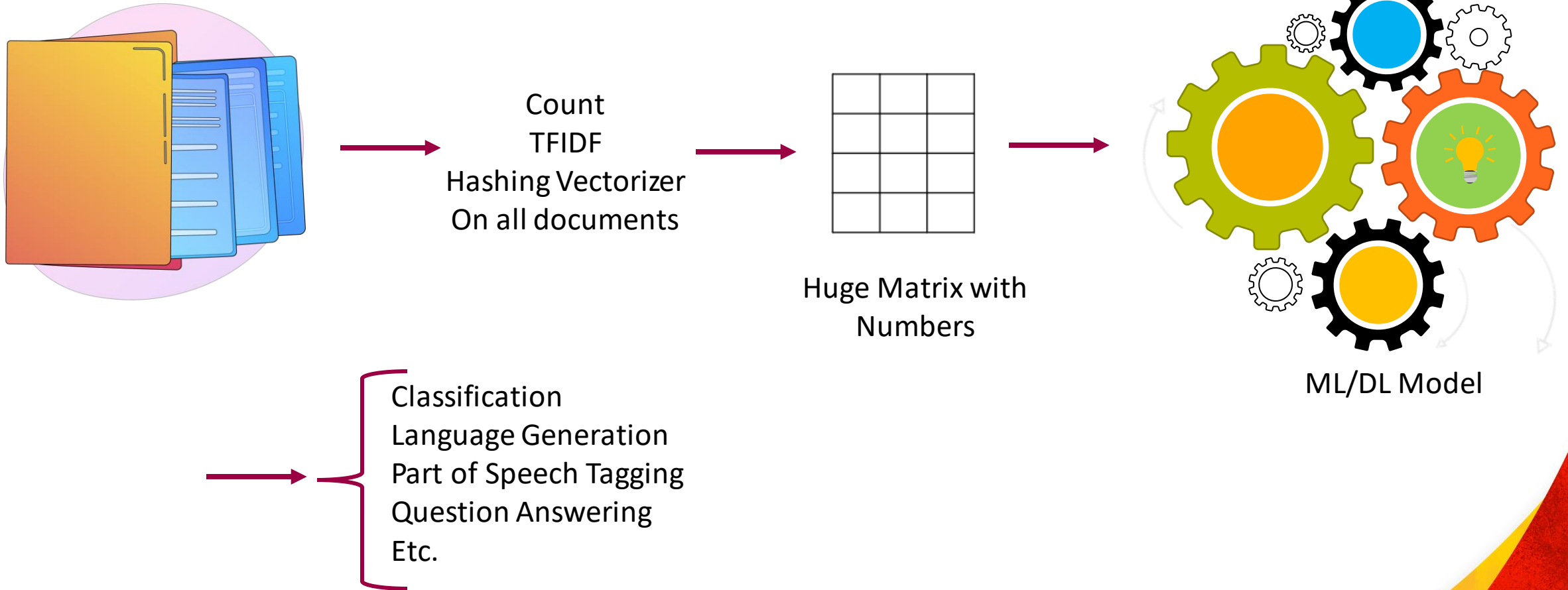


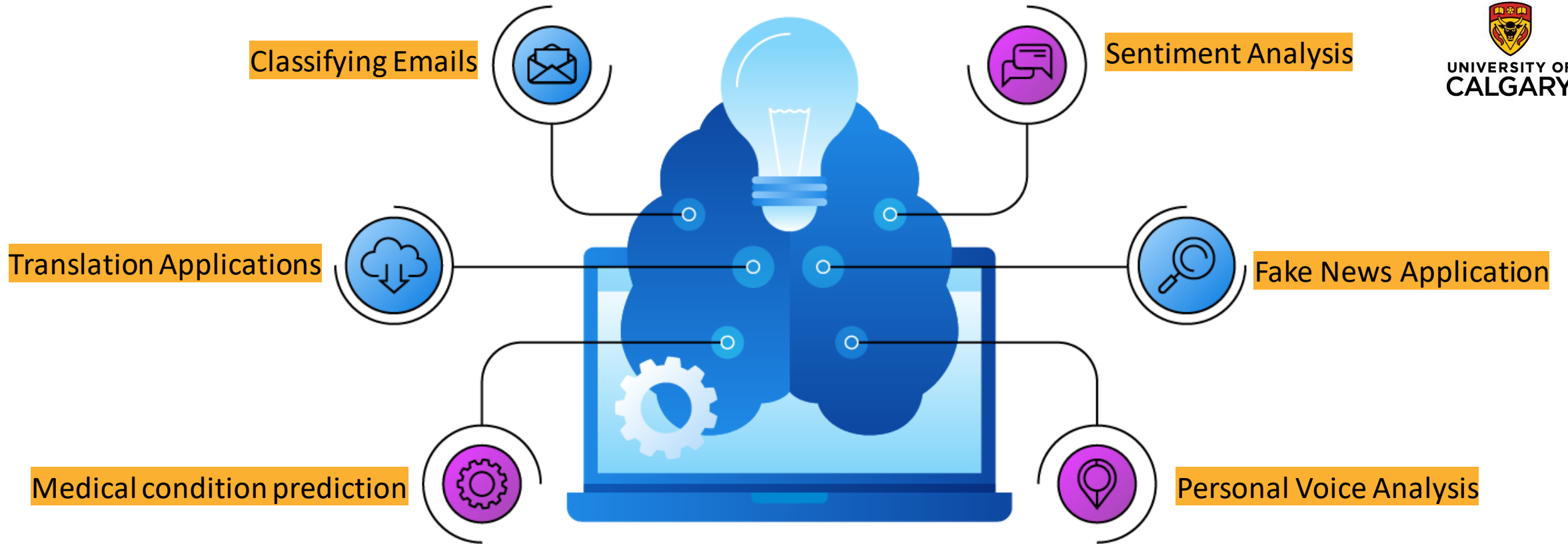
-  Brain Storming
-  Document Analysis
-  Focus Group
-  Interface Analysis
-  Interviews
-  Observation
-  Process Modeling
-  Prototype
-  Workshops
-  Surveys/Questionnaire



# Introduction to NLP

# NLP and Machine learning





## Natural Language Processing (NLP)

**NLP** is a subfield of **artificial intelligence** that deals with the link between computers and human language. **NLP** involves programming computers to process and analyze a massive amount of **natural language data**.



# What are Some Applications of NLP in the Industry?

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- Search engines
- Advanced text editors: Such as Grammarly.com
- Computational advertising
- Fraud detection
- Sentiment analysis
- Opinion mining
- Text summarization
- Context analysis





# Example Papers

SN Computer Science (2021) 2:69  
https://doi.org/10.1007/s42979-020-00427-1

ORIGINAL RESEARCH



## Sentence Embedding Models for Similarity Detection of Software Requirements

Souvick Das<sup>1</sup> · Novaran Deb<sup>2</sup> · Agostino Cortesi<sup>3</sup> · Nabendu Chaki<sup>4</sup>

Received: 11 August 2020 / Accepted: 11 December 2020 / Published online: 2 February 2021  
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### Abstract

Semantic similarity detection mainly relies on the availability of laboriously curated ontologies, as well as of supervised and unsupervised neural embedding models. In this paper, we present two domain-specific sentence embedding models trained on a natural language requirements dataset in order to derive sentence embeddings specific to the software requirements

