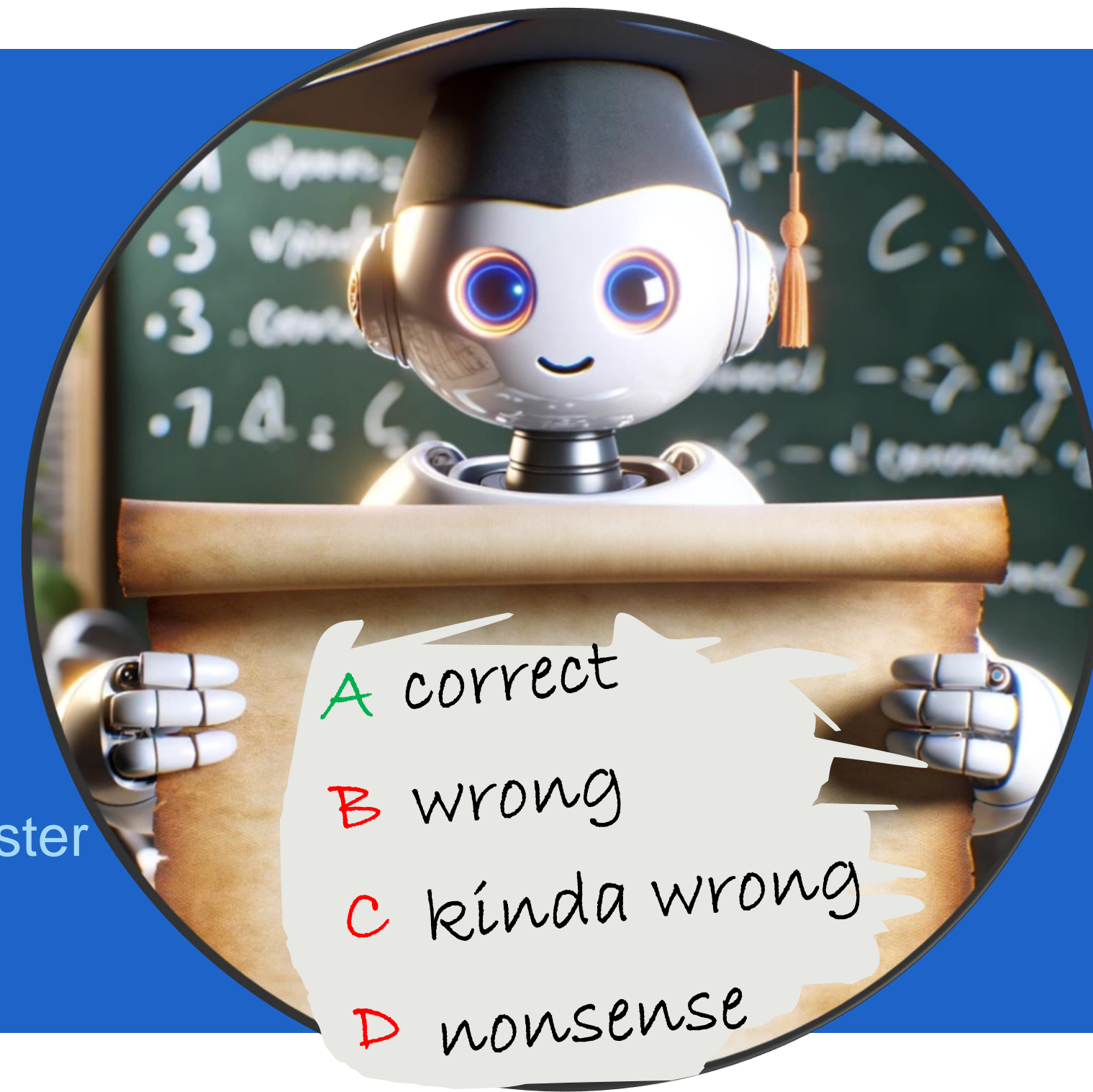


# Language Model Adaptation with Applications in AI for Education

Ph.D. candidate: Semere Kiros Bitew

Promotors: prof. Chris Develder, prof. Thomas Demeester

March 08th, 2024



# Outline

- AI in Education
- Research Motivation
- Language Modeling
- Research Contributions
  - Distractor generation task
  - Gap-filling grammar exercise generation
- Conclusion

# Let's do a quick poll: Personal Trivia

# Let's do a quick poll: Personal Trivia

What is my last name?

- A Kiros
- B Bitew
- C Kiros Bitew
- D Semere

# Let's do a quick poll: Personal Trivia

What is my last name?

- A Kiros
- B Bitew
- C Kiros Bitew
- D Semere

What is my last name?

- A Smith
- B Bitew
- C Apple
- D BMW

# Let's do a quick poll: Personal Trivia

What is my last name?

- A Kiros
- B Bitew**
- C Kiros Bitew
- D Semere

What is my last name?

- A Smith
- B Bitew**
- C Apple
- D BMW

# Let's do a quick poll: Personal Trivia

Where am I originally from?

- A Mekelle
- B The moon
- C Pirate ship
- D Mars

Where am I originally from?

- A Mekelle
- B Axum
- C Addis Ababa
- D Nairobi

# Let's do a quick poll: Personal Trivia

Where am I originally from?

- A Mekelle
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Where am I originally from?

- A Mekelle
- B Axum
- C Addis Ababa
- D Nairobi



# Let's do a quick poll: Personal Trivia

What year was I born?

- A 1776
- B 1892
- C 2050
- D 1992

What year was I born?

- A 1984
- B 1989
- C 1995
- D 1992

# Let's do a quick poll: Personal Trivia

What year was I born?

- A 1776
- B 1892
- C 2050
- D 1992

What year was I born?

- A 1984
- B 1989
- C 1995
- D 1992

# Let's do a quick poll: Personal Trivia

My last name is **Bitew**, born in **1992**, and I am from **Mekelle**!

# Introduction to AI in Education

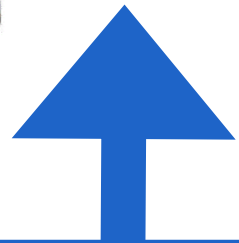
# AI in Education

Support for **teaching**, **learning**, and **school administration**.

# AI in Education

AI in Education

# AI in Education

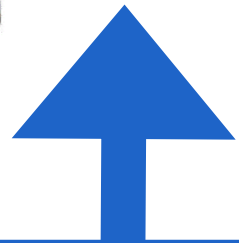


AI in Education

# AI in Education

## Examples

- FAQ Chatbot
- Essay Scoring



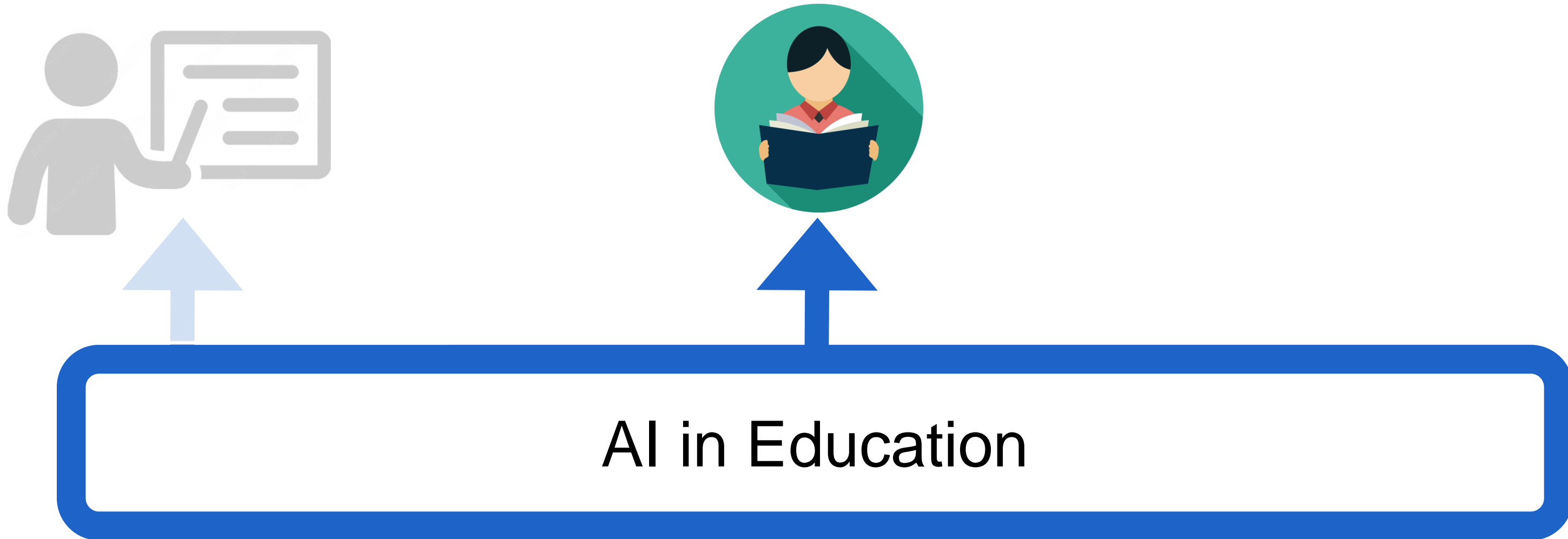
AI in Education



# AI in Education

## Examples

- FAQ Chatbot
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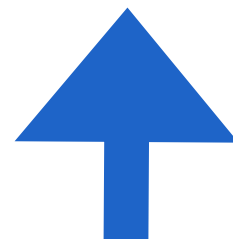
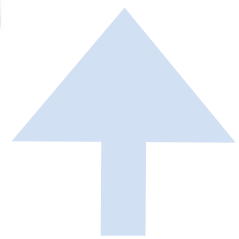
# AI in Education

## Examples

- FAQ Chatbot
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- **duolingo**
- Formative assessment



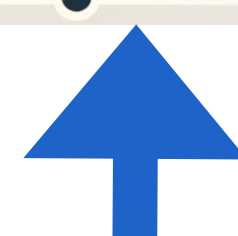
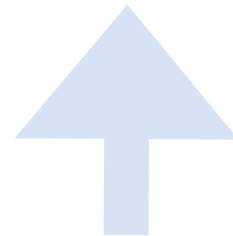
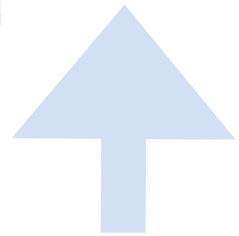
AI in Education

# AI in Education

## Examples

- FAQ Chatbot
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-   
**duolingo**
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AI in Education

# AI in Education

## Examples

- FAQ Chatbot
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-   
duolingo
- Formative assessment

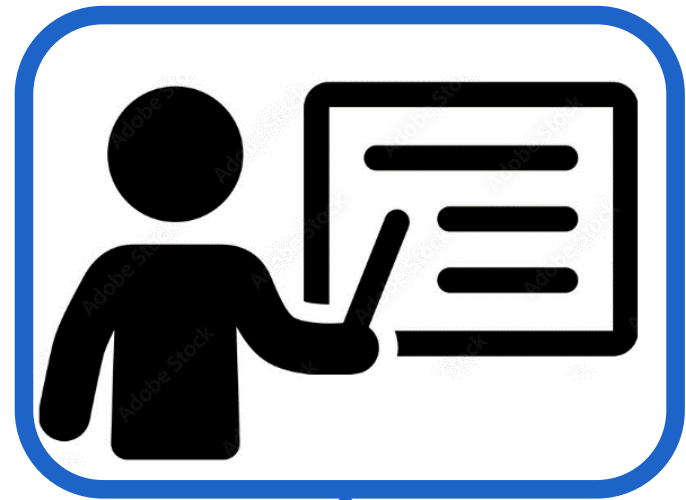
- Resource allocation



AI in Education

# AI in Education

Focus of my research

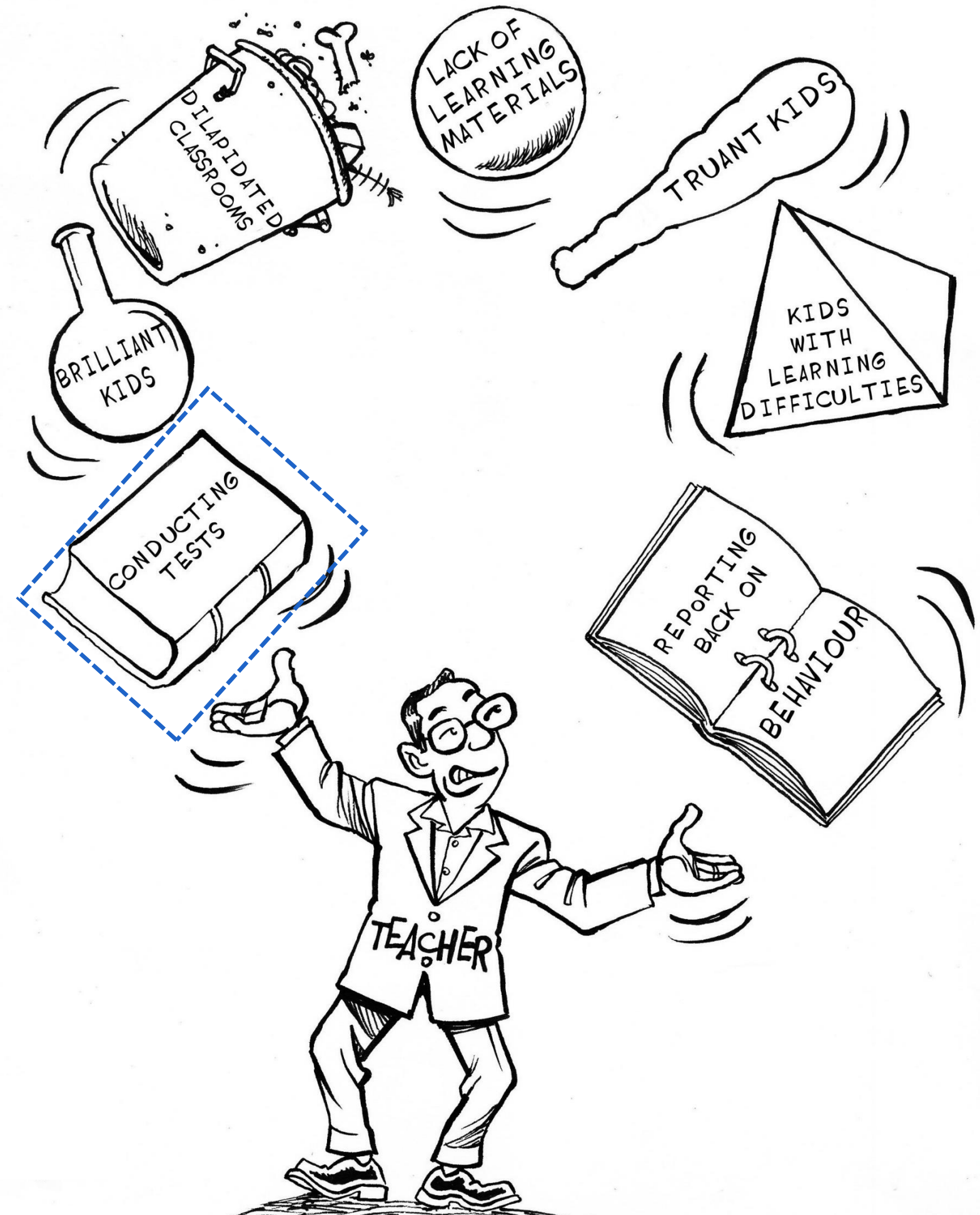


AI in Education

# Research Motivation

# Burden on educators

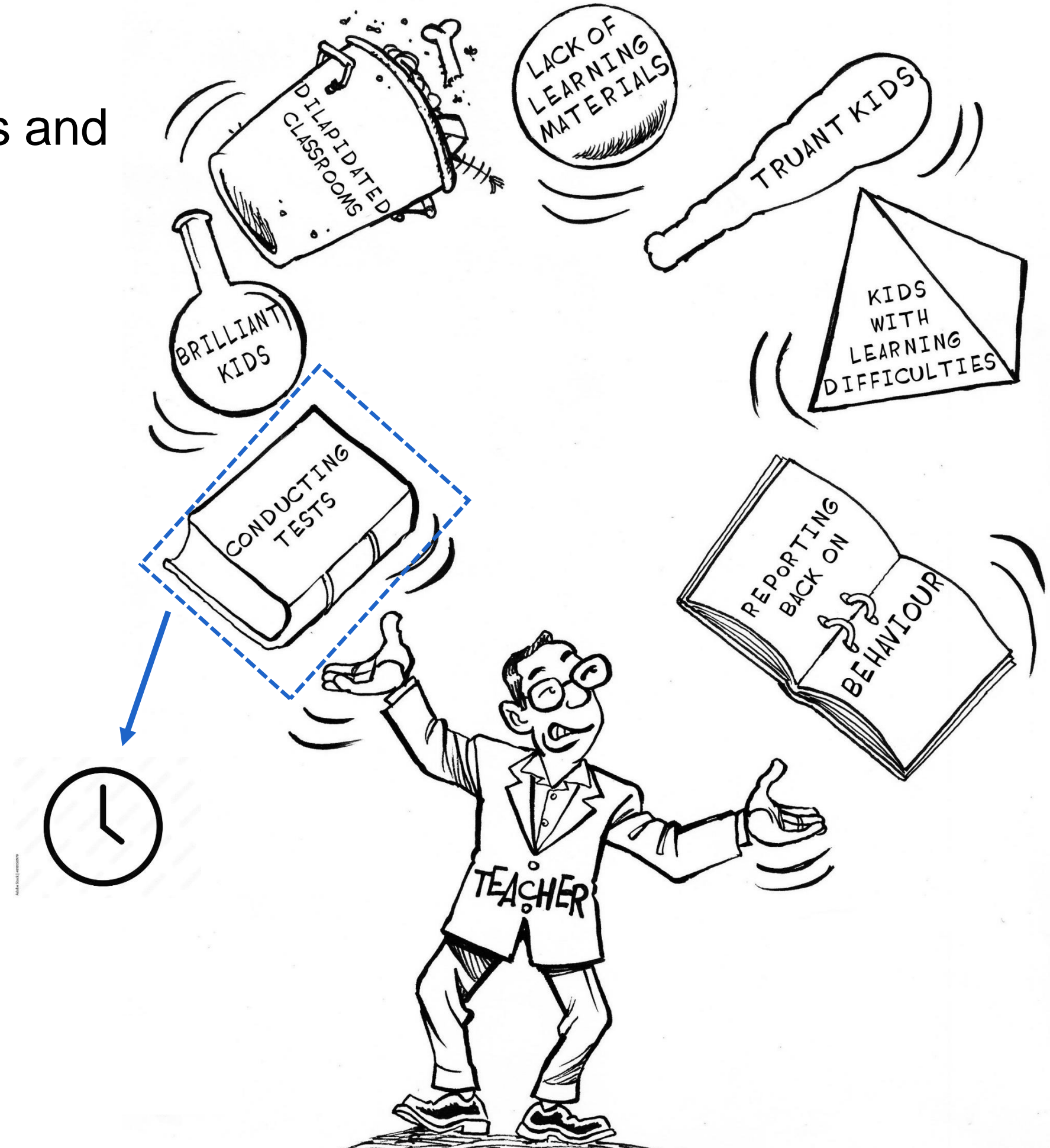
- Heavy **workload** from creating exercises and tests





# Burden on educators

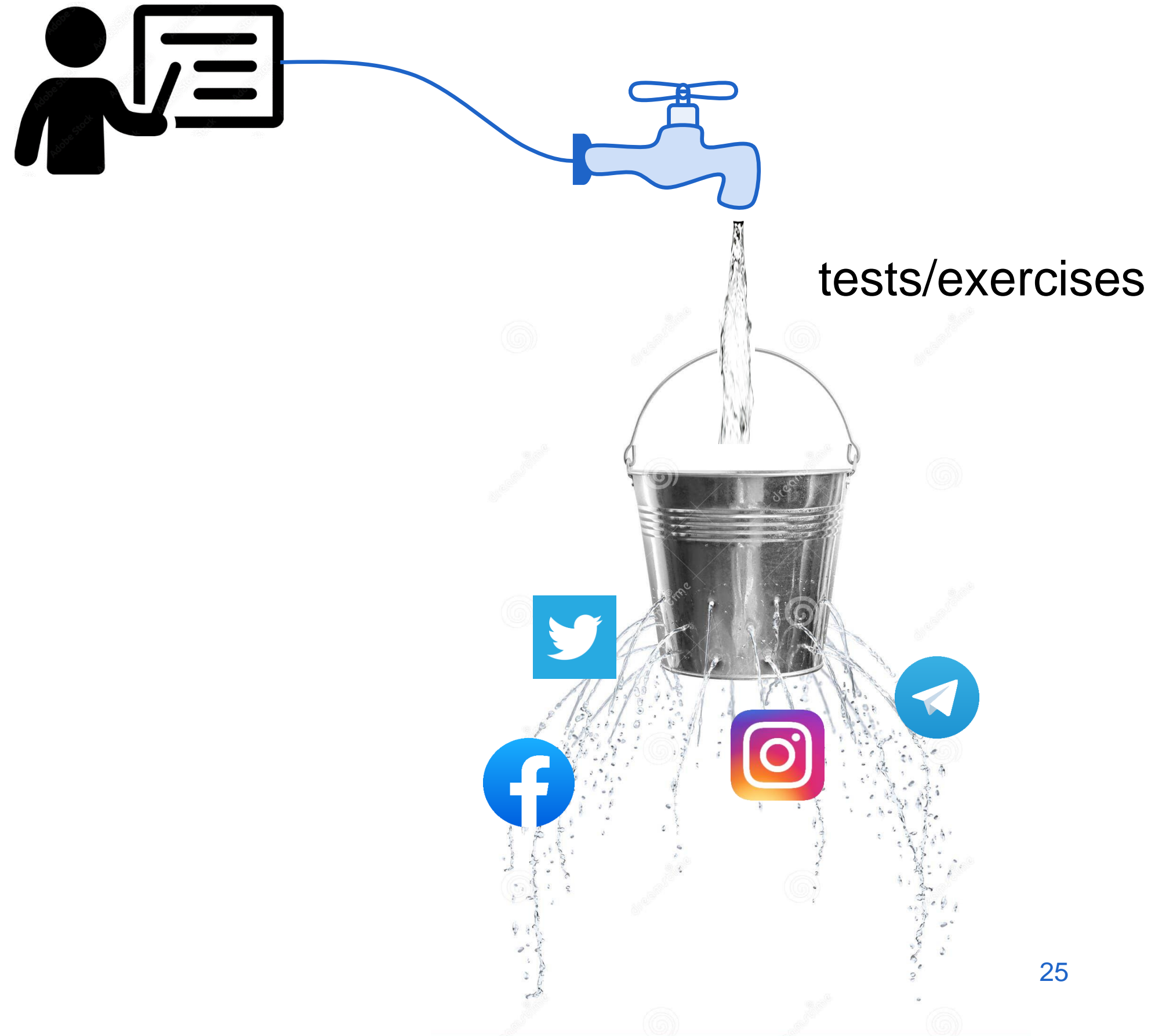
- Heavy **workload** from creating exercises and tests
- Formulating **question** requires
  - Skill
  - Experience
  - Time





