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Development & evaluation of a NER model
for recognition of important study
characteristics

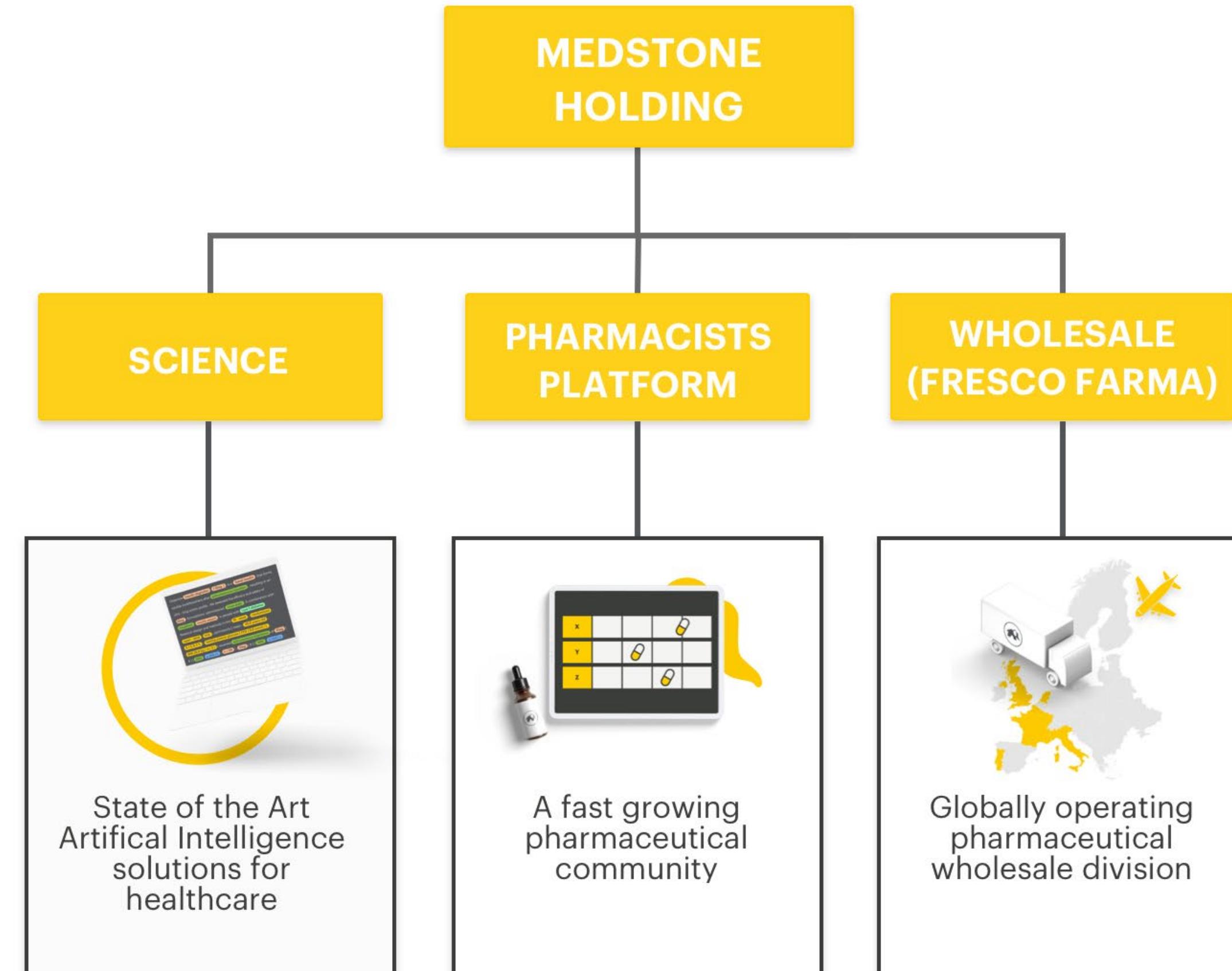
SURUS

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Company Structure





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SURUS assists systematic reviewers with screening literature

Systematic Literature Review (SLR)

- Crucial in clinical decision making
- Selection of the complete scientific body of evidence
- Highly laborious, manually performed by experts

Literature selection

- Literature is selected based on descriptive characteristics: “PICOS”
- PICOS determine relevance of scientific study to reviewers’ research question
- SURUS automatically extracts PICOS elements

P

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Patients with Type 2 Diabetes



I

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Insulin degludec once daily



C

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Insulin glargine once daily



O

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Fasting plasma glucose



S

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Randomized controlled trial



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SLR & PICOS



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Annotation strategy is designed for extraction of PICOS elements

Annotation for Named Entity Recognition (NER)