## From Bag-of-Words to Pre-trained Neural Language Models: Improving Automatic Classification of App Reviews for Requirements Engineering

Adailton F. Araujo, Marcos P. S. Gôlo, Breno M. F. Viana,  
Felipe P. Sanches, Roseli A. F. Romero, Ricardo M. Marcacini

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**Abstract.** Popular mobile applications receive millions of user reviews. These reviews contain relevant information, such as problem reports and improvement suggestions. The review information is a valuable knowledge source for software

## RE-BERT: Automatic Extraction of Software Requirements from App Reviews using BERT Language Model

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### ABSTRACT

Traditionally, developers restricted themselves to collecting opinions from a small group of users by using techniques such as interviews, questionnaires, and meetings. With the popularization of social media and mobile applications, these professionals have to deal with crowd users' opinions, who want to voice the software's evolution. In this context, one of the main related tasks is the automatic identification of software requirements from app

### 1 INTRODUCTION

Extracting useful knowledge from web and social media has become a new trend in Software Requirements Engineering (SRE) [5, 12, 14]. Traditionally, developers restricted themselves to collecting opinions from a small group of users by using techniques such as interviews, questionnaires, and meetings. With the popularization of social media and mobile applications, these professionals have to deal with crowd users' opinions, who want to voice the evolution