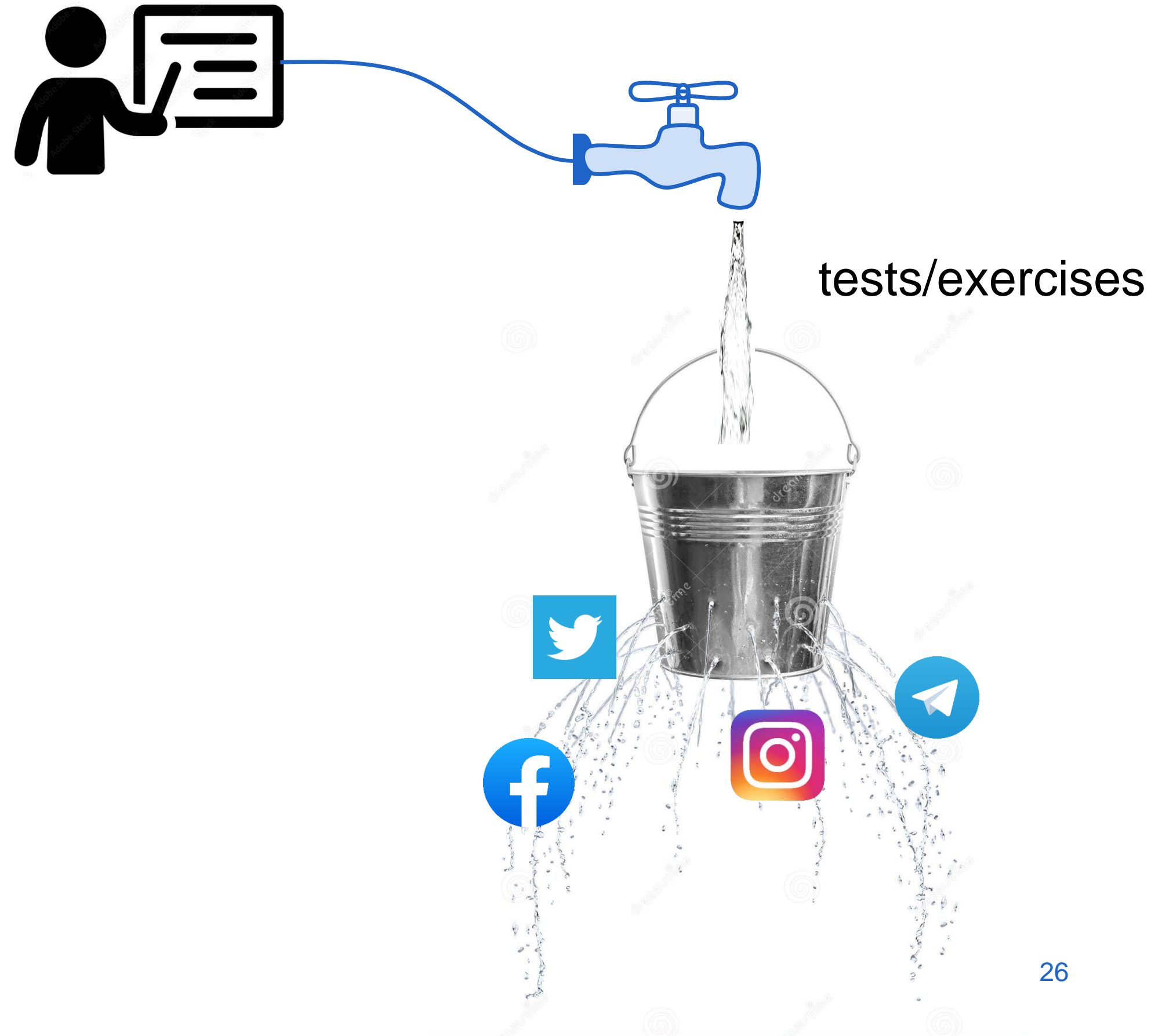
# Single-use dilemma

- Question sharing and leakage



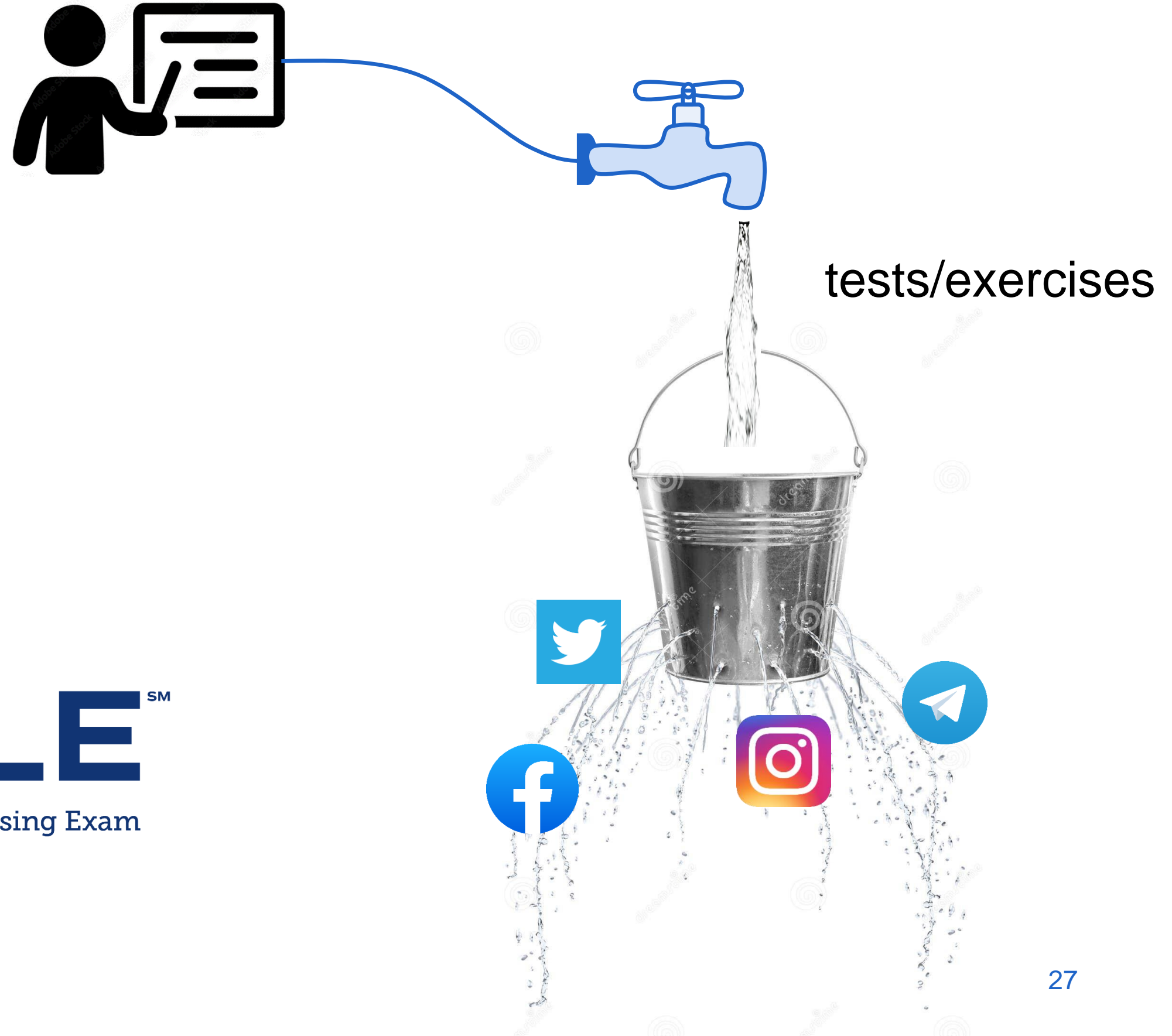
# Single-use dilemma

- Question sharing and leakage
- **Problem** in high-stakes:
  - Certification, Job tests



# Single-use dilemma

- Question sharing and leakage
- **Problem** in high-stakes:
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# Shift to digital education

Rapid digitization of educational materials, especially after COVID19

# Shift to digital education

Rapid digitization of educational materials, especially after COVID19



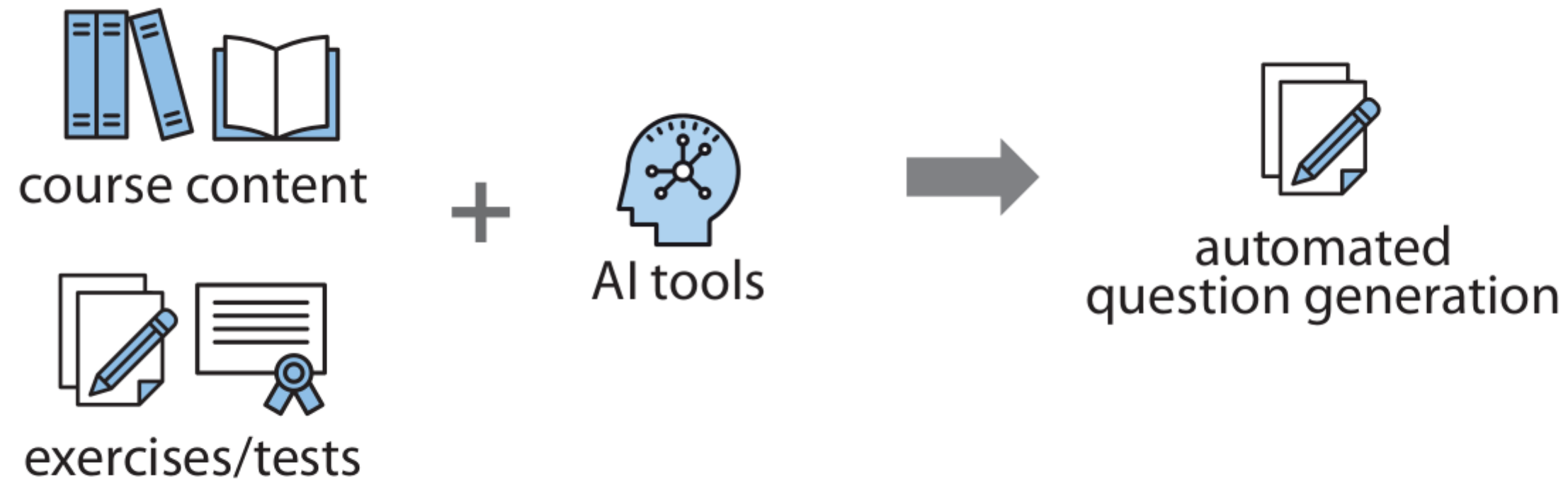
course content



exercises/tests

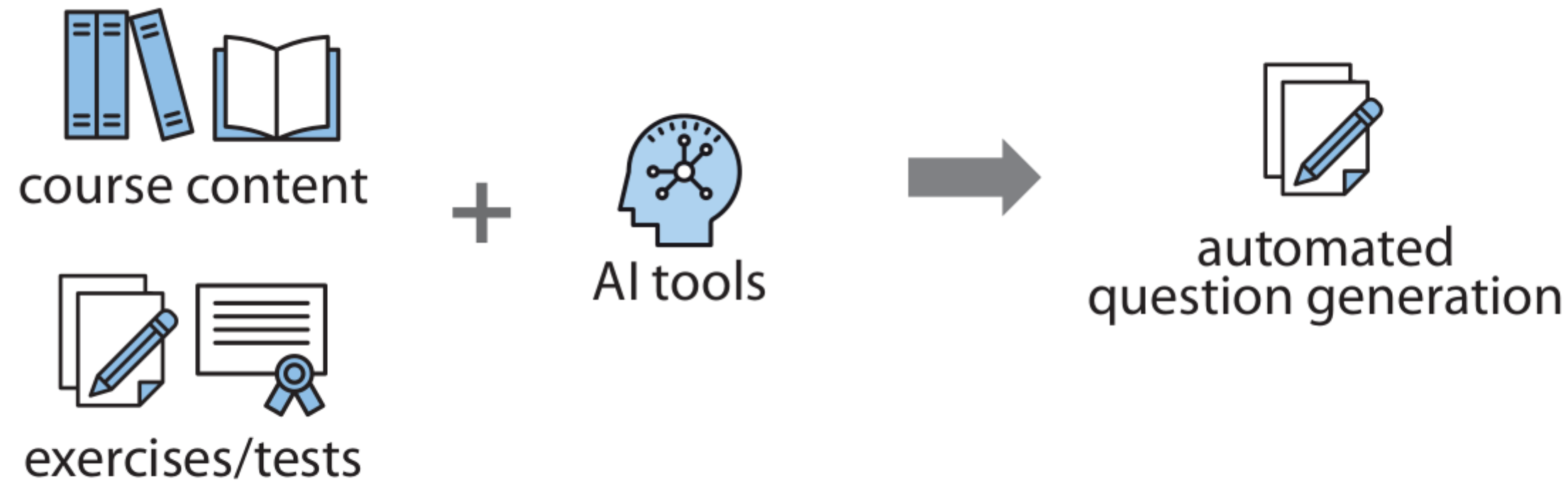
# Shift to digital education

Rapid digitization of educational materials, especially after COVID19



# Shift to digital education

Rapid digitization of educational materials, especially after COVID19



**Goal:** automatic educational question generation to support teachers & students

# Concrete Example 1 (Question Answering)

## Paragraph about Belgium

Belgium is a small country in Europe distinguished by its remarkable combination of historical significance and contemporary governance. Brussels is the capital city of Belgium. Other major cities include Antwerp, which is known for its diamond trade; Ghent, which has intact medieval buildings; and Liège, a city with a rich industrial past and culinary fame for its delicious waffles.

What is the Capital of Belgium?

AI tools

Automatically **Extracted**  
Answer

Brussels



# Concrete Example 2 (Question Generation)

## Paragraph about Belgium

Belgium is a small country in Europe distinguished by its remarkable combination of historical significance and contemporary governance. Brussels is the capital city of Belgium. Other major cities include Antwerp, which is known for its diamond trade; Ghent, which has intact medieval buildings; and Liège, a city with a rich industrial past and culinary fame for its delicious waffles.

AI tools

## Automatically Generated Multiple-Choice Question

What is the Capital of Belgium?

- A Brussels
- B Antwerp
- C Ghent
- D Liège

# Input and output in human language

## Paragraph about Belgium

Belgium is a small country in Europe distinguished by its remarkable combination of historical significance and contemporary governance. Brussels is the capital city of Belgium. Other major cities include Antwerp, which is known for its diamond trade; Ghent, which has intact medieval buildings; and Liège, a city with a rich industrial past and culinary fame for its delicious waffles.

Human language

Automatically **Generated** Multiple-Choice Question

What is the Capital of Belgium?

- A Brussels
- B Antwerp
- C Ghent
- D Liège

AI tools

# How do computers understand language?

Paragraph about Belgium

Belgium is a small country in Western Europe that is distinguished by its remarkable combination of historical significance and contemporary governance. Brussels is the capital city of Belgium and serves as the seat of the EU. Other major cities include Antwerp, which is known for its diamond trade; Ghent, which has intact medieval buildings; and Liège, a city with a rich industrial past and culinary fame for its delicious waffles.

Human language

How?

AI tools

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# Language models

Paragraph about Belgium

Belgium is a small country in Western Europe that is distinguished by its remarkable combination of historical significance and contemporary governance. Brussels is the capital city of Belgium and serves as the seat of the EU. Other major cities include Antwerp, which is known for its diamond trade; Ghent, which has intact medieval buildings; and Liège, a city with a rich industrial past and culinary fame for its delicious waffles.

Human language

How?

Language modeling

Automatically Generated Multiple-Choice Question

What is the Capital of Belgium?

- A Brussels
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- D Liège

# Language Modeling

# Language models (LMs)

Language model is a *probabilistic model* of the human language.

# Language models (LMs)

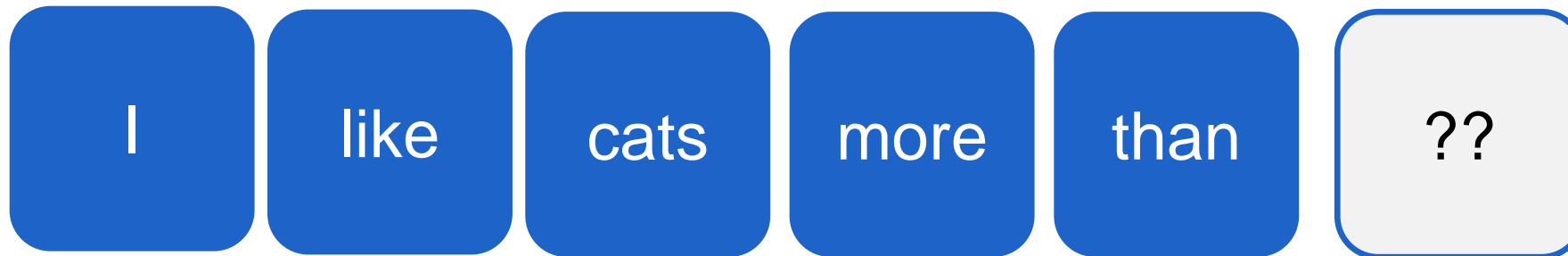
Language model is a *probabilistic model* of the human language.

- 1 Predicting the next word

# Language models (LMs)

Language model is a *probabilistic model* of the human language.

## 1 Predicting the next word

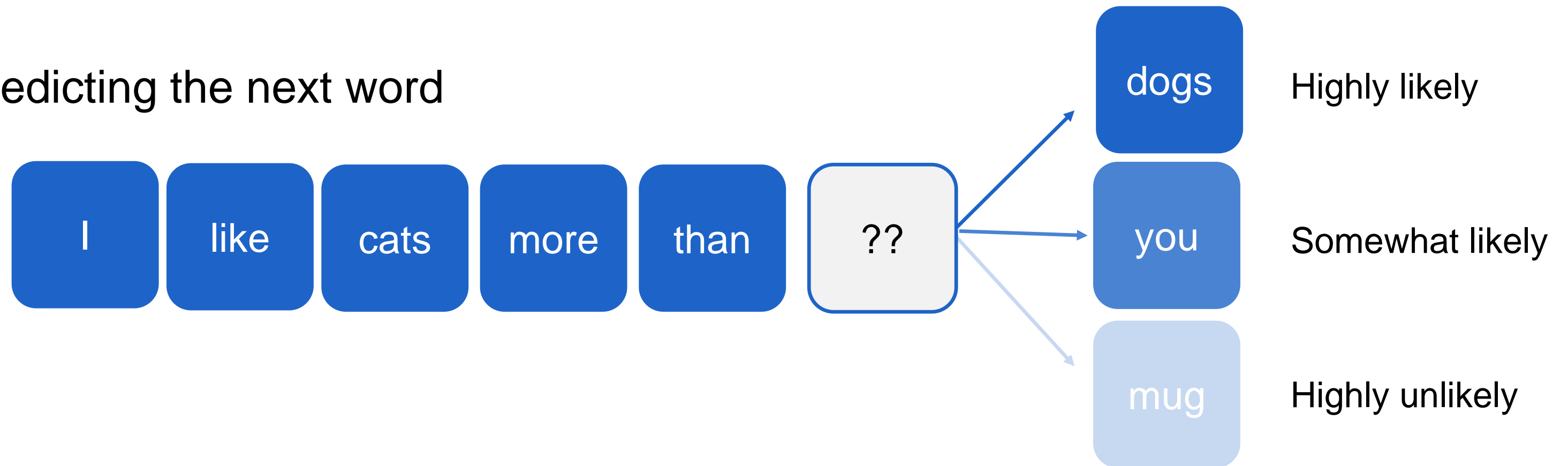




# Language models (LMs)

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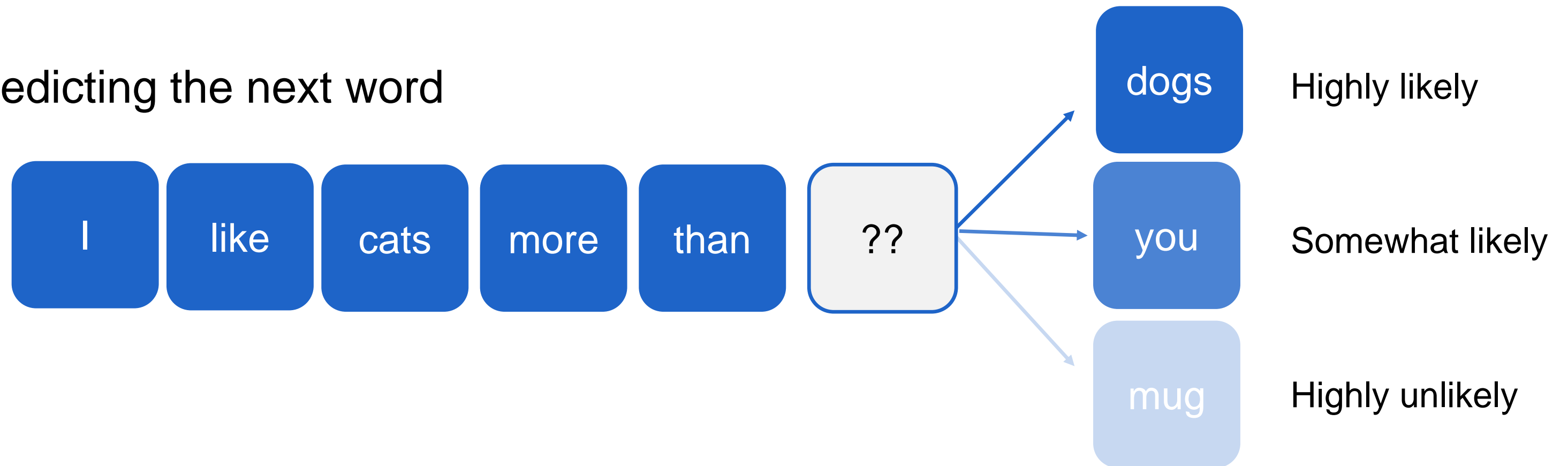
## 1 Predicting the next word



# Language models (LMs)

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## 1 Predicting the next word

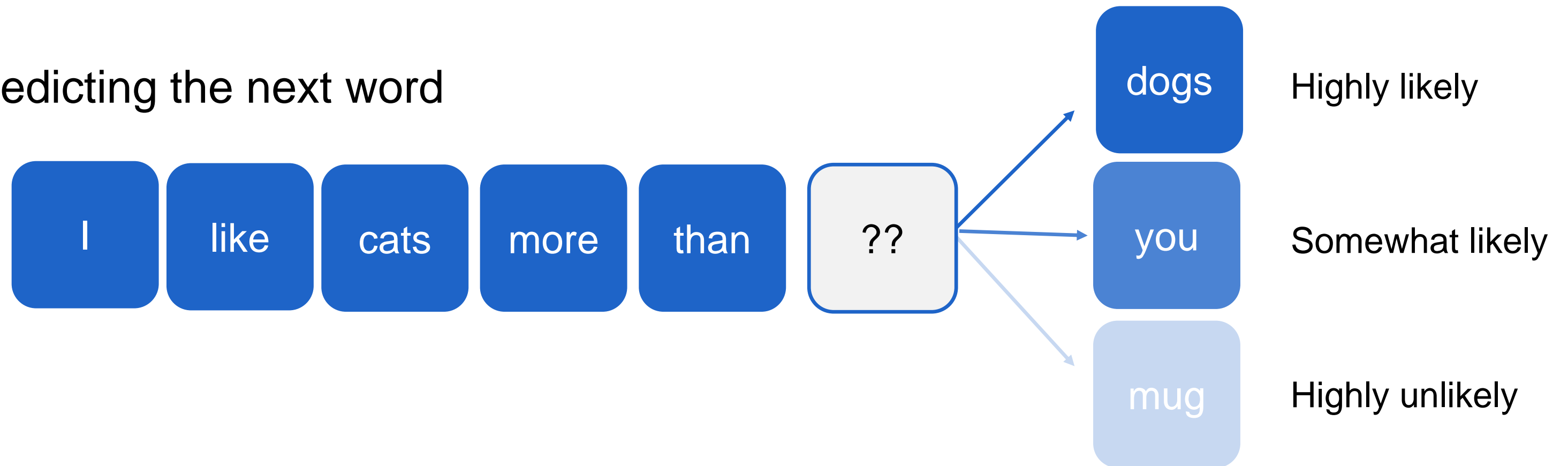


## 2 Likelihood of the sentence

# Language models (LMs)

Language model is a *probabilistic model* of the human language.