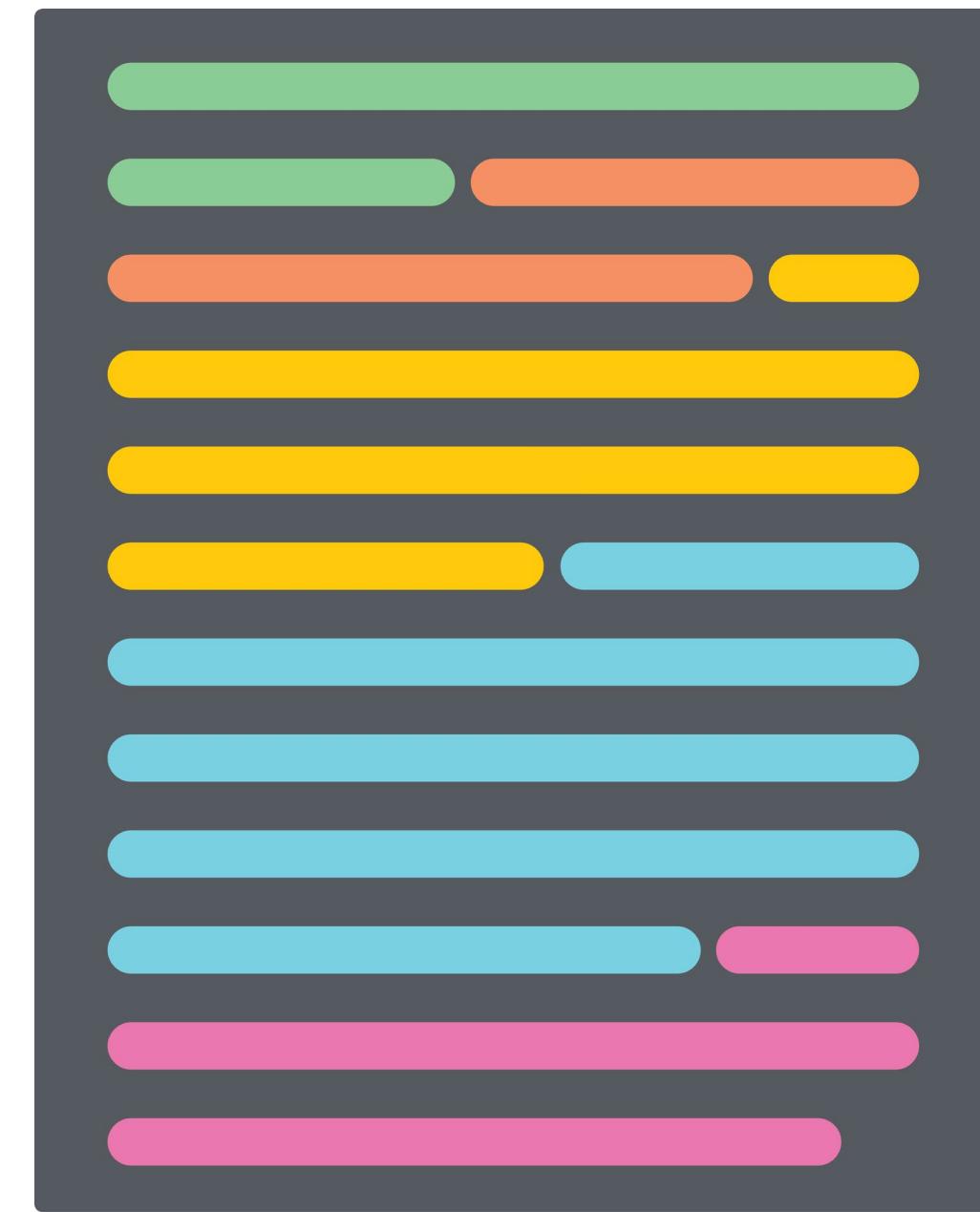
- 26 annotation subcategories
- Annotated by experts in the field
- Inter annotator agreement of 0.78

Annotation for segment prediction

- Automatically labelled based on author segmentation

In this **16 - week** , **randomized** , **open - label** **trial** , participants (mean : **45.8 years old** , **A1C 8.4 %** , **fasting plasma glucose [FPG] 9.9 mmol / L** , **BMI 26.9 kg / m (2)**) received **subcutaneous injections** of **IDeg (A) (600 μ mol / L ; n = 59)** , **IDeg (B) (900 μ mol / L ; n = 60)** , or **insulin glargine (IGLar ; n = 59)**

Annotations for the NER prediction model





Corpus of annotated PubMed abstracts

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Dataset for NER

- 850 scientific abstracts (80:10:10 split)
- 7 major disease categories
- 80,908 manual annotations

Dataset for NER

- 10,000 scientific abstracts (80:20 split)

NER category	# subcategories	PICOS relevance	# annotations
Drug	6	Intervention (I), Comparison (C)	19,620
Methodology	7	Population (P), Outcome (O), Study design (S)	15,251
Parameter	3	Outcome (O)	8247
Result	6		27,878
Therapy	2	Intervention (I), Comparison (C)	6839
Identifier	1		710
Disease	1	Population (P)	2363



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SURUS consists of 2 separate, but complementary, BERT models