## NoRBERT: Transfer Learning for Requirements Classification

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Institute for Program Structures and Data Organization  
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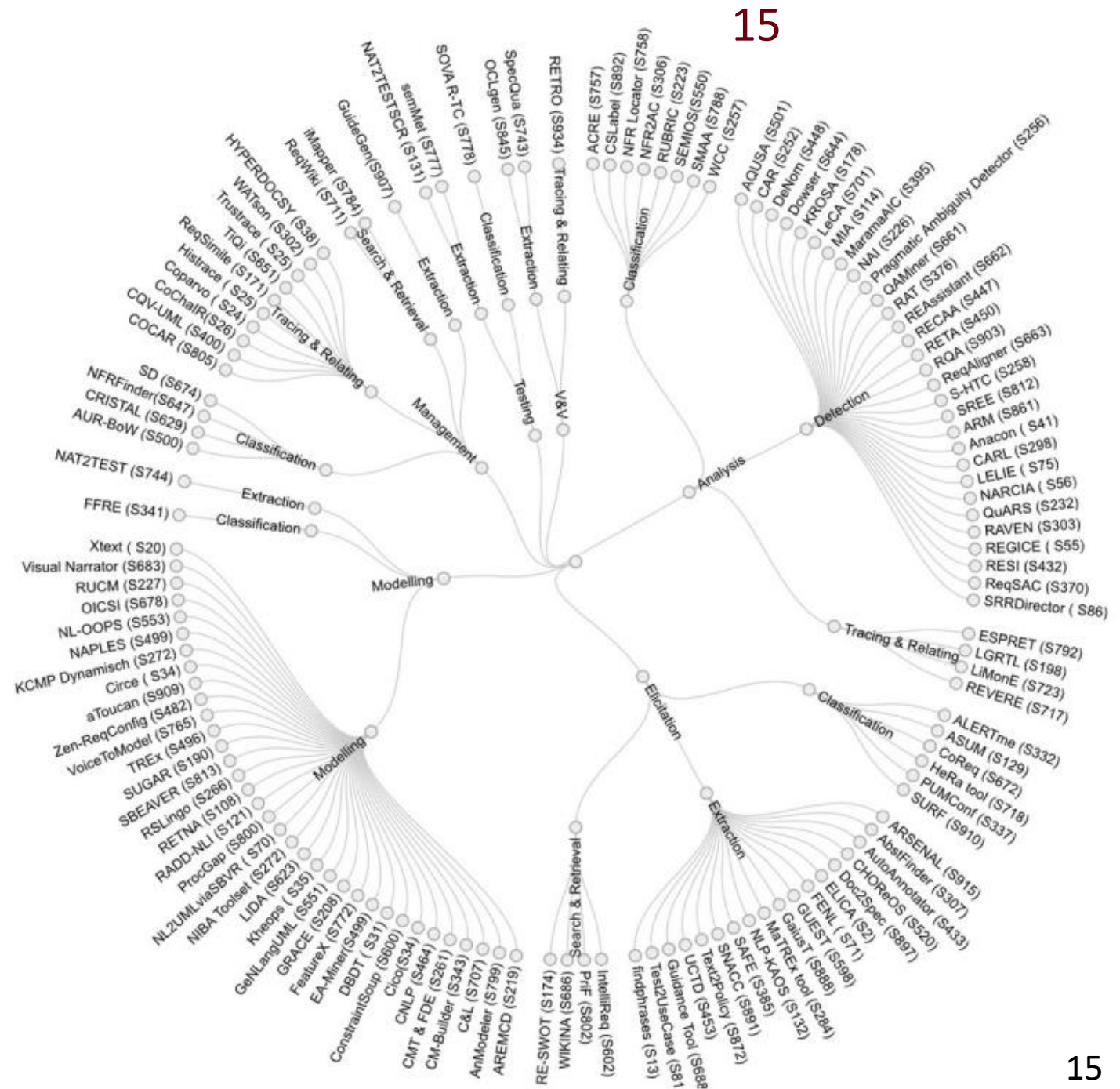
**Abstract.**—Classifying requirements is crucial for automatically handling natural language requirements. The performance of existing automatic classification approaches diminishes when applied to unseen projects because requirements usually vary in wording and style. The main problem is poor generalization. We propose NoRBERT that fine-tunes BERT, a language model that

on the project and authors. Without transferability to unseen projects, current approaches are not applicable in practice. One would need a suitable training set for each project, which is usually infeasible. To overcome this challenge, we investigate how transfer learning approaches perform on the task of