## 1 Predicting the next word



## 2 Likelihood of the sentence

$$P \left( \text{The sky is the limit.} \right) \gg P \left( \text{limit is The the sky.} \right)$$

# Why assign probabilities?

# Why assign probabilities?

## Real-world applications

### Machine Translation

Dutch

↔

English

hij heeft hoge normen.

×

he has high standards.

✓

English

he has tall standards.

✗

# Why assign probabilities?

## Real-world applications

### Machine Translation

Dutch



English

hij heeft hoge  
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he has high  
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English

he has tall standards.



### Speech recognition



??

I saw a van

??

eyes awe of an

# Why assign probabilities?

## Real-world applications

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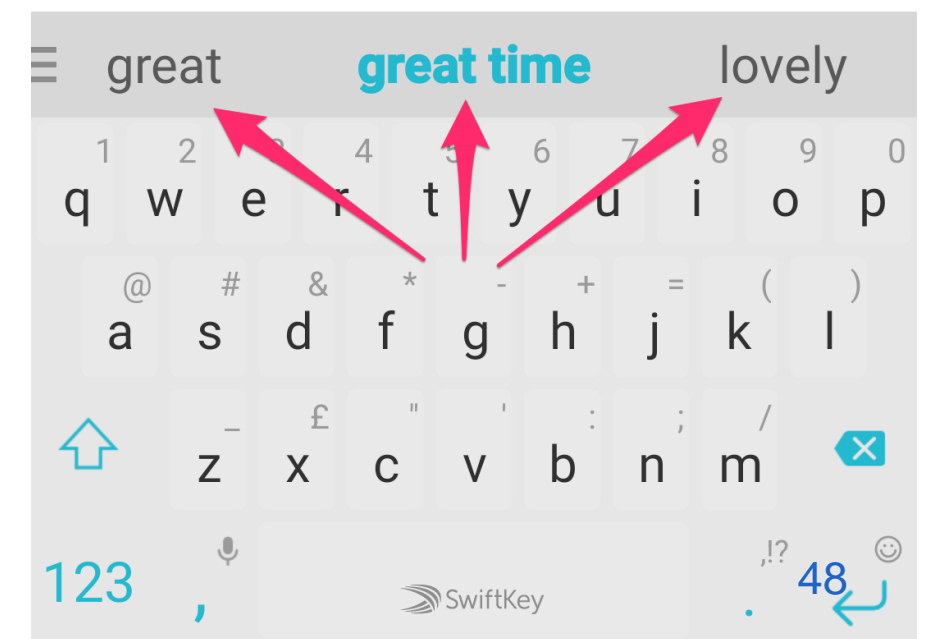
I saw a van



eyes awe of an

## Sentence auto-completion

(+) I had such a





# How do LMs assign probabilities?

# How do LMs ~~assign probabilities?~~ Learn?

# How do LMs Learn?

Two common tasks to teach LMs

- 1 *Causal Language modeling*
- 2 *Masked language modeling*

# 1 Causal Language Modeling

Predict the **next word** from a vocabulary using an untrained model  $M_1$

I like cats more than ??

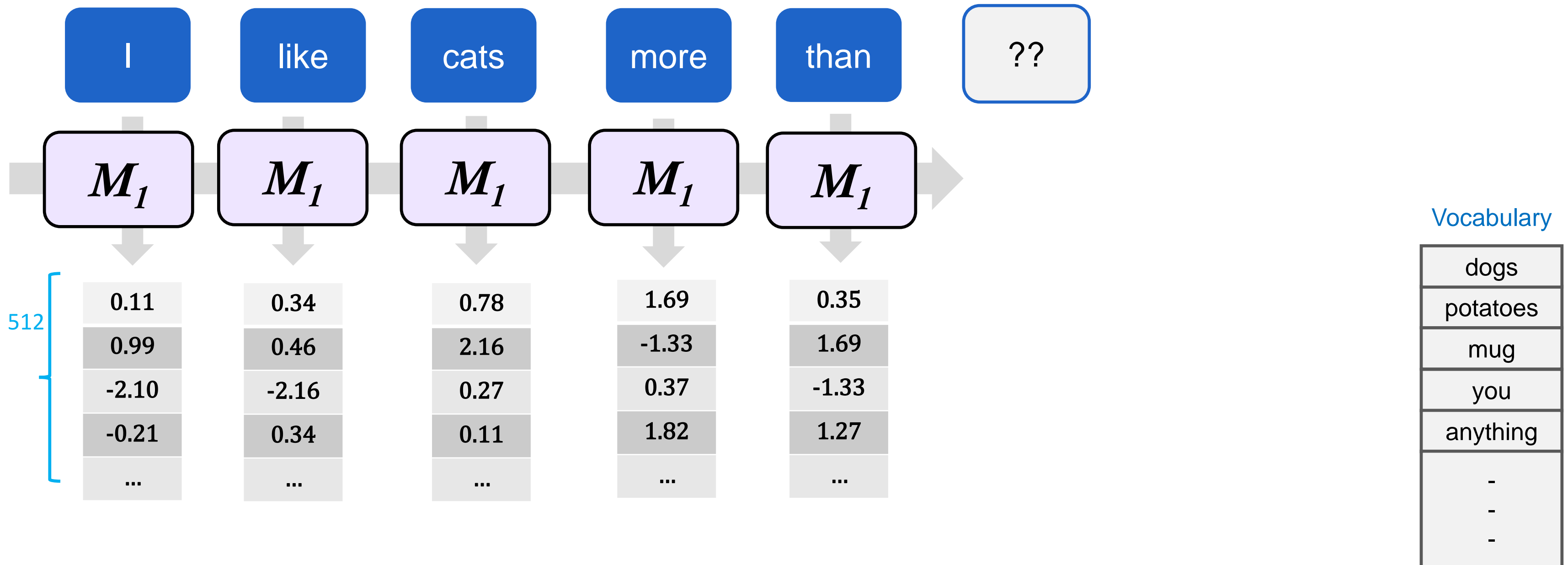


Vocabulary

dogs
potatoes
mug
you
anything
-
-
-

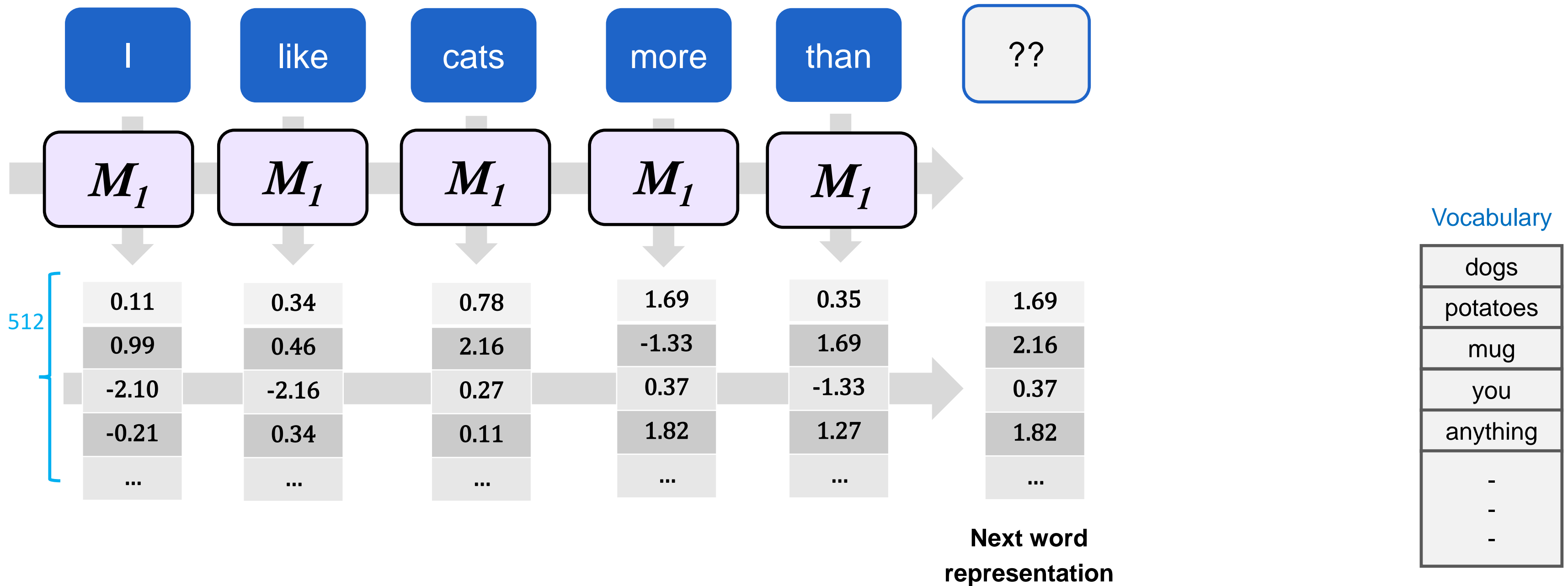
# 1 Causal Language Modeling

First the model  $M_0$  converts each word to a numerical vector (e.g., 512)



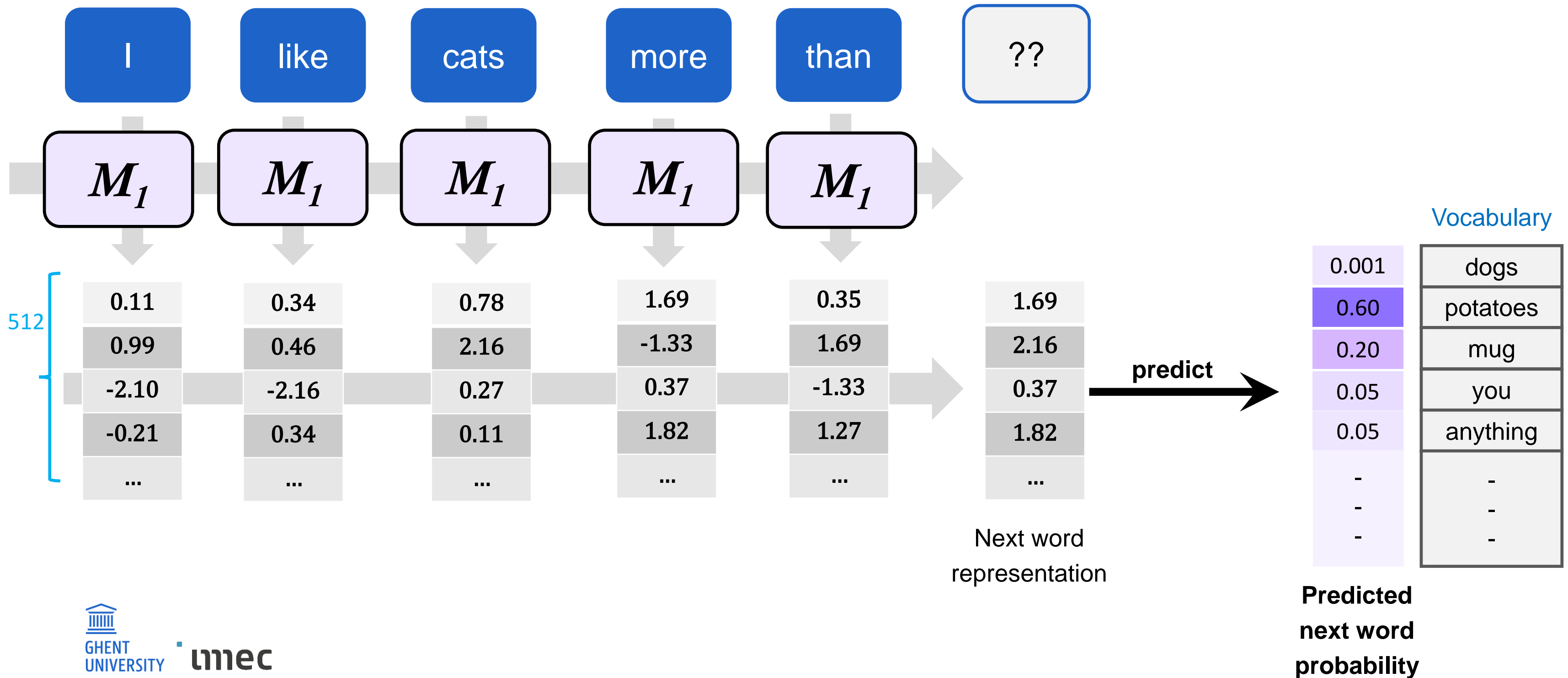
# 1 Causal Language Modeling

Combine all the word vectors into one **next word** representation vector



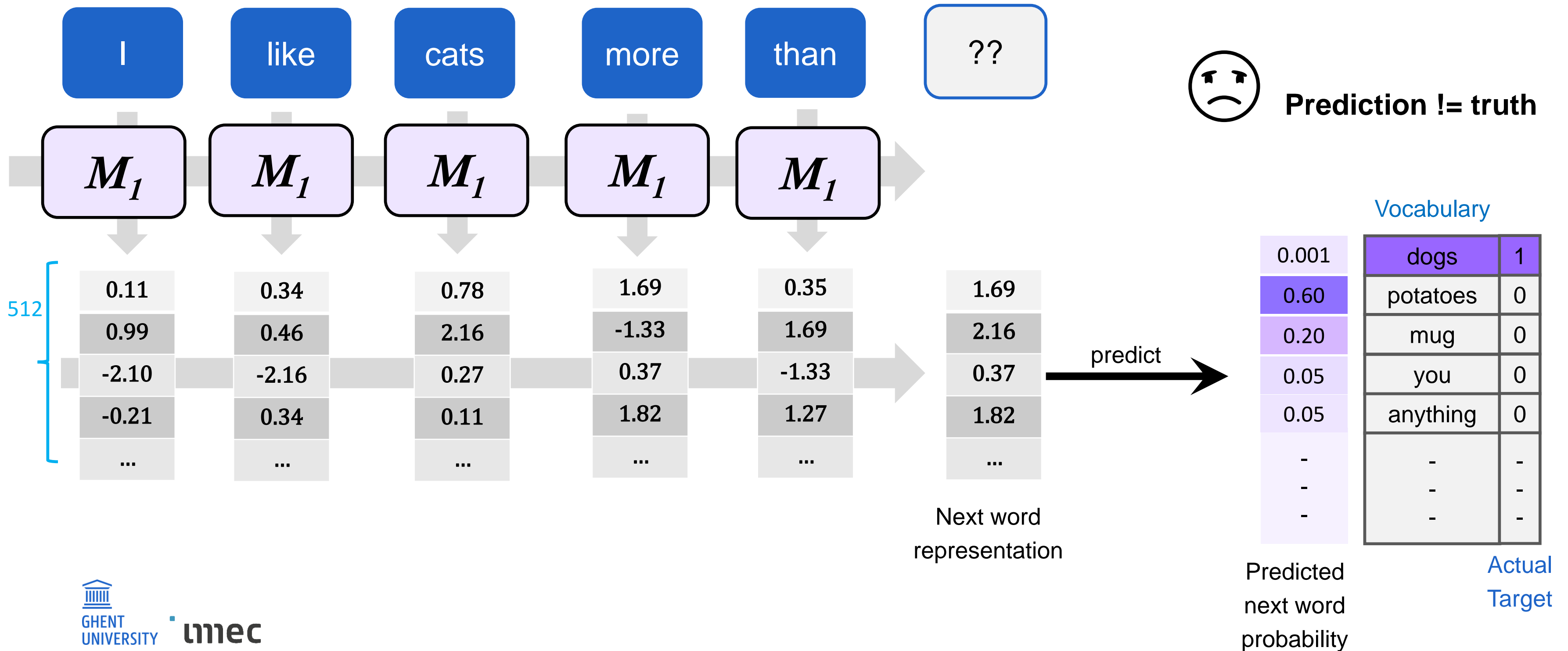
# 1 Causal Language Modeling

Using the next word representation, **predict** the probability of next word



# 1 Causal Language Modeling

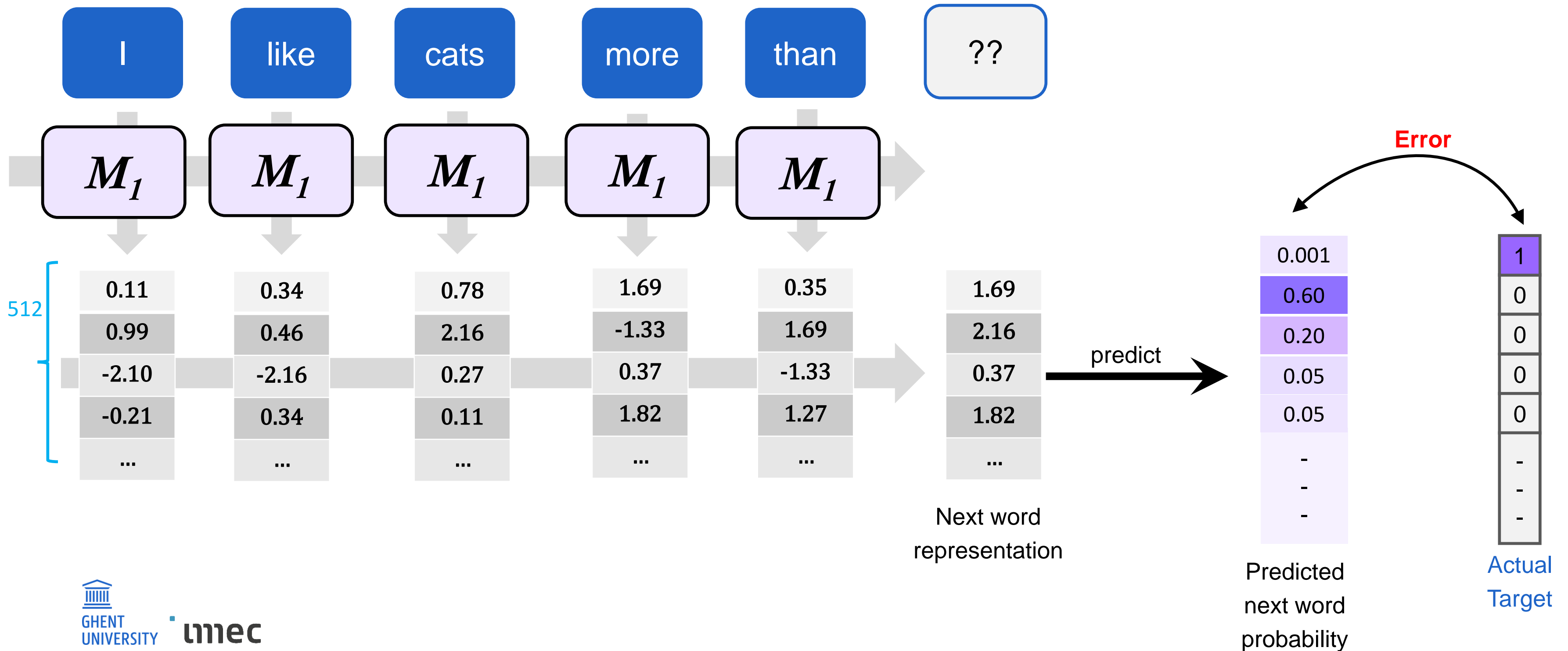
Mismatch between prediction and truth. How to **solve** this?





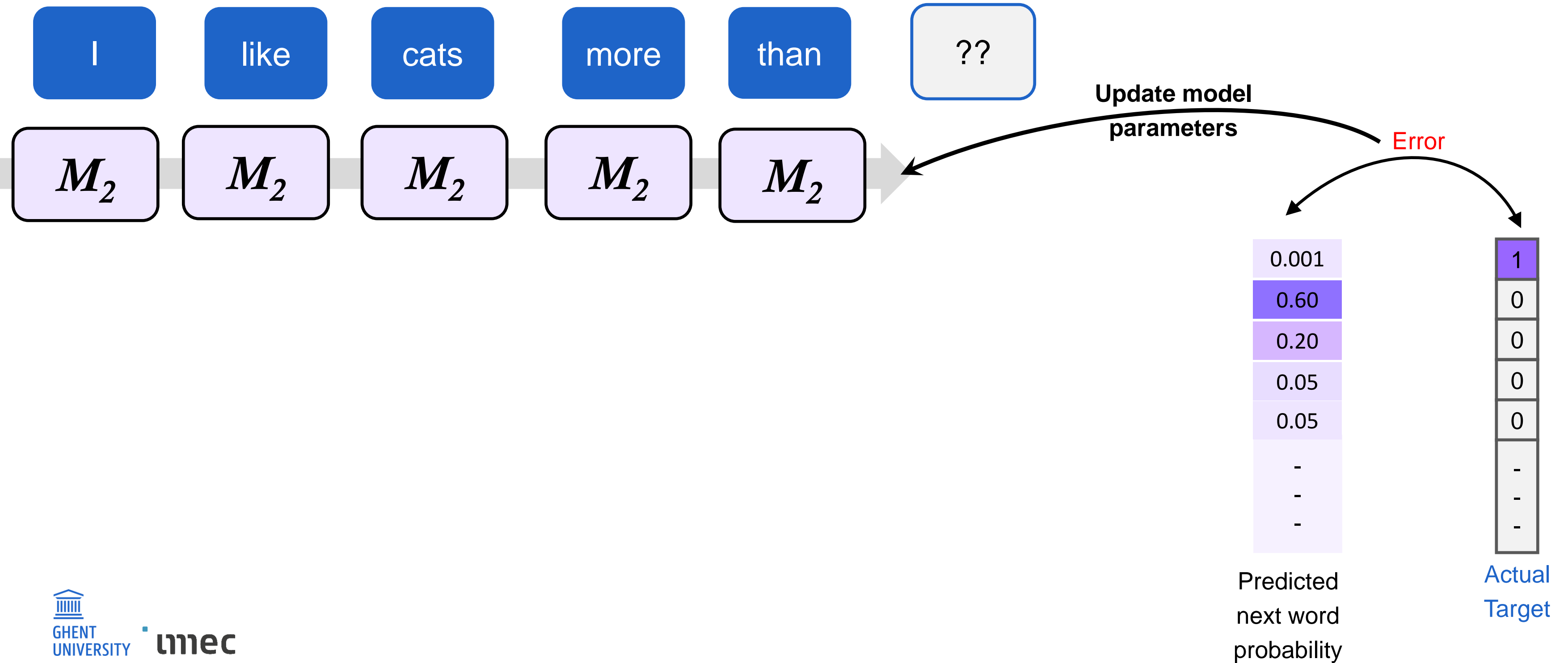
# 1 Causal Language Modeling

Calculate the **error (loss)** between the prediction and the actual target



# 1 Causal Language Modeling

Update the model's parameters  $M$ :  $M_1 \rightarrow M_2$

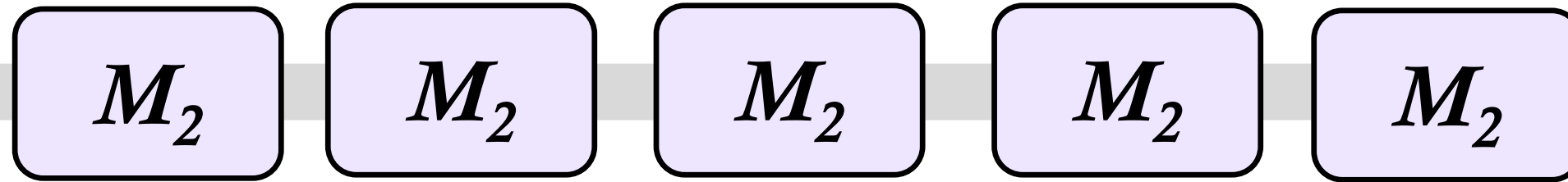


# 1 Causal Language Modeling

Repeat this process to minimize the **error**

Training goal:  
Minimize the error

I like cats more than ??