Two separate BERT models

- Sliding-window approach
- Evaluation of BERT and BioBERT

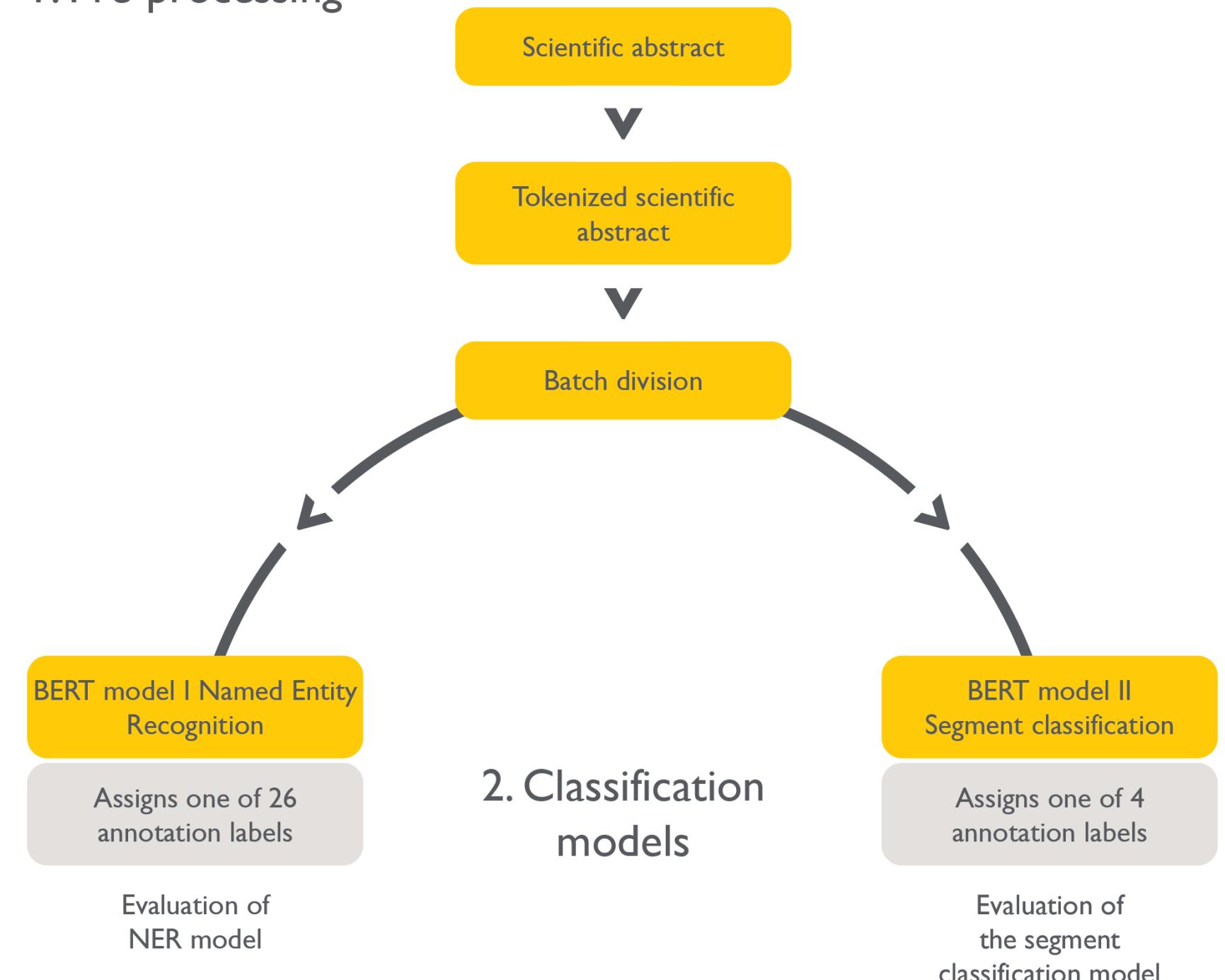
NER model

- Prediction of BILUO and NE labels
- BILU labels used for quality measurement

Segmentation model

- Predicts location of tokens in abstract
- Introduction, Methods, Results or Conclusion
- Rule-based separation of Aims and Introduction

I. Pre-processing



2. Classification models



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Segment: feature incorporation approach

Incorporation of segment ID in NER prediction

- Addition of segment label as a feature (Introduction, Aims, Methods, Results, Conclusion)

Scientific abstract



BERT model II
Segment classification

Assigns one of 4
annotation labels



Segmented
scientific abstract



BERT model I Named Entity
Recognition

Assigns one of 26
annotation labels



Evaluation of Named Entity
Recognition model

The SURUS model



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SURUS performs well and consistently at NER

NER model

- Overall F1 of >0.94 (BioBERT)
- BioBERT improves performance over BERT

Segmentation model

- Accurate prediction of interventional study headers

Combination of models

- Adding a segment feature to NER training does not improve model quality



SURUS is a practical tool for SLR

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Conclusion and SURUS application

- Reliable recognition of most PICOS elements
- Potential to speed up the SLR screening process

SURUS test case

- Selection of relevant abstracts
- Based on completed Cochrane review
- NE label-based filters

Test case results

- 89.4% of irrelevant articles excluded
- No exclusion of relevant articles

Search terms	NE categories
	Disease, Methodology
	Drug
	Methodology Parameter
	Methodology