# Applications of NLP in RE

# NLP for RE Tools

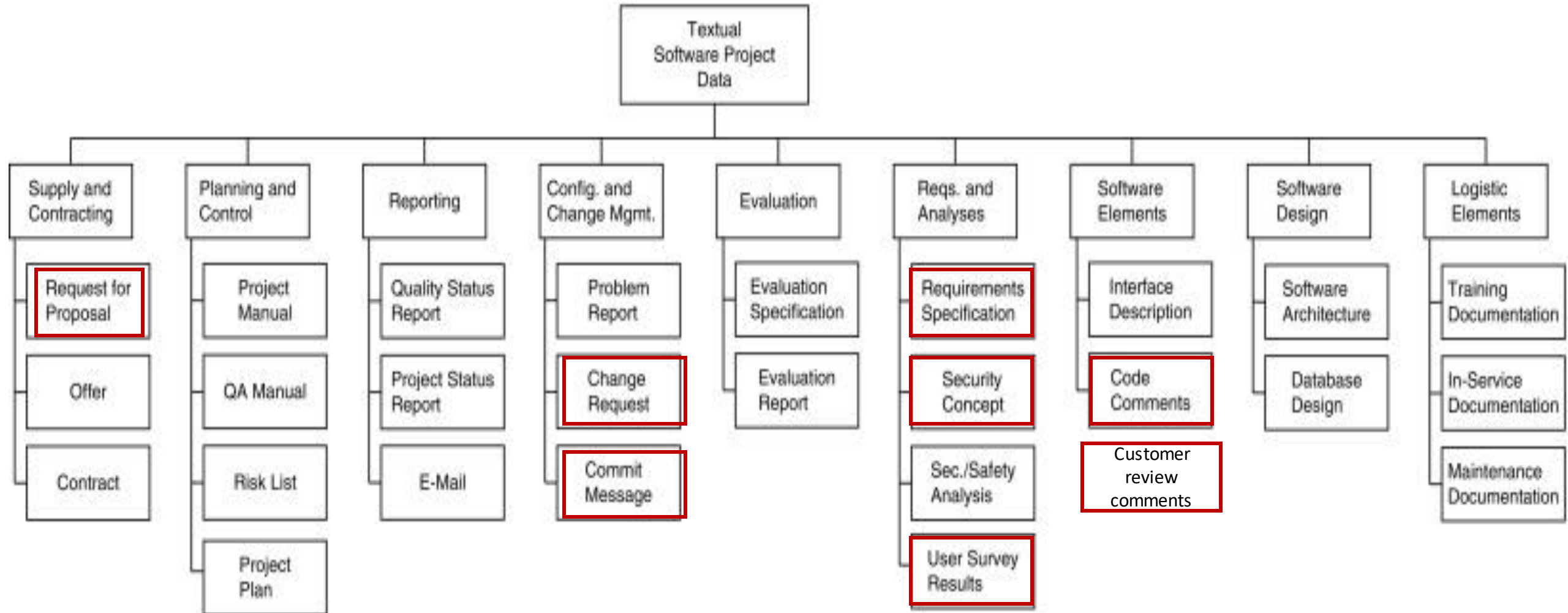
Zhao, Liping, et al. "Natural language processing (NLP) for requirements engineering: A systematic mapping study." *arXiv preprint arXiv:2004.01099* (2020).