Update model  
parameters

Error

0.01
0.40
0.10
0.05
0.05
-
-
-

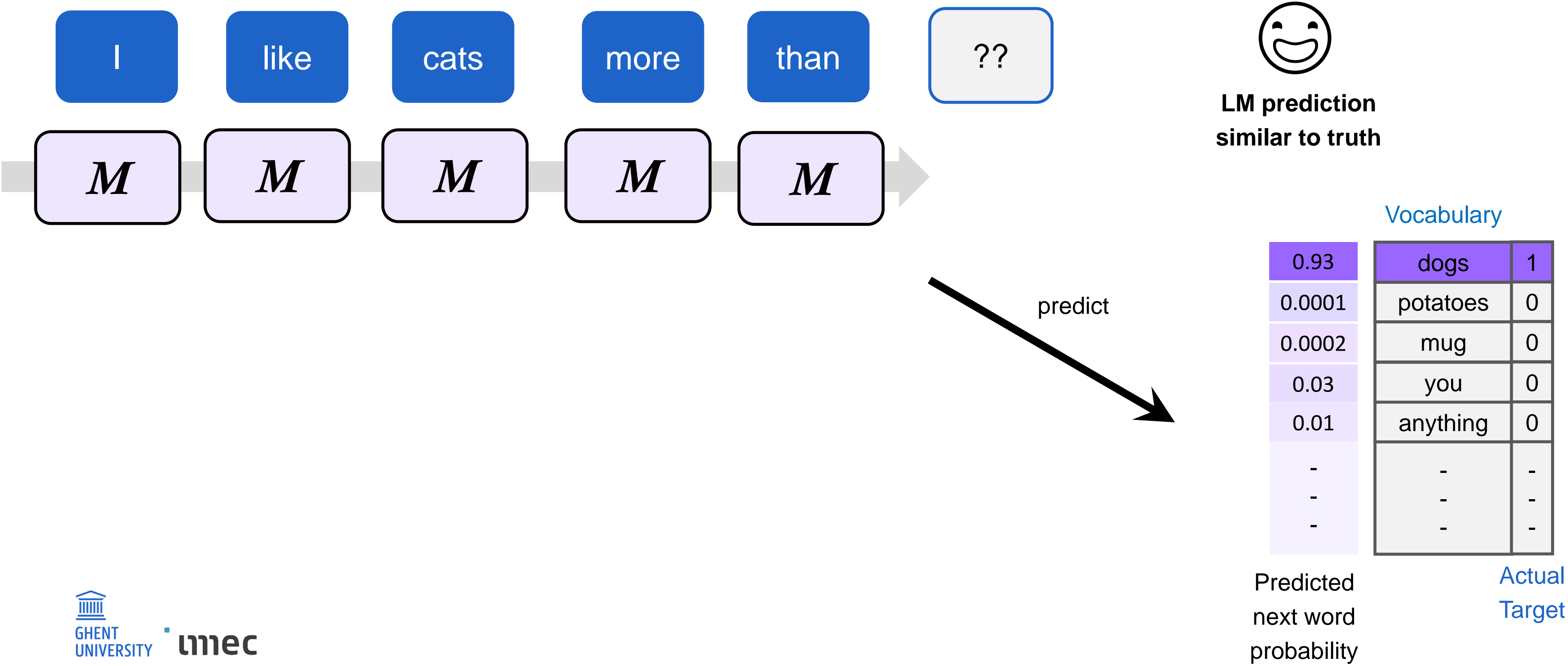
Predicted  
next word  
probability

1
0
0
0
0
-
-
-

Actual  
Target

# 1 Causal Language Modeling

The model is trained after several iterations (e.g., 100 iterations)

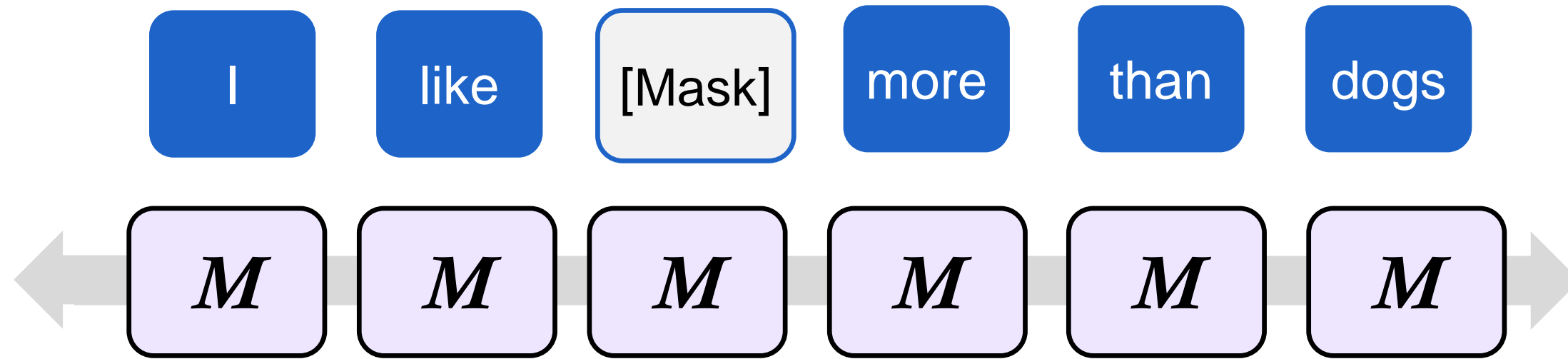


# 1 Causal Language Modeling

- Processes text from left to right
- Natural for generative tasks (e.g., Question Generation)
- Examples: GPT-3/4, ChatGPT

## 2 Masked Language Modeling

Predict the **masked** word

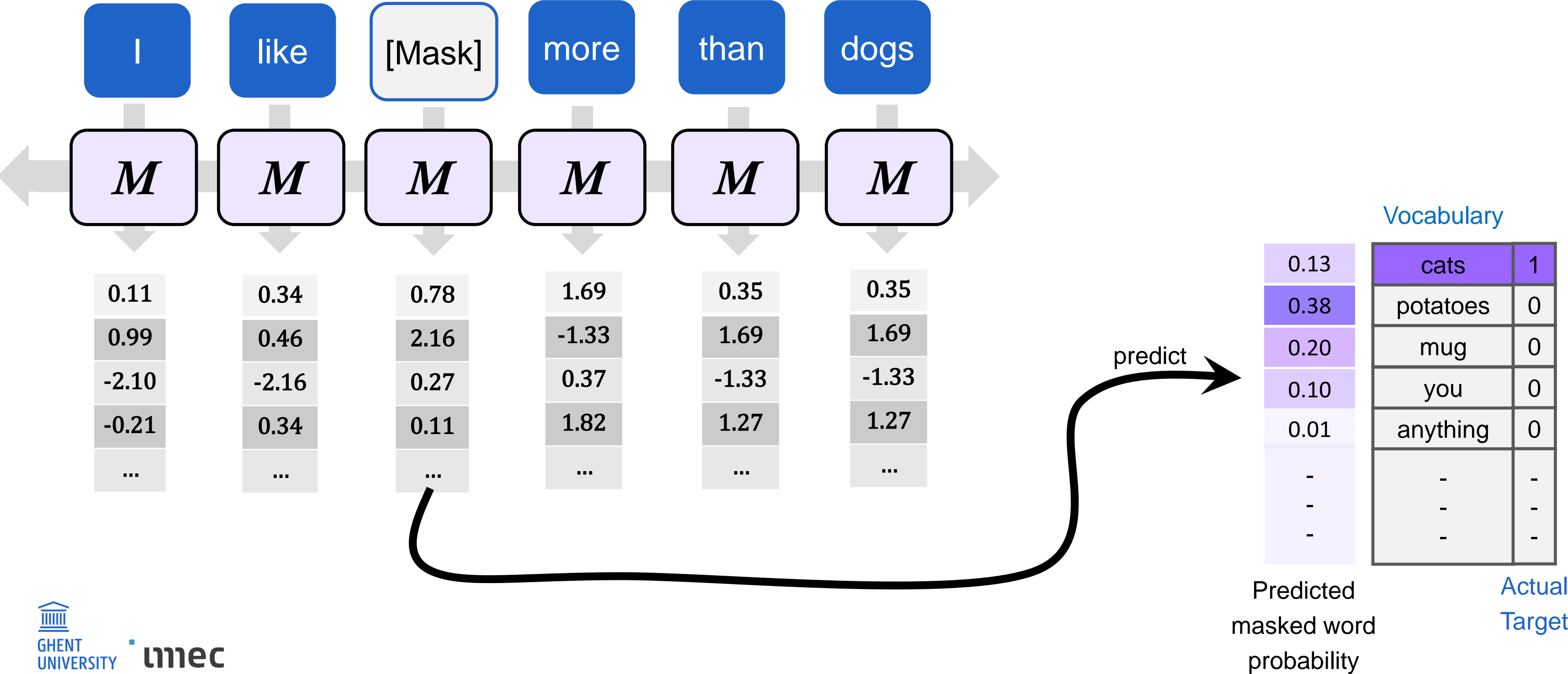


Vocabulary

cats
potatoes
mug
you
anything
-
-
-

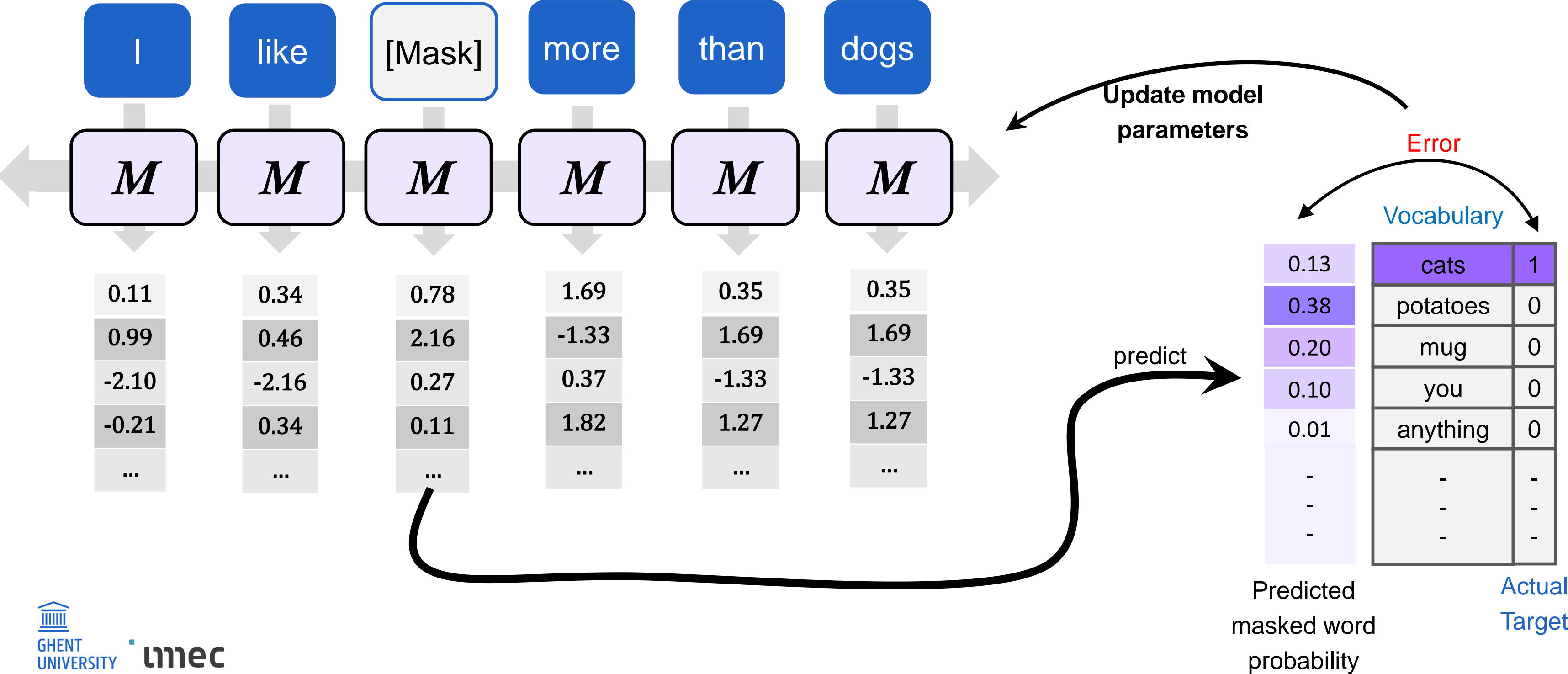
# 2 Masked Language Modeling

Predict the masked word



# 2 Masked Language Modeling

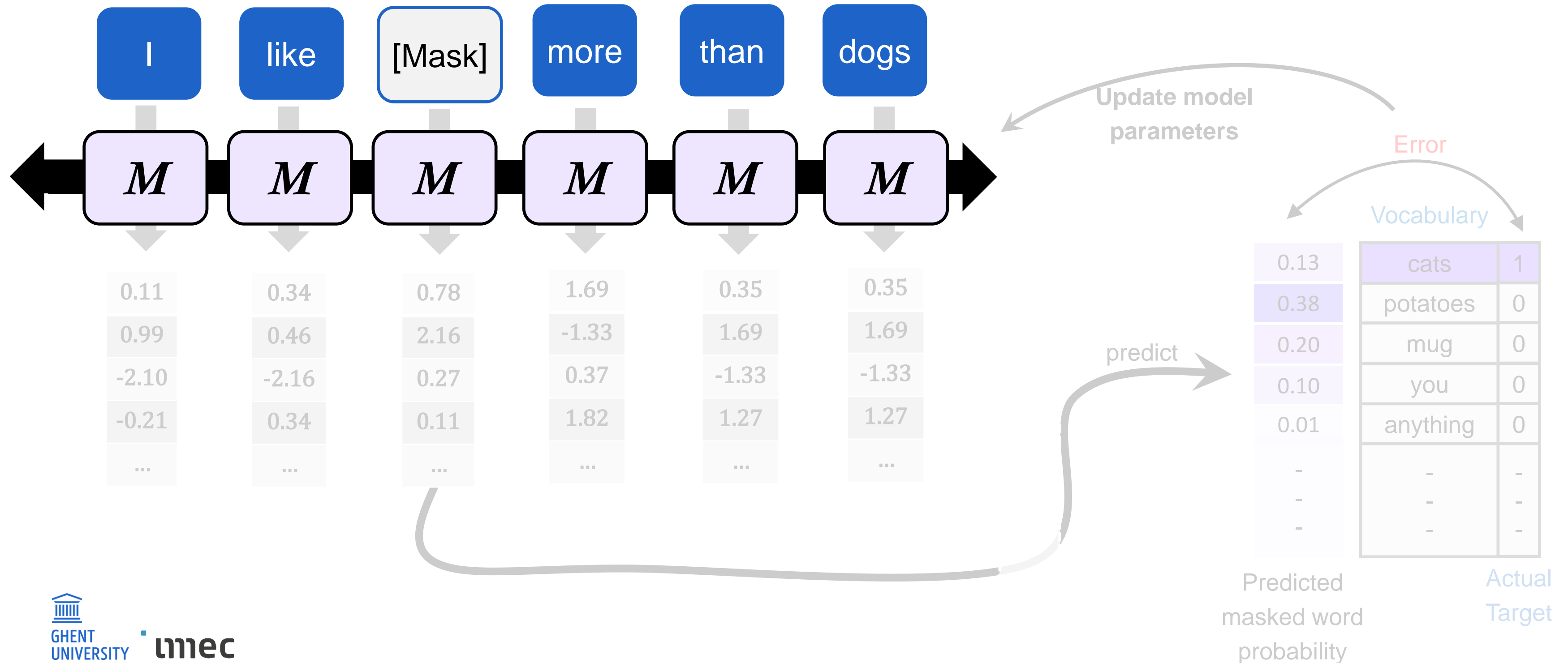
Predict the masked word





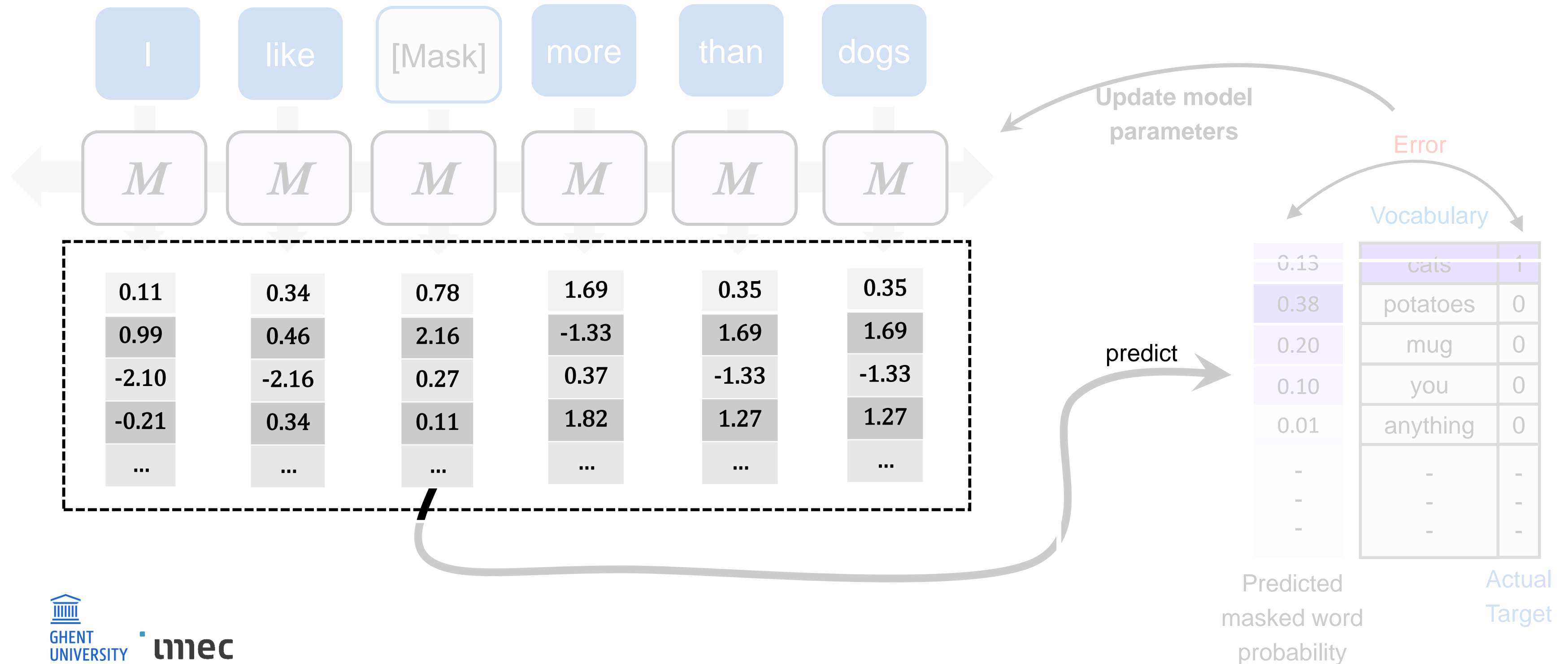
## 2 Masked Language Modeling

Bidirectional processing of text



## 2 Masked Language Modeling

- Suitable for text understanding tasks (e.g., question answering, gap-fill prediction)



## 2 Masked Language Modeling

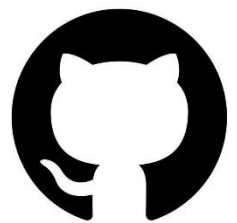
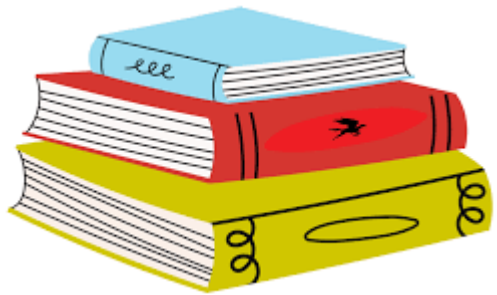
- Suitable for text understanding tasks (e.g., question answering, gap-fill prediction)
- Examples: BERT, RoBERTa

# Large Language Models (LLMs)

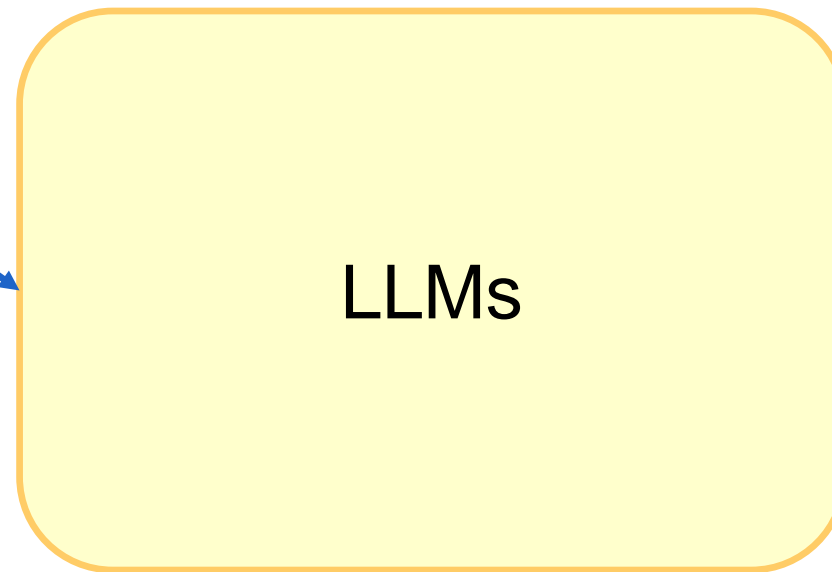
LLMs are pretrained on tons of textual data



WIKIPEDIA

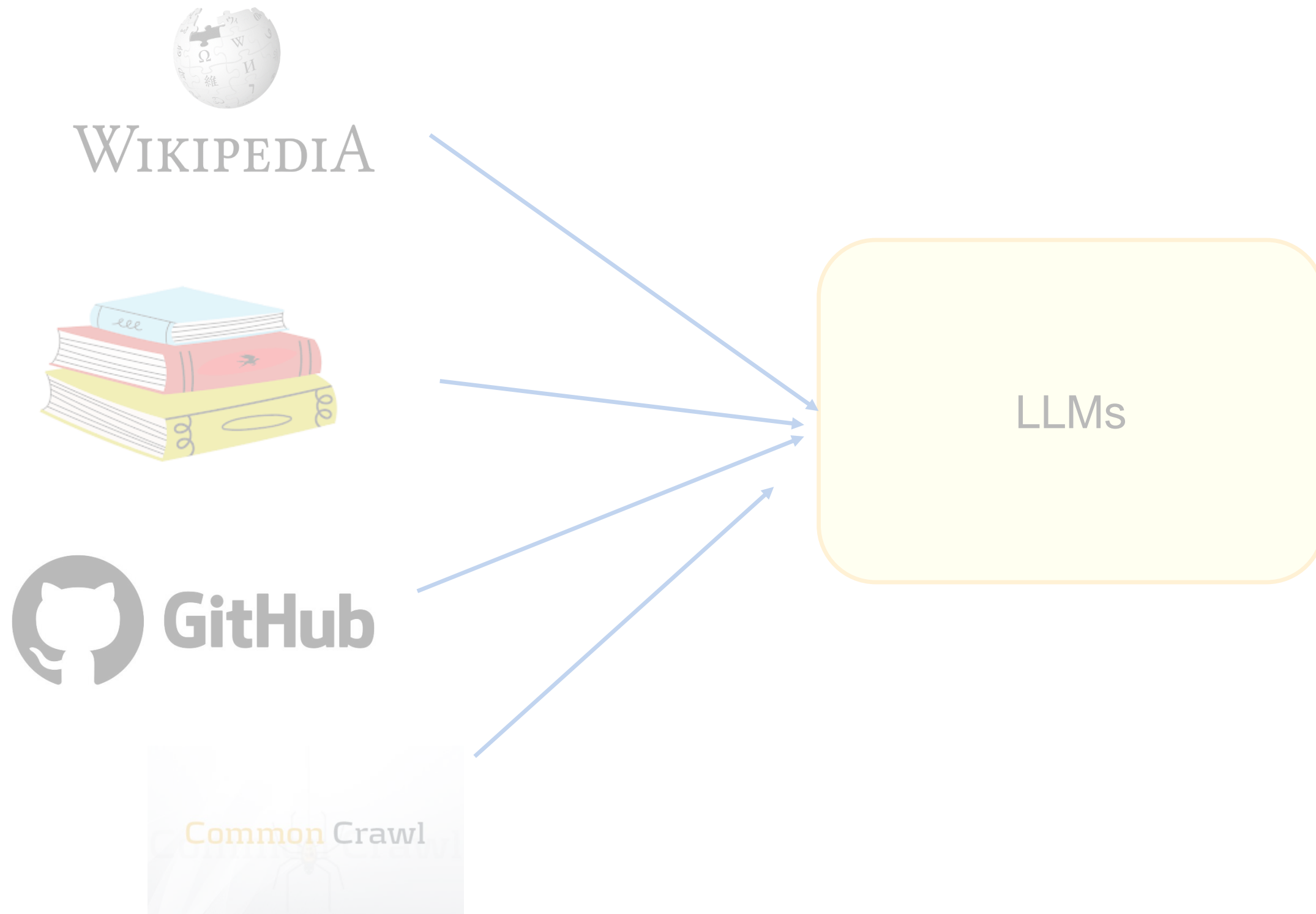


GitHub



# Large Language Models (LLMs)

LLMs are pretrained on tons of textual data



Examples of LLMs



**LLaMA**  
by  **Meta**

# Distractor Generation Task

# Distractor Generation

Multiple-choice question (**MCQ**) has

# Distractor Generation

Multiple-choice question (**MCQ**) has

What is the capital of Belgium?

- A Brussels
- B Antwerp
- C Ghent
- D Amsterdam



# Distractor Generation

Multiple-choice question (**MCQ**) has

What is the capital of Belgium?

Question

A Brussels

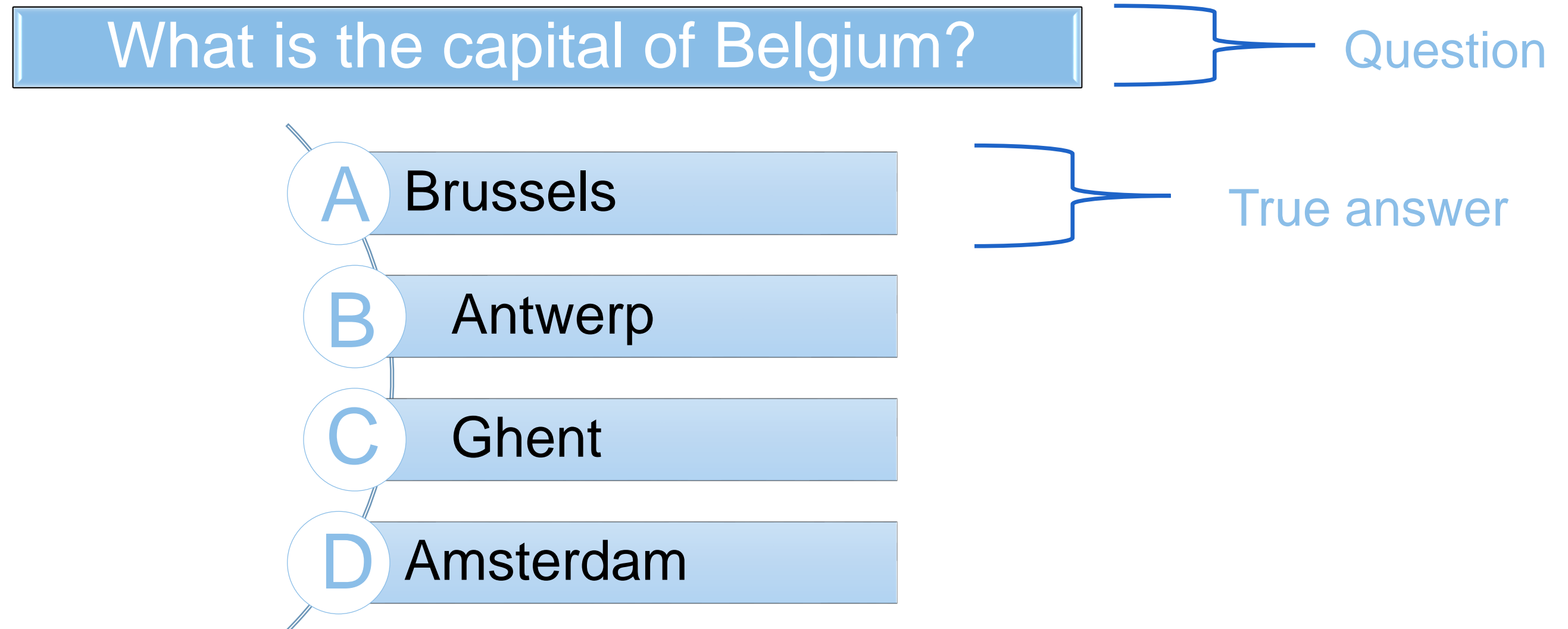
B Antwerp

C Ghent

D Amsterdam

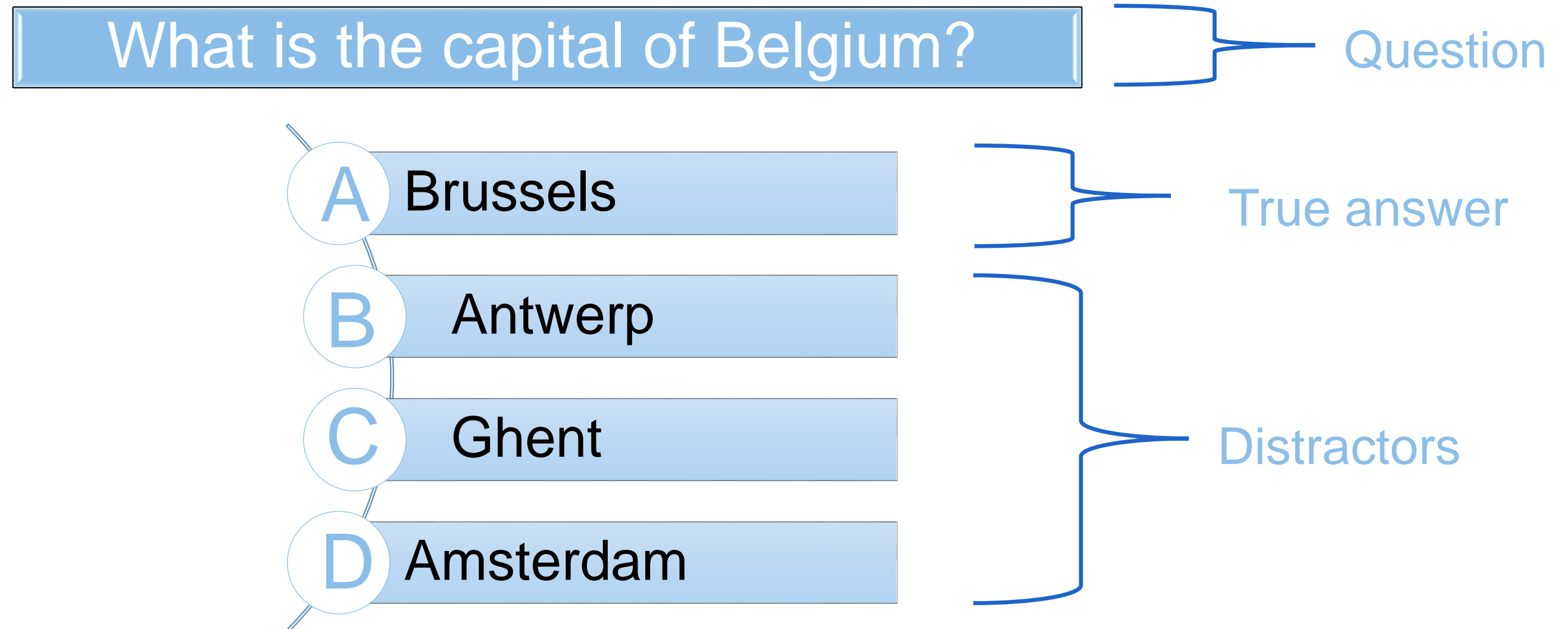
# Distractor Generation

Multiple-choice question (**MCQ**) has



# Distractor Generation

Multiple-choice question (**MCQ**) has



# Quality of Distractors

## Effective Distractors

What is the Capital of Belgium?

- A Brussels
- B Antwerp
- C Ghent
- D Amsterdam

## Poor Distractors

What is the Capital of Belgium?

- A Brussels
- B Sydney
- C New York
- D Mekelle

# Quality of Distractors

## Effective Distractors

What is the Capital of Belgium?

- A Brussels
- B Antwerp
- C Ghent
- D Amsterdam

- ✓ Plausible
- ✓ Tests knowledge
- ✓ Good MCQ

## Poor Distractors

What is the Capital of Belgium?

- A Brussels
- B Sydney
- C New York
- D Mekelle

- ✗ Implausible
- ✗ Easily dismissed
- ✗ Bad MCQ

# Quality of Distractors

## Effective Distractors

What is the Capital of Belgium?

A Brussels

B Antwerp

C Ghent

D Amsterdam

Generating distractors → **time-consuming task!**

# Quality of Distractors

## Effective Distractors

What is the Capital of Belgium?

A Brussels

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D Amsterdam

Generating distractors → **time-consuming task!**

**Goal:** Can we automate this process to **increase** teachers' efficiency?

# Research question

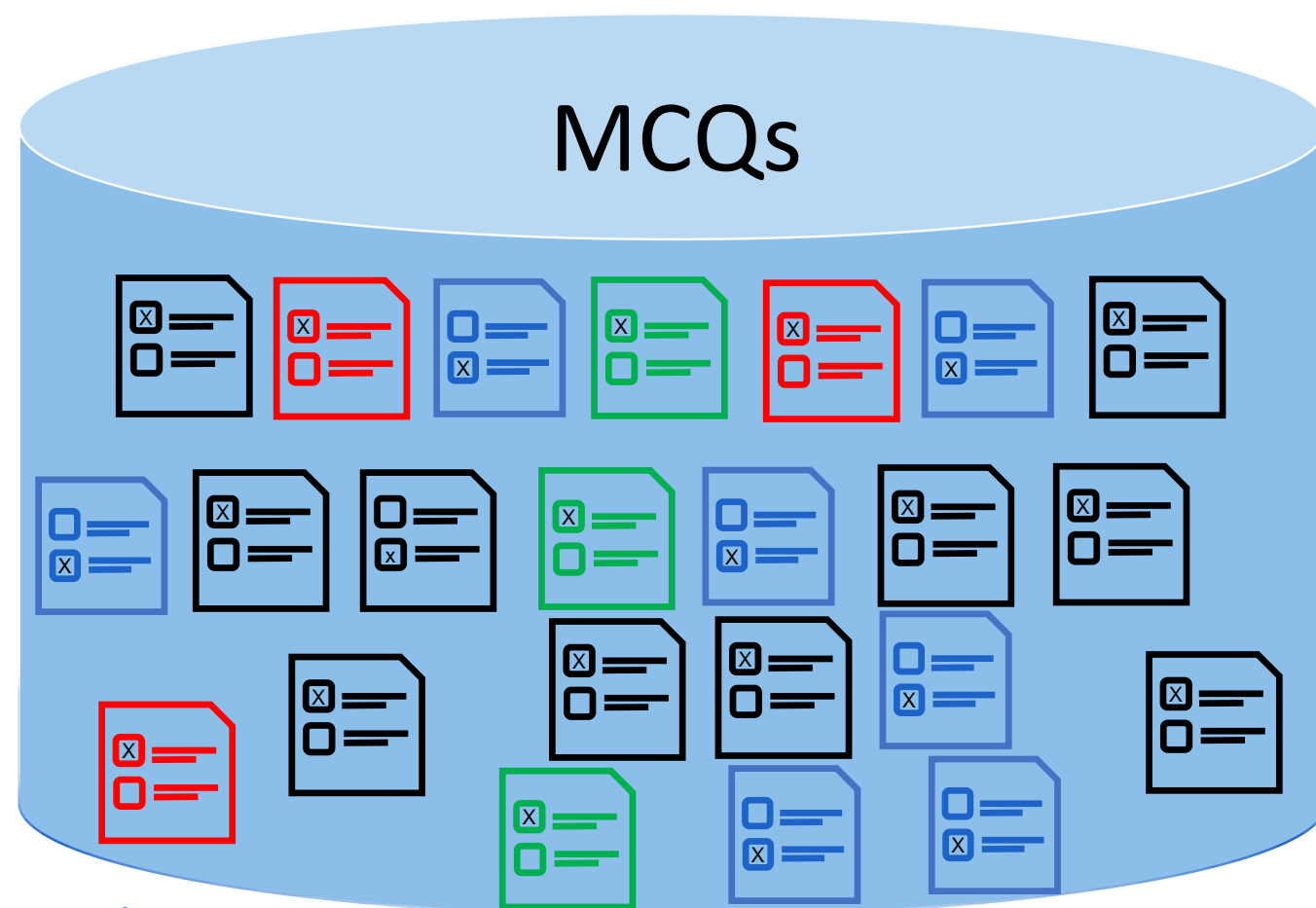
1. How to **automatically** generate distractors?



# Televic Dataset

Real-world dataset provided by industry partner

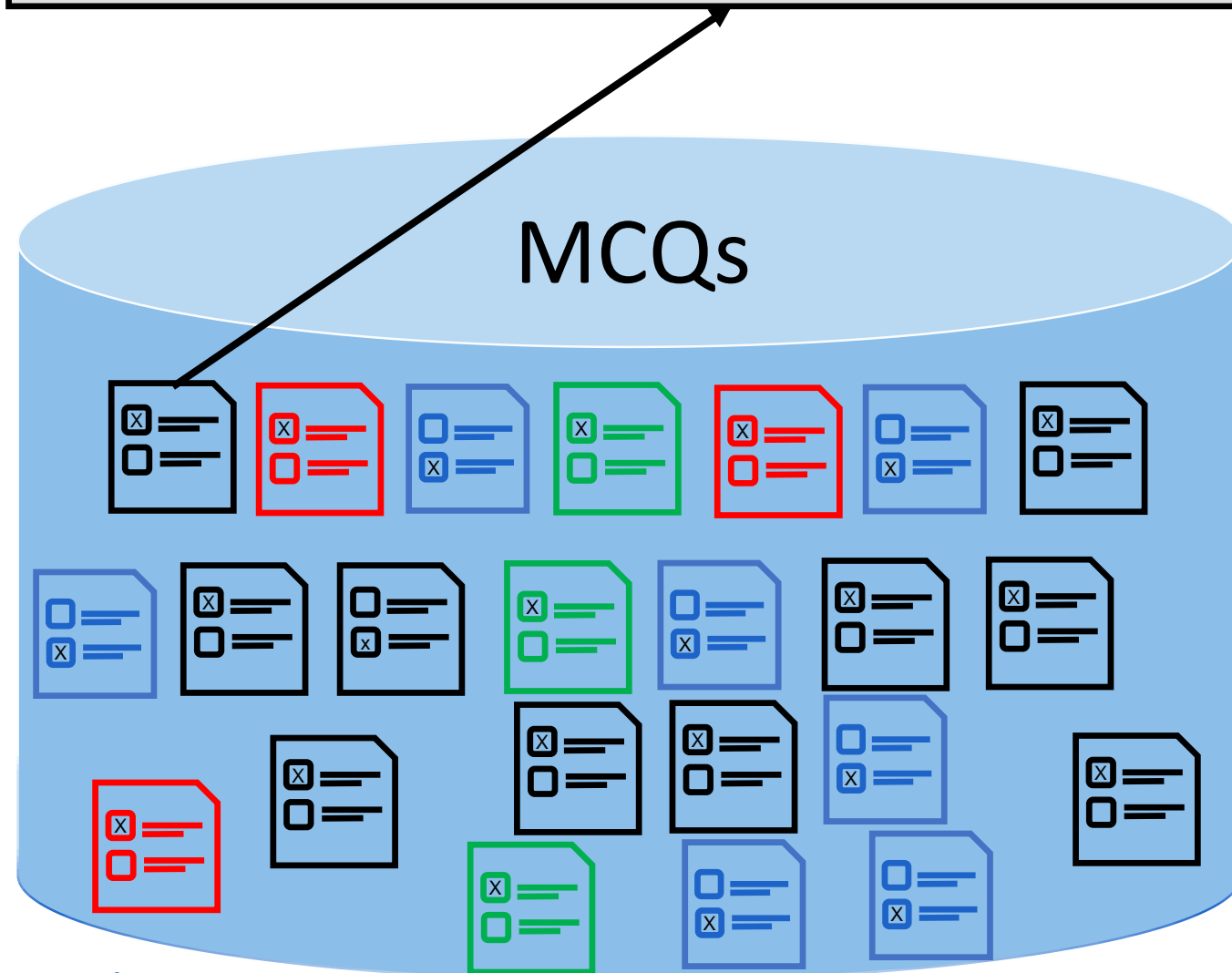
televic



# Televic Dataset

The highest mountain in the world is \_\_\_\_

- A. Mont Blanc                      C. **Mount Everest**  
B. Kilimanjaro                      D. Amba Alaje



# Televic Dataset

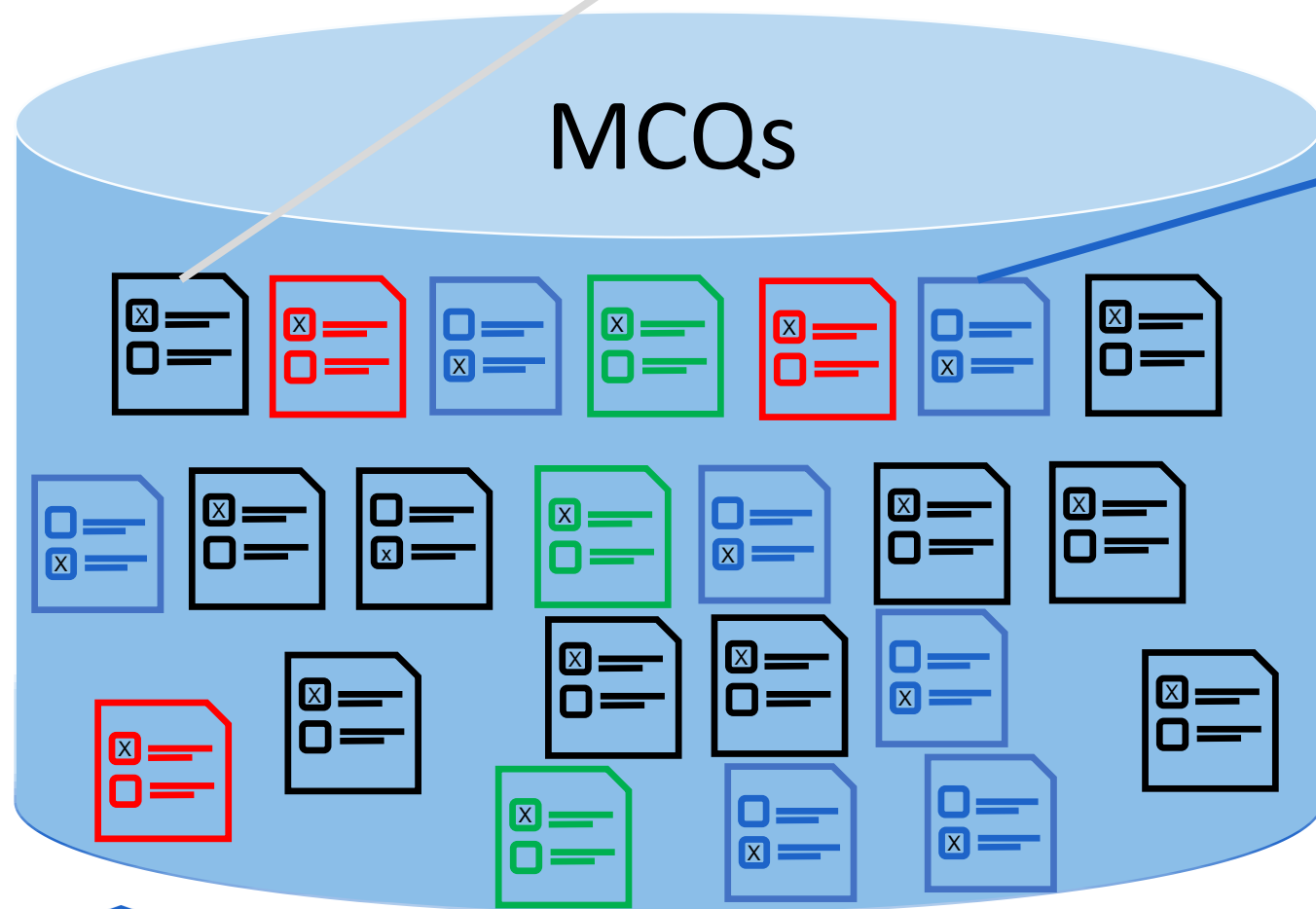
The highest mountain in the world is \_\_\_\_

- A. Mont Blanc
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- C. Mount Everest
- D. Amba Alaje

In welk werelddeel ligt Noord-Korea?

- A. Antarctica
- B. Europa
- C. Afrika
- D. Azie

MCQs



# Televic Dataset

The highest mountain in the world is \_\_\_\_

- A. Mont Blanc
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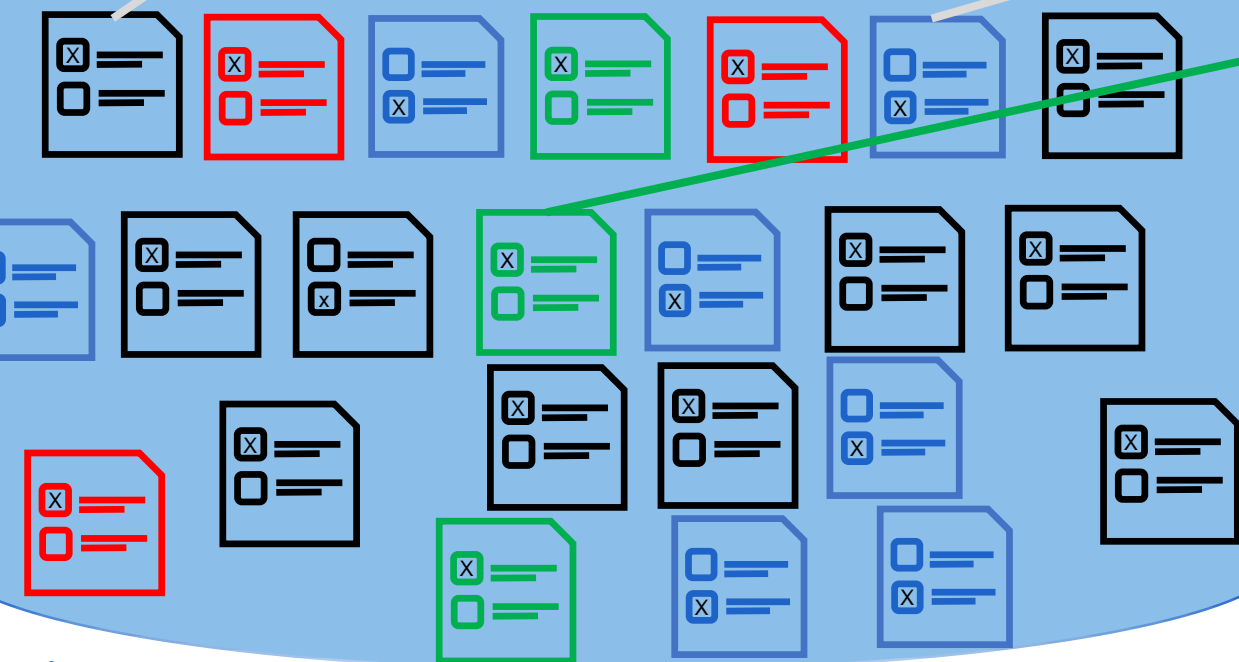
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- A. Antarctica
- B. Europa
- C. Afrika
- D. Azie

By this time next month we \_\_\_\_ the designs.