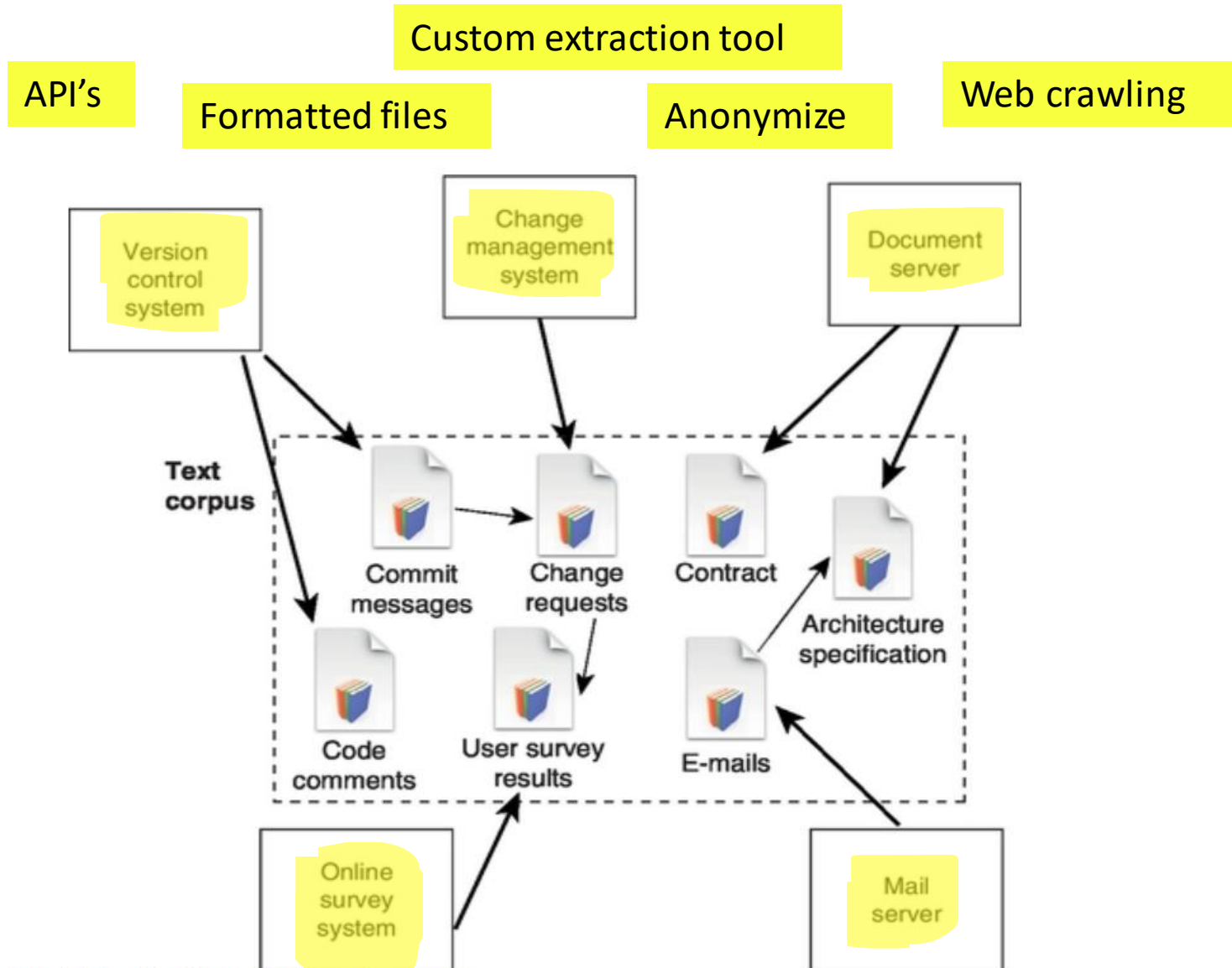


Software  
Projects are  
Textual in  
Nature

# Textual Data in Software Projects



# Textual Software Project Data and Retrieval



3.2 Text collection from different sources.



# Importance of NLP in Software Engineering

- Text Retrieval (TR) and NLP in software is one of the fastest growing areas of research in SE. [2]
- Exposing the SE community to these techniques and their applications in SE would help to fill a gap in their current background and allow them to immediately use TR and NLP to advance their research.
- In particular, for TR, approaches such as Vector Space Model, Latent Semantic Analysis, Latent Dirichlet Association, Language Models will be covered. NLP techniques covered will include part-of-speech tagging, stemming, stopwords elimination, semantics analysis, sentiment analysis, etc.

# References

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- Juergens, Elmar, et al. "Do code clones matter?." 2009 IEEE 31st International Conference on Software Engineering. IEEE, 2009.
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- <https://medium.com/square-corner-blog/topic-modeling-optimizing-for-human-interpretability-48a81f6ce0ed>
- Reference to a few pictures designed by :vectorjuice / Freepik, pch.vector / Freepik, Omnibus-Type / Freepik, katemangostar / Freepik

# SURVEY

<https://forms.gle/TuVVuAkf4JWHFDp17>