- A. will have finished
- B. are finishing
- C. will finish
- D. go to finish

MCQs



# Televic Dataset

The highest mountain in the world is \_\_\_\_

- A. Mont Blanc
- B. Kilimanjaro
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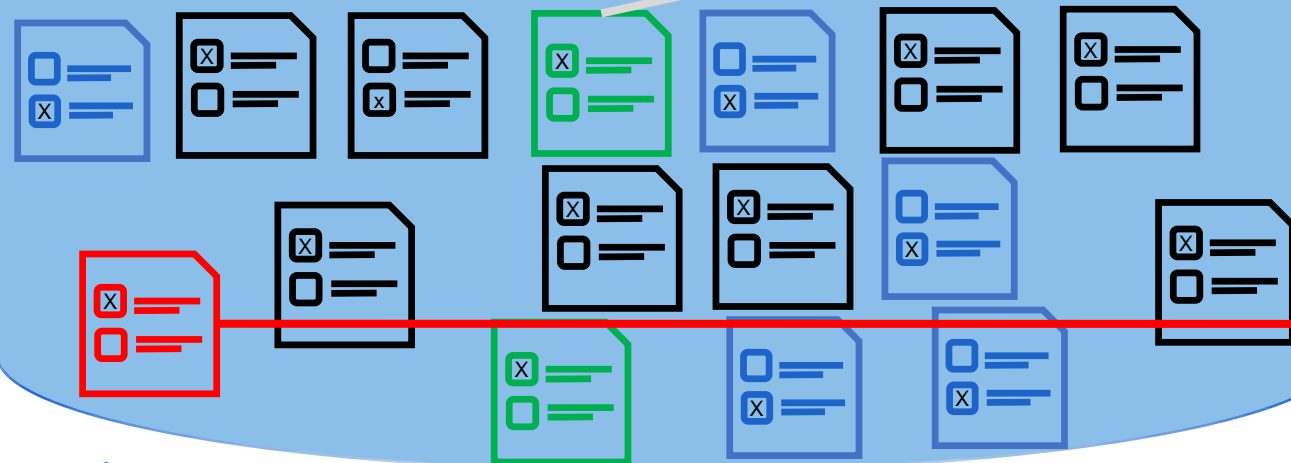
By this time next month we \_\_\_\_ the designs.

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Weet je nog wat de eerste mensensoort was?

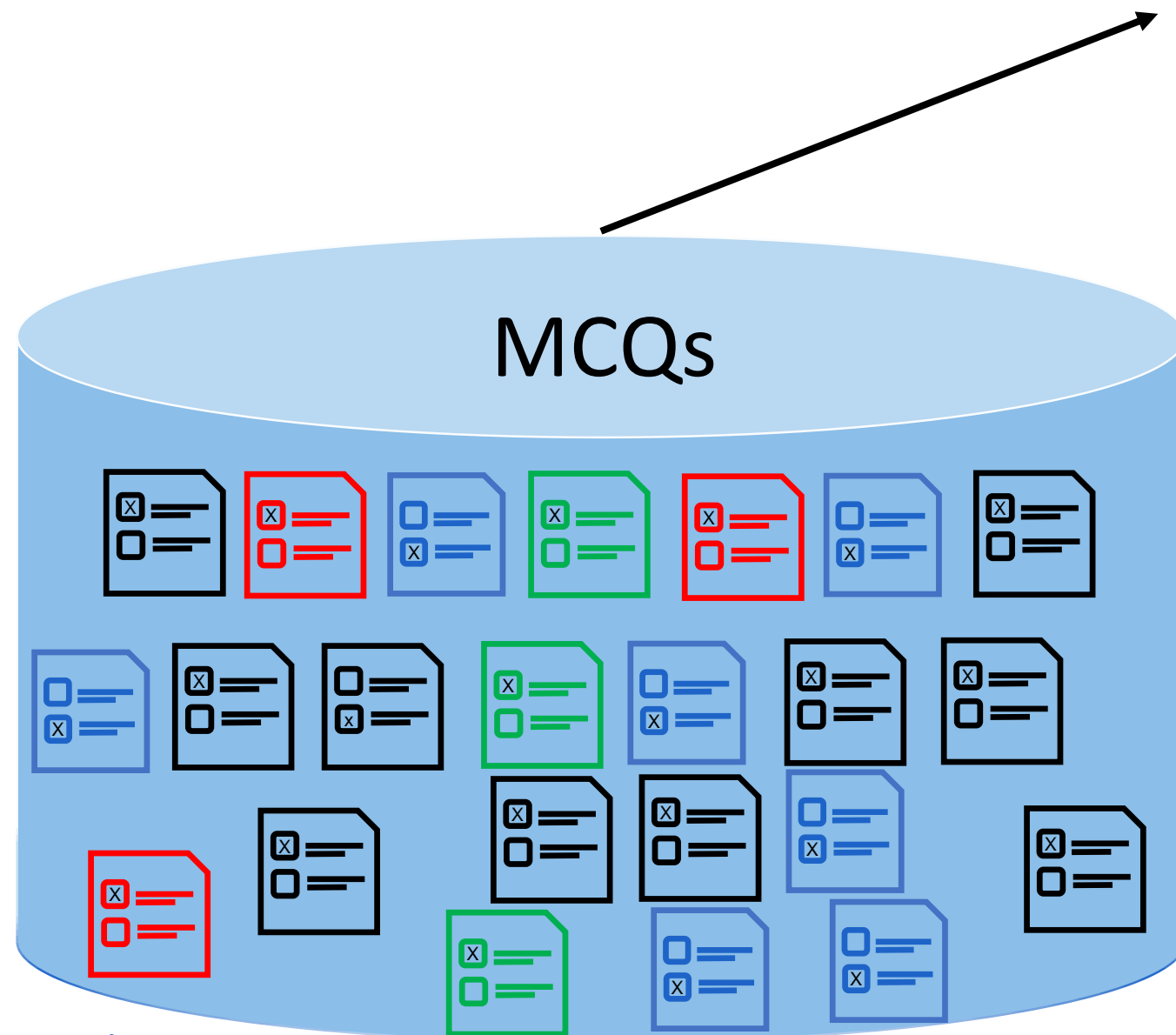
- A. Homo erectus
- B. Homo sapiens
- C. Homo habilis
- D. Homo neanderthalensis

MCQs



# Televic Dataset

Total of  
~ 62,000 MCQs



## Proposed Solution

Learn to rank the distractors  
according to their relevance to a  
question

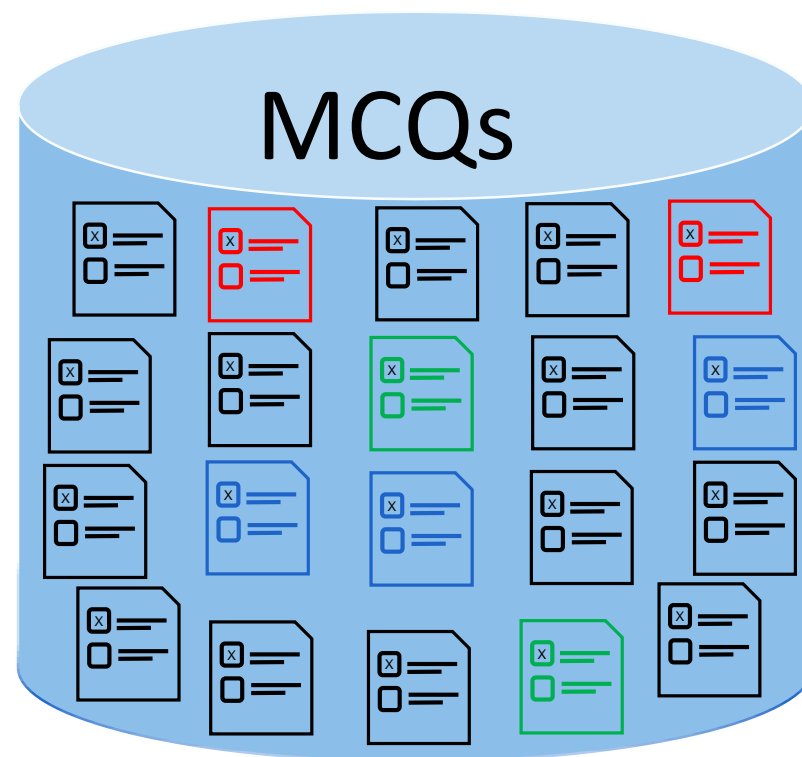
# Learning to rank distractors

Language Model (**LM**) based model ranks **existing** distractors



**Q:** The capital of Belgium is ...

**A:** Brussels



LM Ranking  
Model

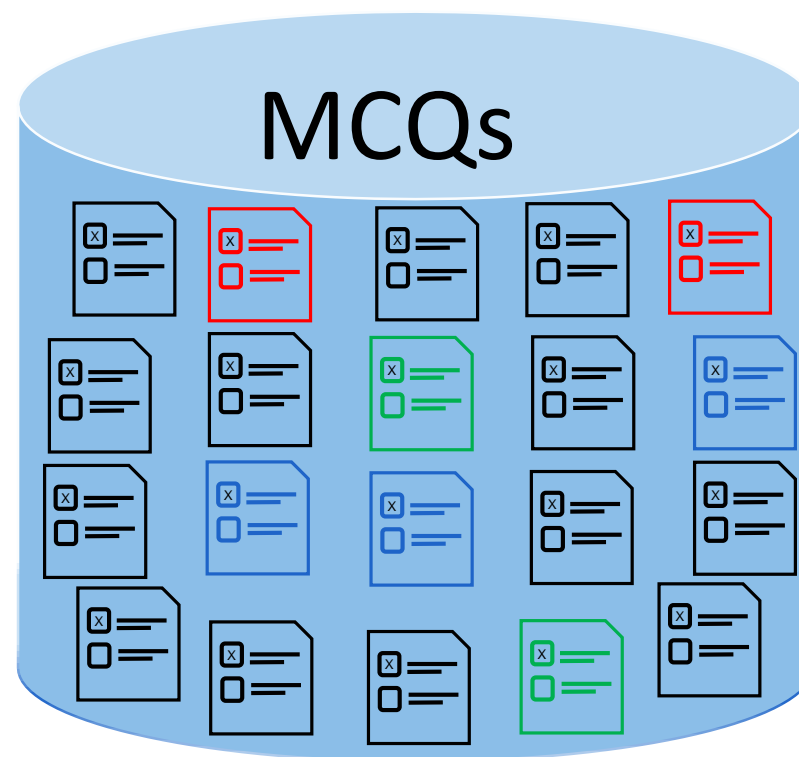
# Learning to rank distractors

Language Model (**LM**) based model ranks **existing** distractors



**Q:** The capital of Belgium is ...

**A:** Brussels



LM Ranking  
Model

## Ranked Distractors

1. Antwerp
2. Ghent
3. Amsterdam
- 4.

⋮

77008. will finish  
77009. kern  
77010. Ribosomen



# Our approach

We propose **three** models

# Our approach (Q-SIM)

- 1 Question Similarity (Q-SIM) model
  - Questions are **similar** if they share a distractor or an **answer**

# Our approach (Q-SIM)

## 1 Question Similarity (Q-SIM) model

- Questions are **similar** if they share a distractor or an **answer**

What is the capital of the Netherlands?

- A. The Hague      C. **Amsterdam**  
B. Rotterdam      D. Brussels

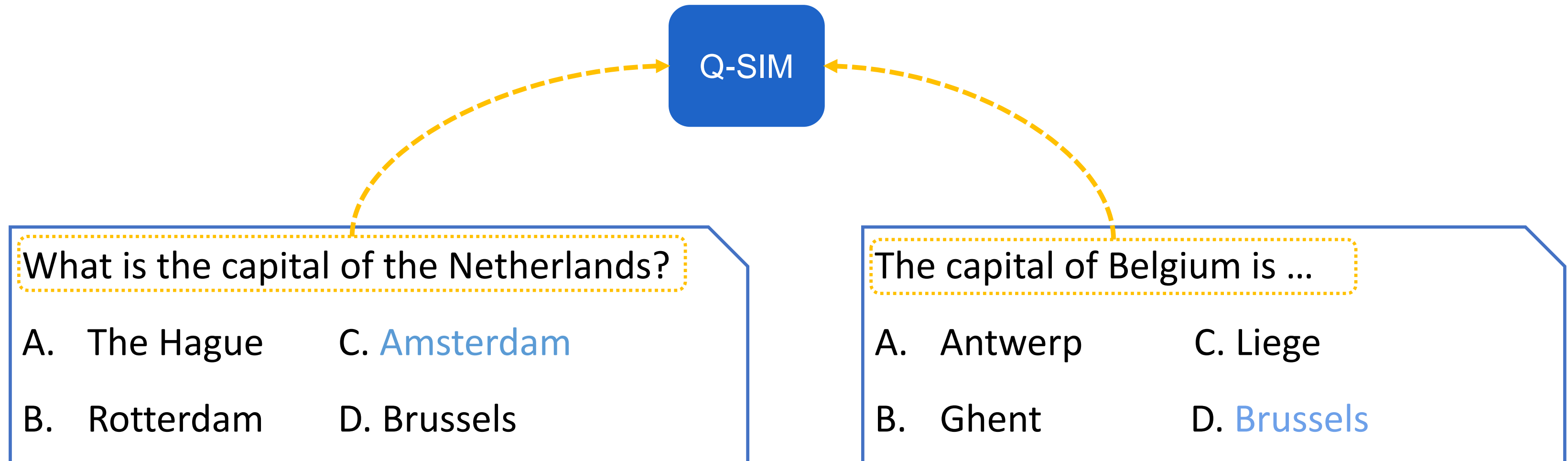
The capital of Belgium is ...

- A. Antwerp      C. Liege  
B. Ghent      D. **Brussels**

# Our approach (Q-SIM)

## 1 Question Similarity (Q-SIM) model

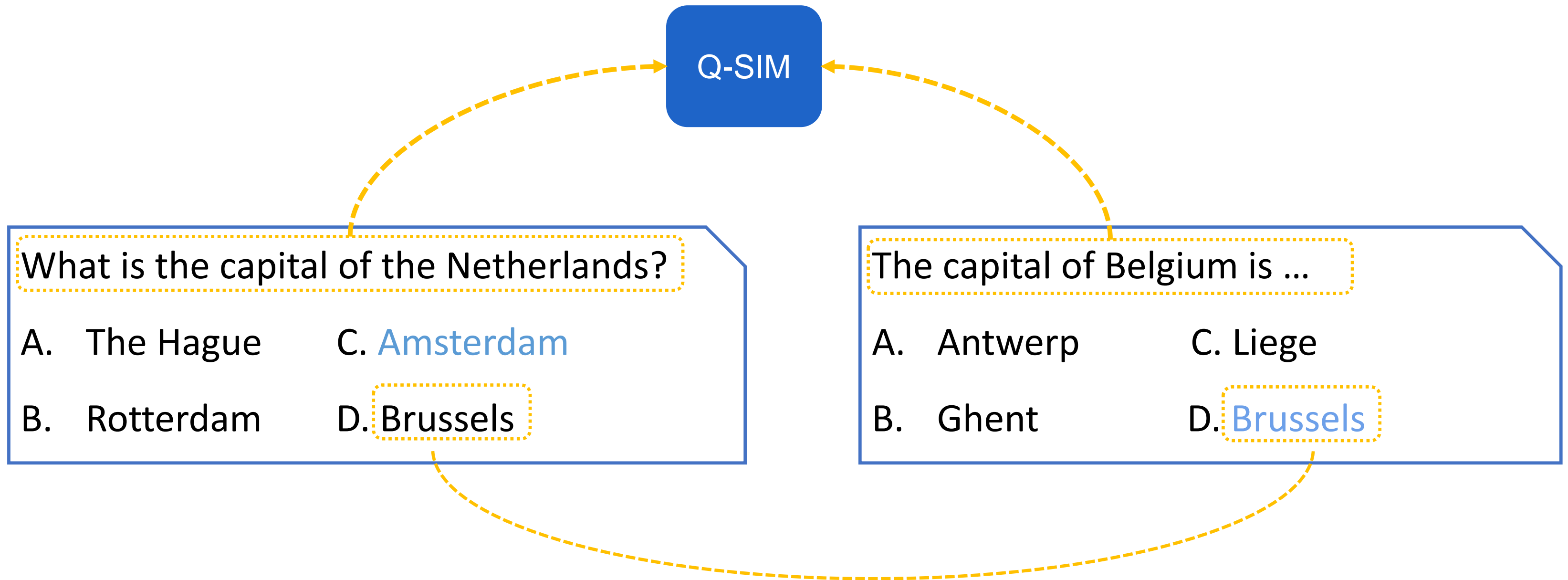
- Questions are **similar** if they share a distractor or an **answer**



# Our approach (Q-SIM)

## 1 Question Similarity (Q-SIM) model

- Questions are **similar** if they share a distractor or an **answer**



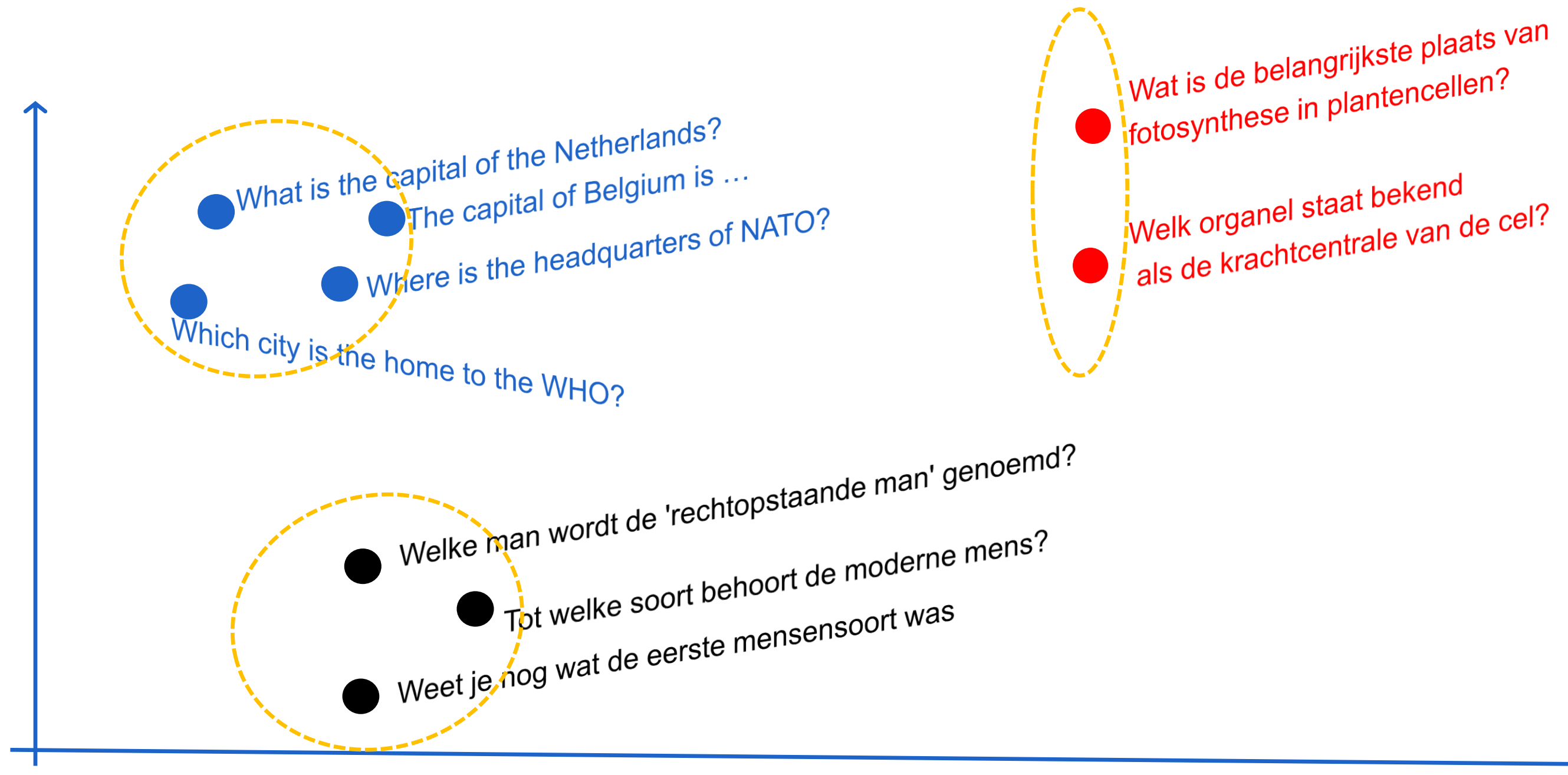
Because Brussels is shared

# Our approach (Q-SIM)

## 1 Question Similarity (Q-SIM) model

- Q-SIM clusters **similar** questions together

Q-SIM



# Our approach (D-SIM)

## 2 Distractor Similarity (D-SIM) model

- Distractors are **similar** if they co-occur within the same MCQ

# Our approach (D-SIM)

## 2 Distractor Similarity (D-SIM) model

- Distractors are **similar** if they co-occur within the same MCQ

What is the capital of the Netherlands?

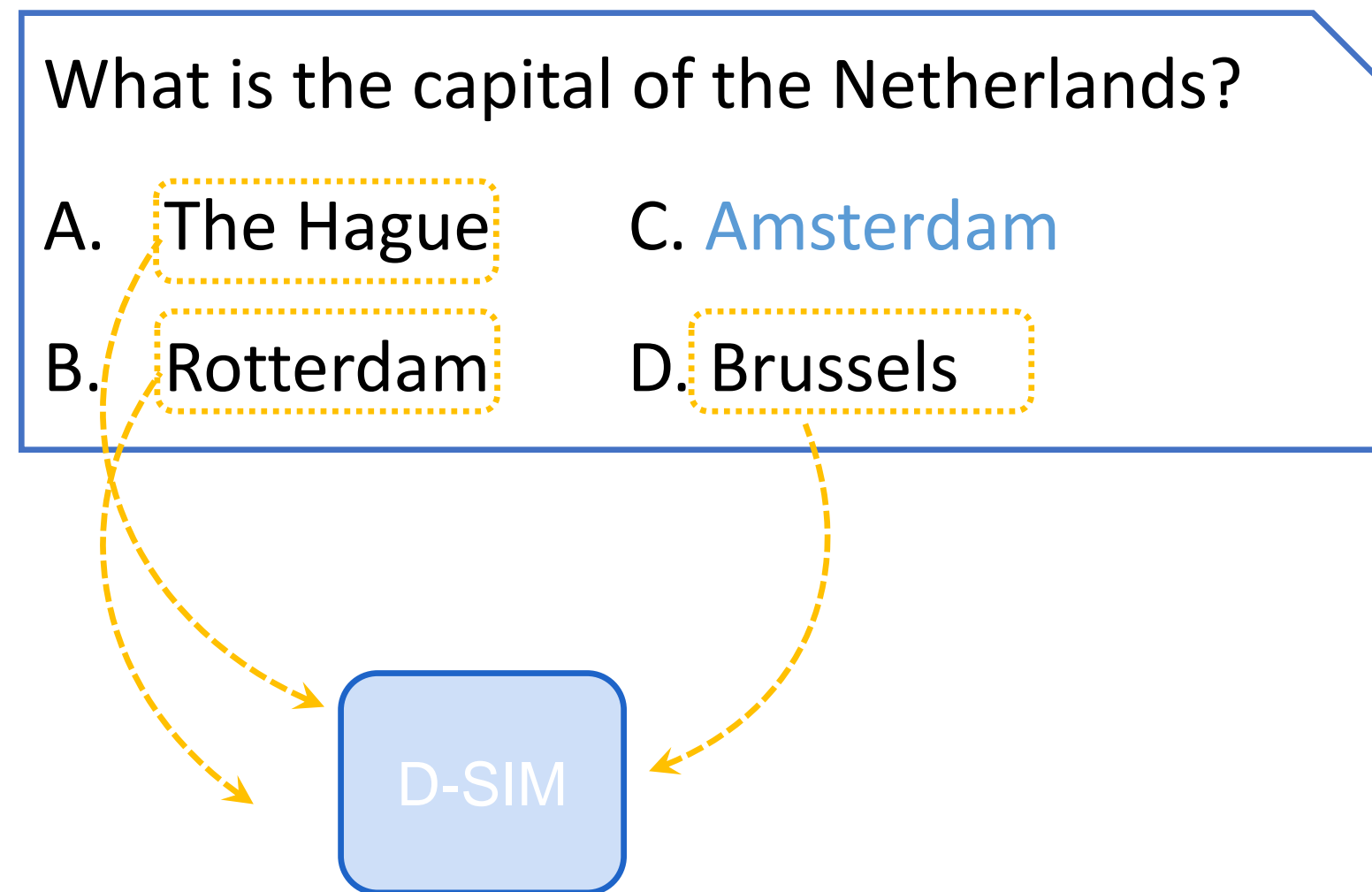
- |              |              |
|--------------|--------------|
| A. The Hague | C. Amsterdam |
| B. Rotterdam | D. Brussels  |



# Our approach (D-SIM)

## 2 Distractor Similarity (D-SIM) model

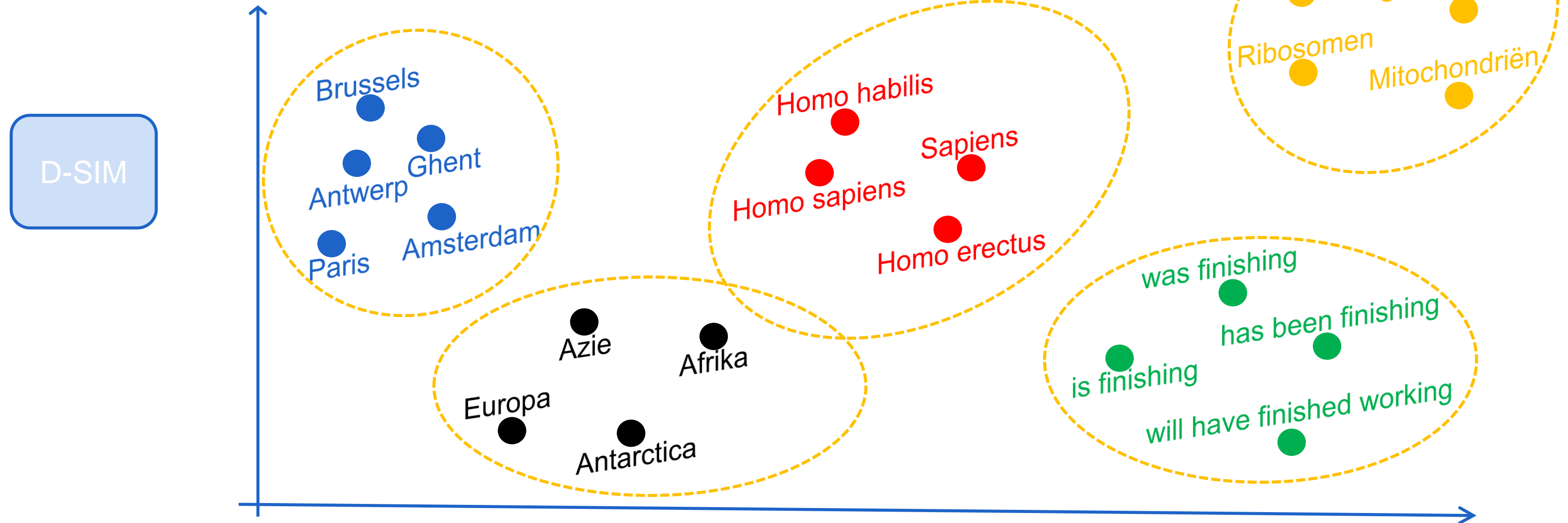
- Distractors are **similar** if they co-occur within the same MCQ



# Our approach (D-SIM)

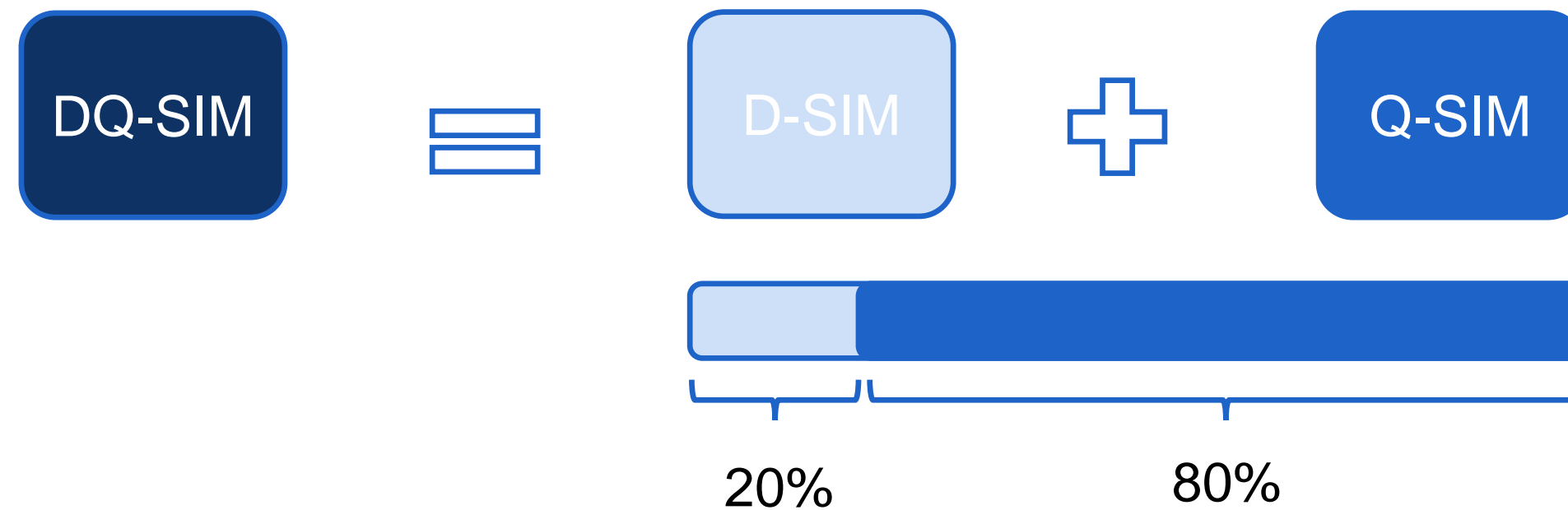
## 2 Distractor Similarity (D-SIM) model

- D-SIM clusters similar distractors together

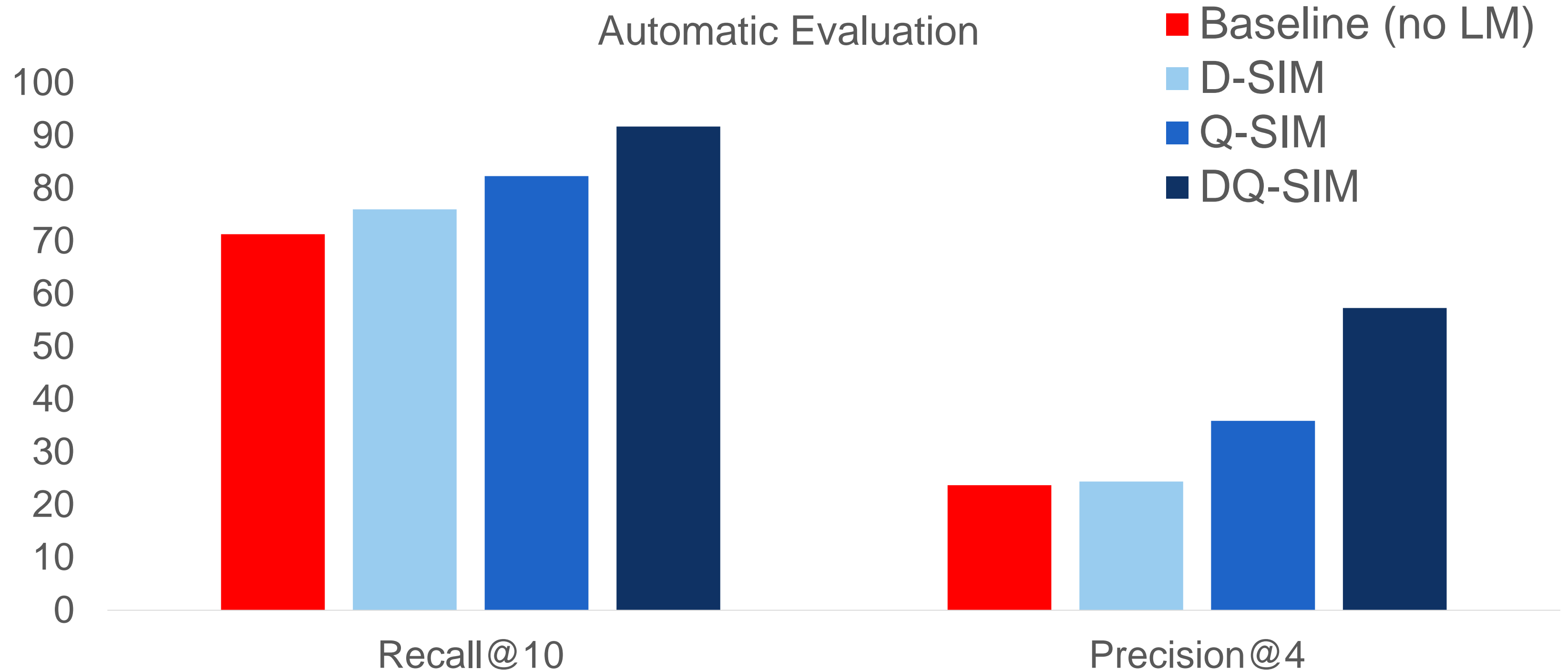


# Our approach (DQ-SIM)

- 3 Distractor-Question Similarity (DQ-SIM) model
- Combines Q-SIM and D-SIM

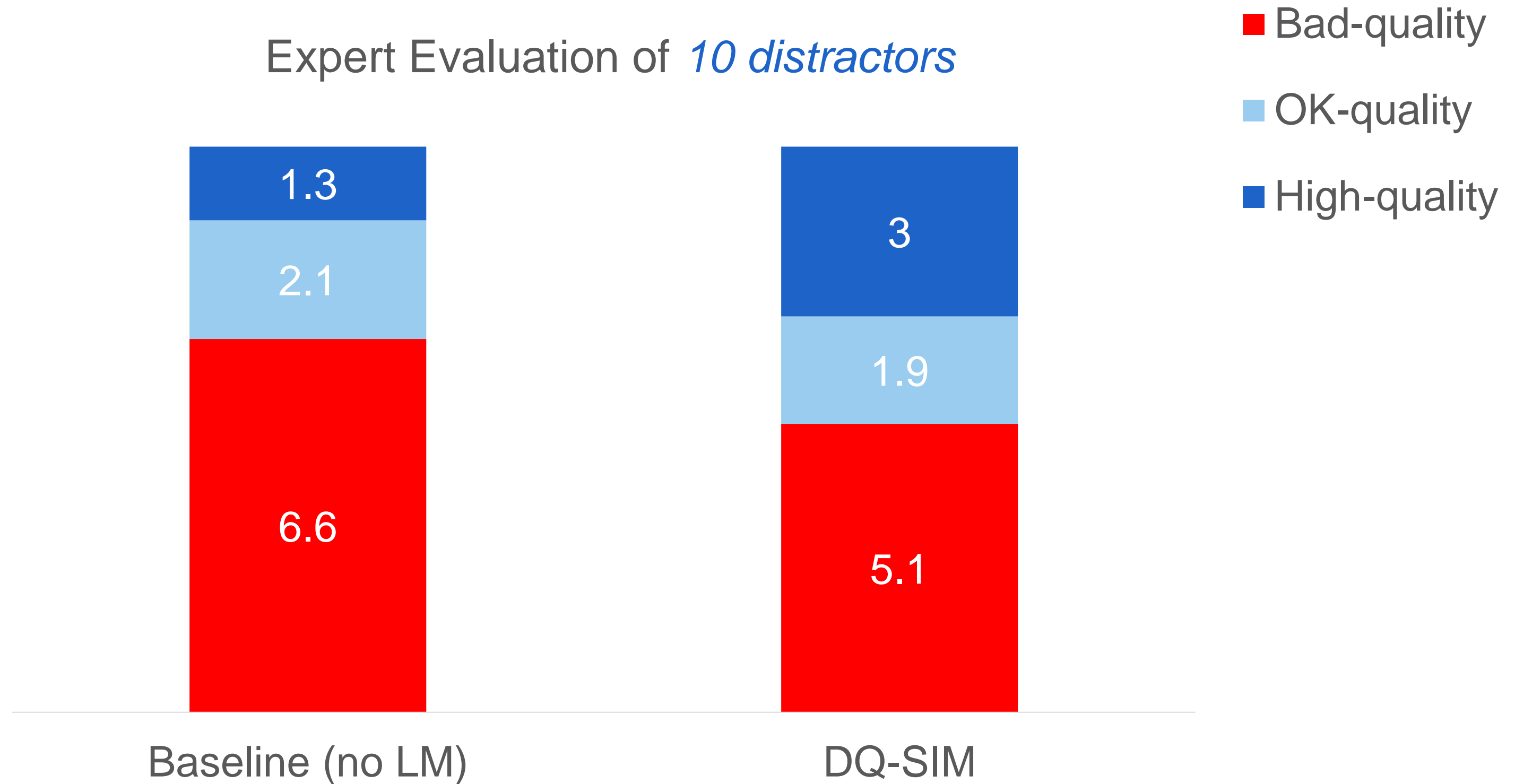


# Gain in performance using language models



# What do teachers say about our models?

Expert Evaluation of *10 distractors*



# What do teachers say about our models?

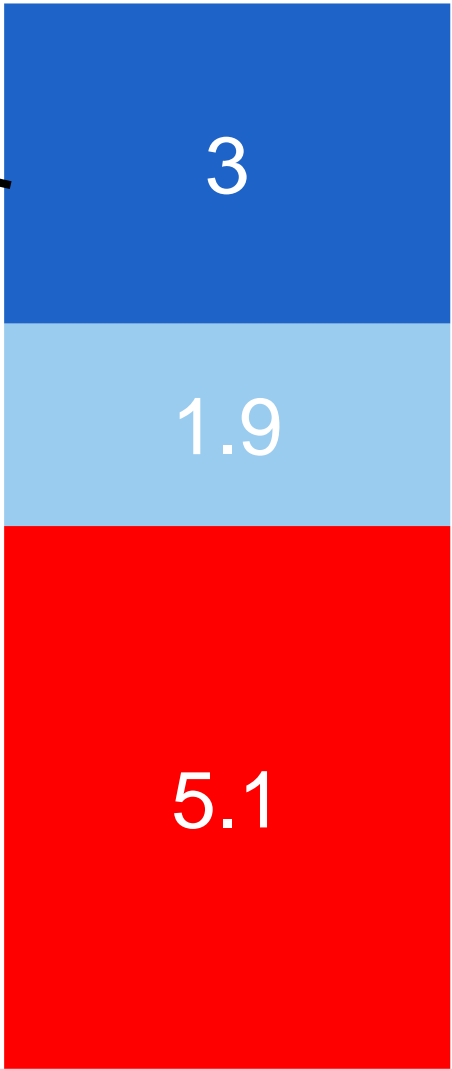
Expert Evaluation of 10 distractors

3 distractors high-quality out of 10

- Bad-quality
- OK-quality
- High-quality



Baseline (no LM)



DQ-SIM

# Our model in Televic's platform

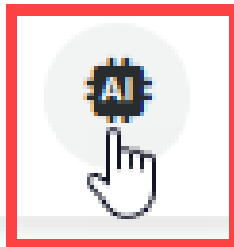
**Wat is de meest gebruikte pijnstiller in de Belgische ziekenhuizen?**

Selecteer het juiste antwoord.



☒ Paracetamol

 Keuze



# Our model in Televic's platform

t

/ Items / FVB / AIDA / Pijnstillers

Voorbeeld

:

ITEM

BLOK

KEUZE

X

+ Blok toevoegen

↺ ↻ 1 versie

💬 0 commentaren

Wat is de meest gebruikte pijnstiller in de Belgische ziekenhuizen?

Selecteer het juiste antwoord.

⦿ Paracetamol

+ Keuze ⚙️

Feedback

📄 Algemene feedback

➕ Positieve feedback

⊖ Negatieve feedback

Afleidingslijst voor 'Paracetamol'

☒ aspirine

Gemiddeld

☐ Apirine

Gemiddeld

☐ Acetylsali zuur

Gemiddeld

☐ asperine

Gemiddeld

☐ Asprinie

Gemiddeld

☐ NSAID

Gemiddeld

☒ Ibuprofen

Gemiddeld

☒ Morfine

Gemiddeld

3 afleiders geselecteerd

Annuleren

Toevoegen

Geselecteerde keuze

Indien juist

Feedback

Typ hier uw inhoud

Indien fout

Feedback

Typ hier uw inhoud

←

Keuze 1 / 1

→



# Our model in Televic's platform

t

/ Items / FVB / AIDA / Pijnstillers

Voorbeeld

ITEMBLOKKEUZE

X

Blok toevoegen

1 versie

0 commentaren

Wat is de meest gebruikte pijnstiller in de Belgische ziekenhuizen?

Selecteer het juiste antwoord.

B I U  $\frac{\square}{\square}$  A T<sub>T</sub> x<sub>2</sub> x<sup>2</sup> ↕ ✂ ☰ ▼ ☷ ▼ ☸ ▼ ☹ ▼ ☒ 🔗 🖼️ 🎥 🎵 📄 fx

☒ Paracetamol

☐ Aspirine

☐ Morfine

☐ iboprufen

+ Keuze ⚙️

min. 0 max. 1

Feedback

i Algemene feedback

+ Positieve feedback

- Negatieve feedback

Opties

Afleidings toegevoegd  
3 afleidings zijn met succes toegevoegd

Media

Dit blok heeft nog geen media

Opmaak



Users say about our models?

Expert Evaluation

3 distractors high-quality out of 10

televisic

Two months later



released ChatGPT



80%  
70%  
60%  
50%  
40%  
30%  
20%  
10%  
0%

DQ-SIM  
■ High-quality ■ OK-quality ■ Bad-quality

# Distractor Generation

## Using Generative language models

# Research questions

1. How to automatically generate distractors?

2. How to design a system that generates **free-form** distractors?

# Free-form Distractor Generation

- **Recap:** the previous methods **CANNOT** generate brand new distractors

# Free-form Distractor Generation

- **Recap:** the previous methods **CANNOT** generate brand new distractors
- **Solution:** Ask LLMs such as ChatGPT to generate distractors (***Zero-ChatGPT***)

# Free-form Distractor Generation

- **Recap:** the previous methods **CANNOT** generate brand new distractors
- **Solution:** Ask LLMs such as ChatGPT to generate distractors (***Zero-ChatGPT***)

Original Question and Correct Answer:

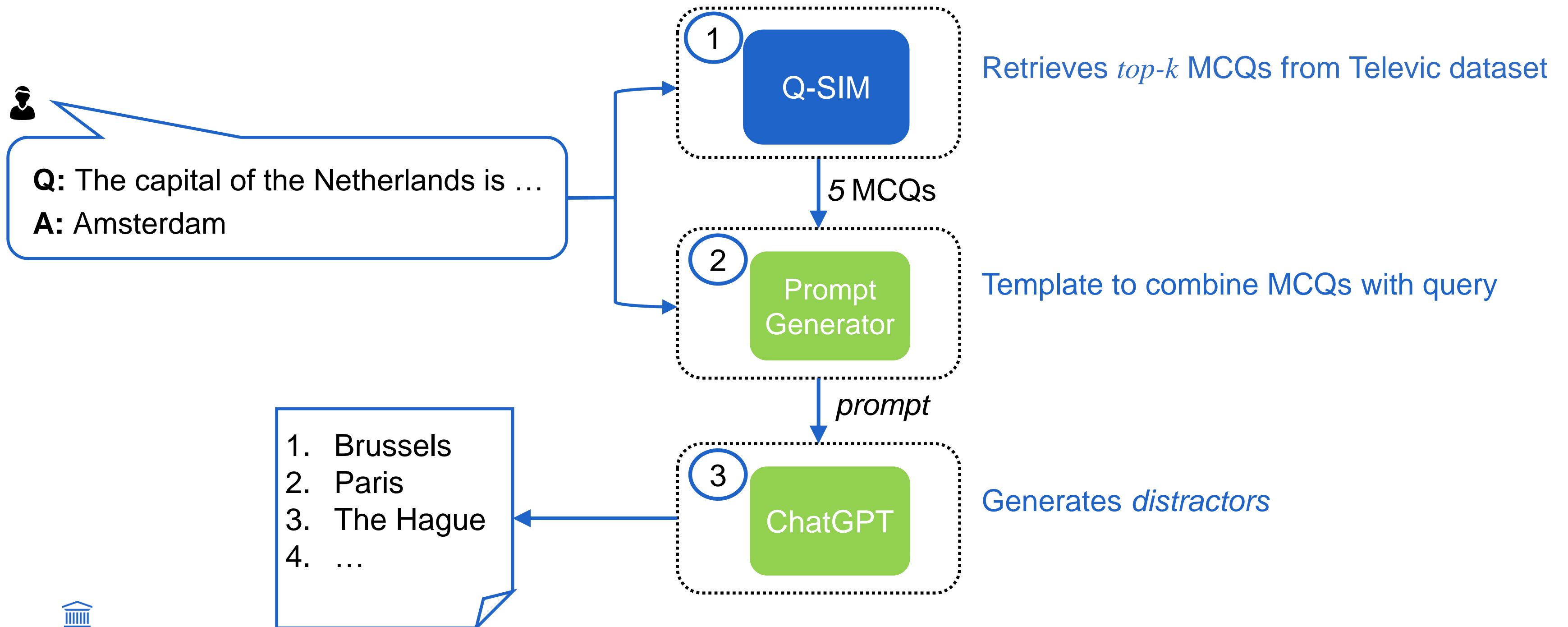
The capital of the Netherlands is ...  
Amsterdam

Zero-shot prompt input:

Generate 10 plausible but incorrect answers for the following question.  
**Question:** The capital of the Netherlands is ...  
**Answer:** Amsterdam

# Our approach (Dynamic-ChatGPT)

- We proposed a pipeline approach with three components

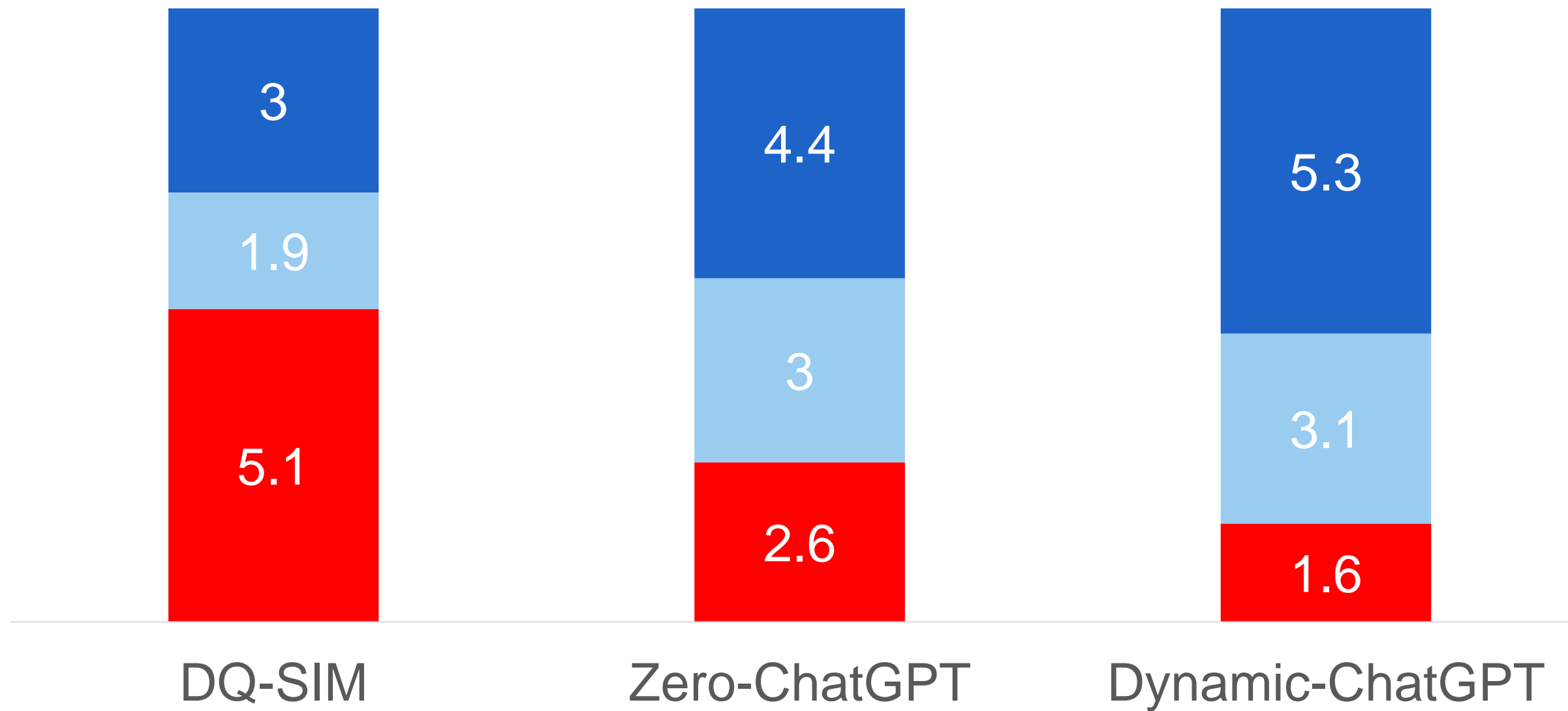




# Performance gain on quality of generated distractors

Expert Evaluation of *10 distractors*

- Bad-quality
- OK-quality
- High-quality



# Gap-filling Grammar

## Exercise Generation

# Research questions

1. How to automatically generate distractors?
2. How to design a system that generates free-form distractors?
3. How to adapt a language model to **generate gap-fill** grammar exercises?

# Gap-filling Grammar Exercise Generation

Gap-filling grammar exercise important in **formative** assessment

# Gap-filling Grammar Exercise Generation

new tense



# Gap-filling Grammar Exercise Generation

new tense



John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

# Gap-filling Grammar Exercise Generation

new tense



Past tense

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

# Gap-filling Grammar Exercise Generation

new tense



Past tense

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

Input

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.



# Gap-filling Grammar Exercise Generation

new tense



Past tense

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

Input

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

LM-based  
Exercise  
Generator

Output

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

# Gap-filling Grammar Exercise Generation

new tense



Future tense

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

Input

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

LM-based  
Exercise  
Generator

# Gap-filling Grammar Exercise Generation

new tense



Future tense

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

Input

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

LM-based  
Exercise  
Generator

Output

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

# Gap-filling Grammar Exercise Generation

combine tenses



Past + Future

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

Input

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

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LM-based  
Exercise  
Generator

# Gap-filling Grammar Exercise Generation

combine tenses



Past + Future

John arrived from the airport yesterday at 8:00. He checked into the hotel at 9:00, and met his colleagues at 10:00. He will present his work tomorrow.

Input

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

LM-based  
Exercise  
Generator

Out put

Guardiola admitted there was a deliberate ploy in this game to use Debruyne to unlock Arsenal. It worked to devastating effect.

City will play Chelsea in next week.

# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))

Input

City will play Chelsea in next week.

# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))



City

This block shows the extracted span 'City' in a light gray box, representing the output of the first step.

# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))



City will

City



# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))

Input  
City will play Chelsea in next week.

City will

City

City will play

# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))

Input

City will play Chelsea in next week.

City will

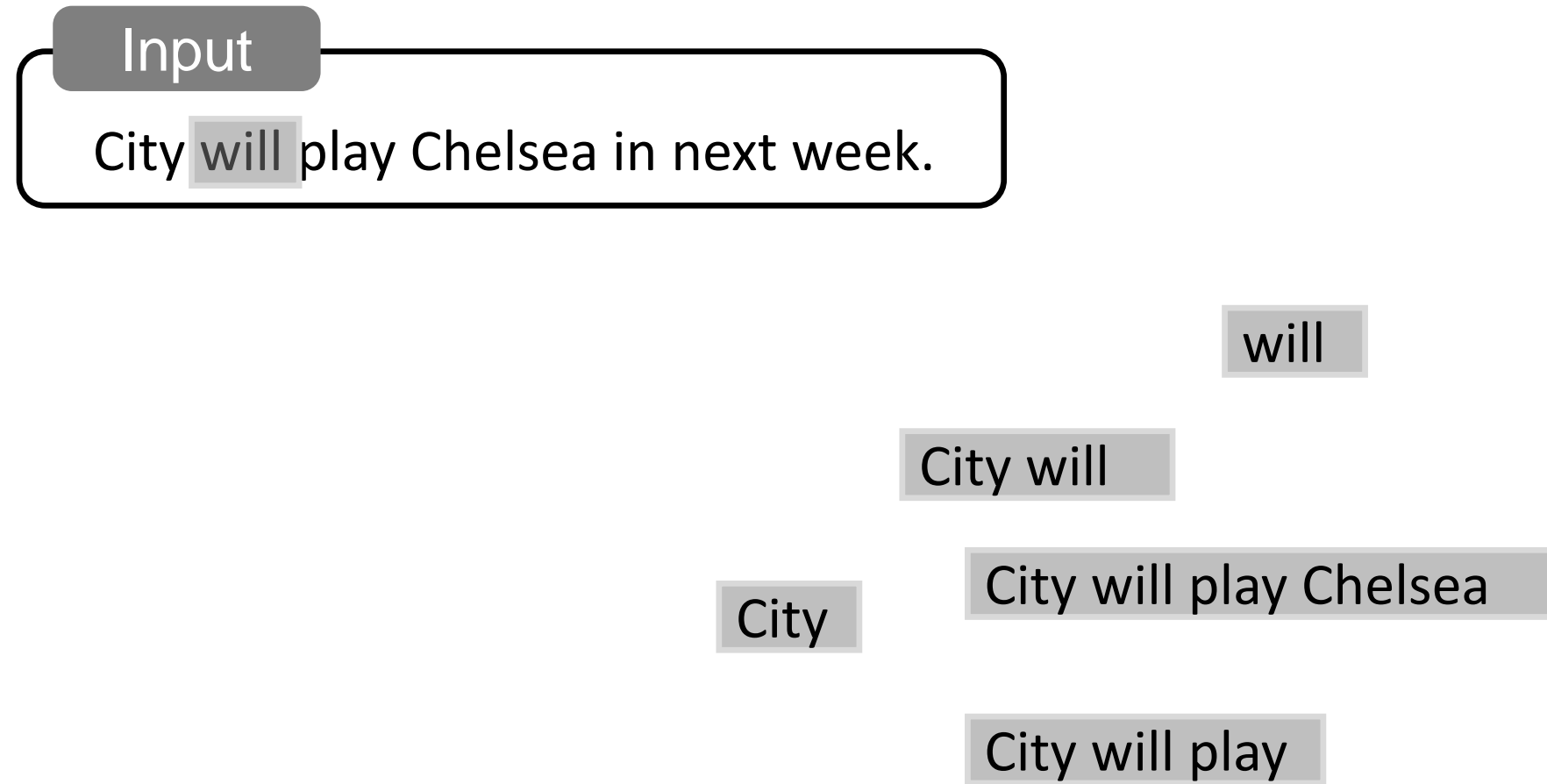
City

City will play Chelsea

City will play

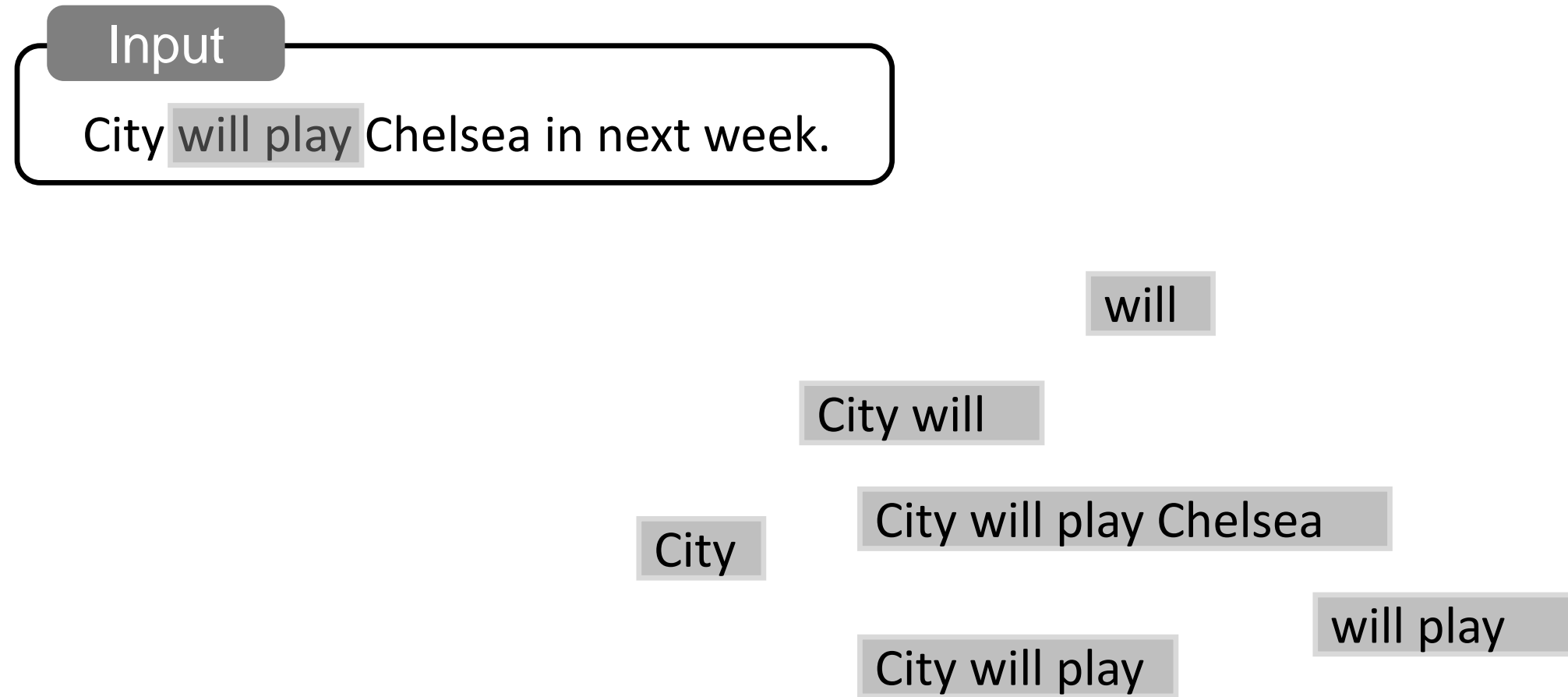
# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))



# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))

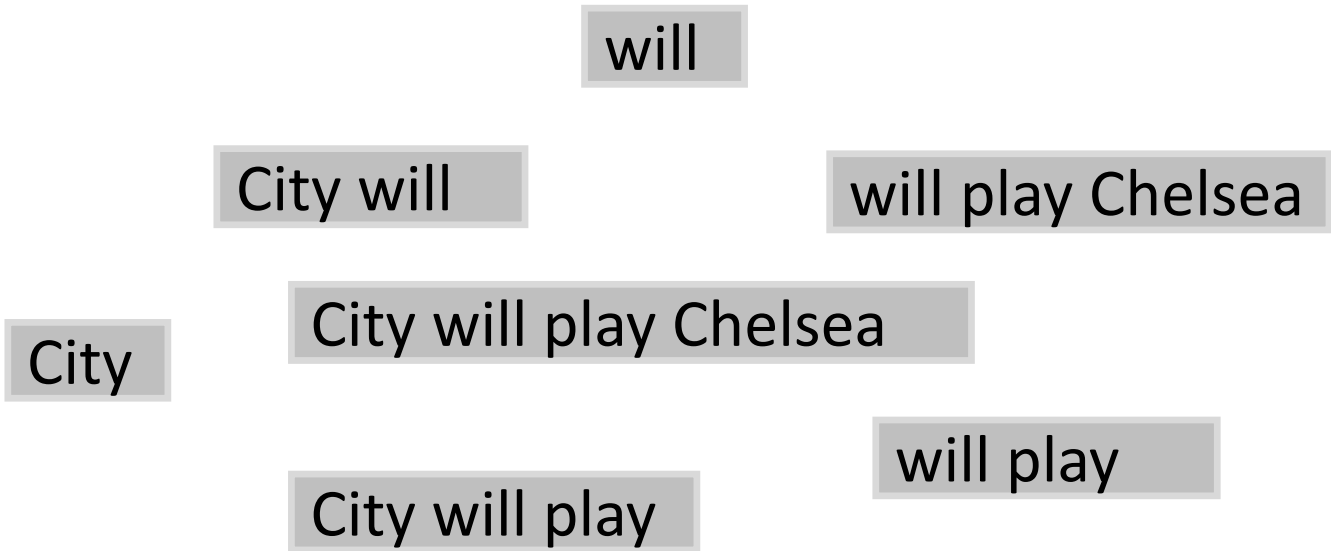


# Our approach

- 1 Given input text, extract spans (e.g. size of 4)

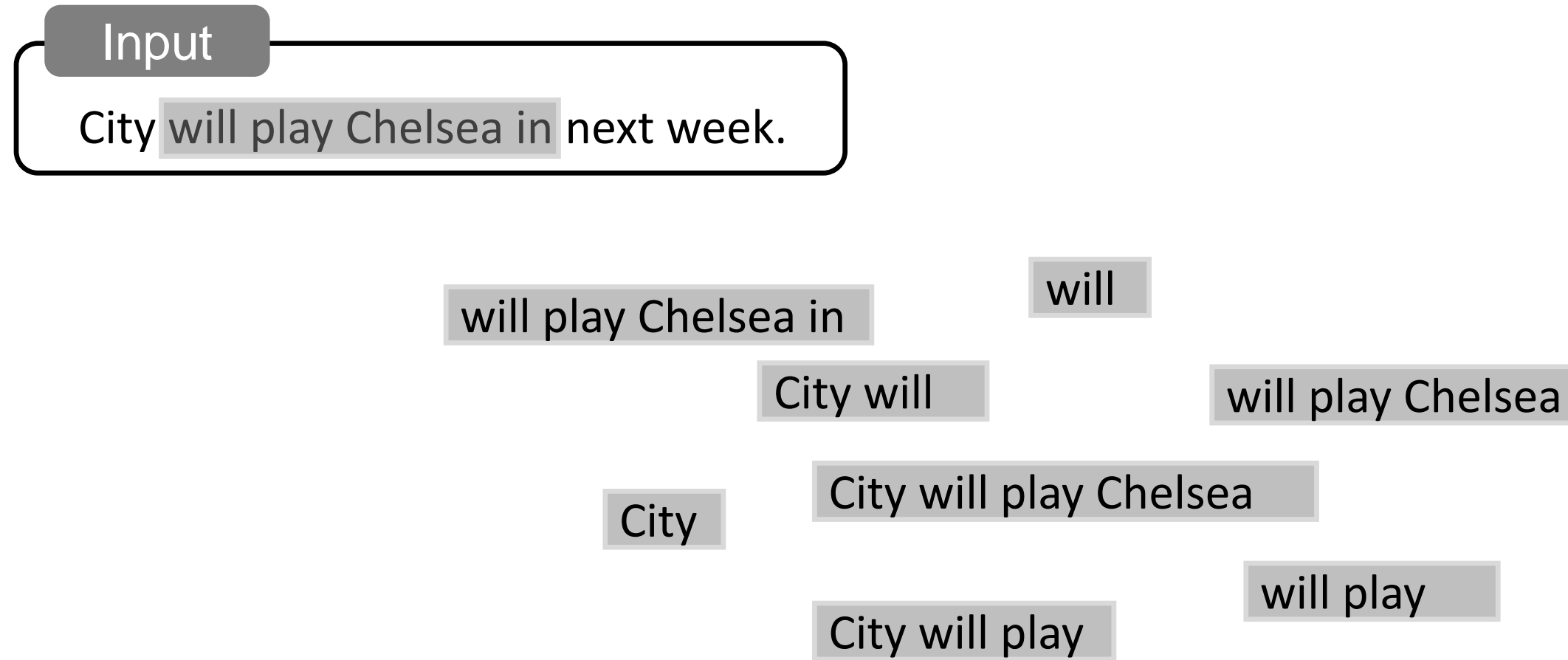
Input

City will play Chelsea in next week.



# Our approach

- 1 Given input text, extract spans (e.g. [size of 4](#))



# Our approach

1 Given input text, extract spans (e.g. *size of 4*)

Input  
City will play Chelsea in next week.

will play Chelsea in      will

City will      will play Chelsea

City      City will play Chelsea

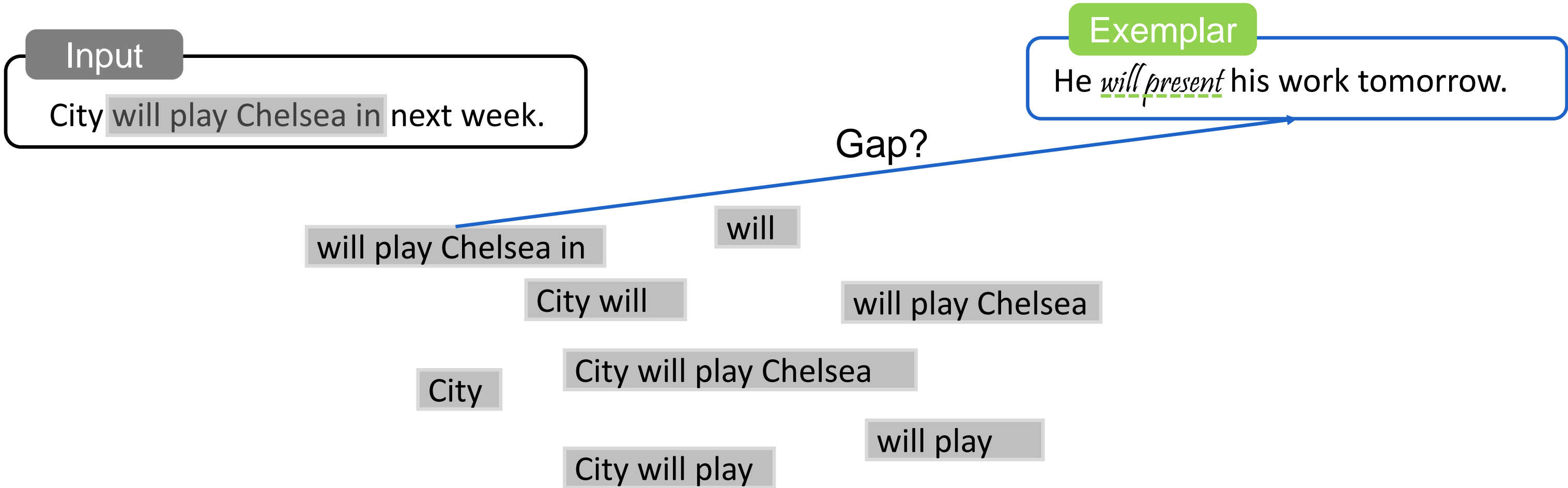
City will play      will play

2 Decide if each span is a suitable gap based on example

Exemplar  
He will present his work tomorrow.

# Our approach

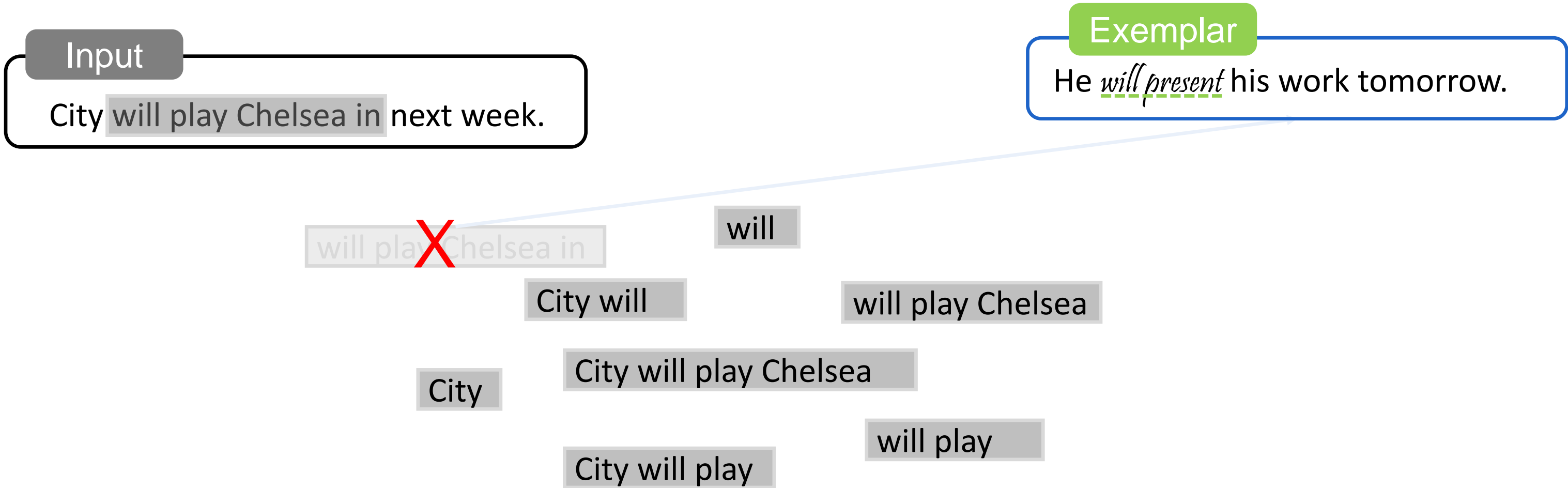
- 1
- Given input text, extract spans (e.g. size of 4)
- 2
- Decide if each span is a suitable gap based on example





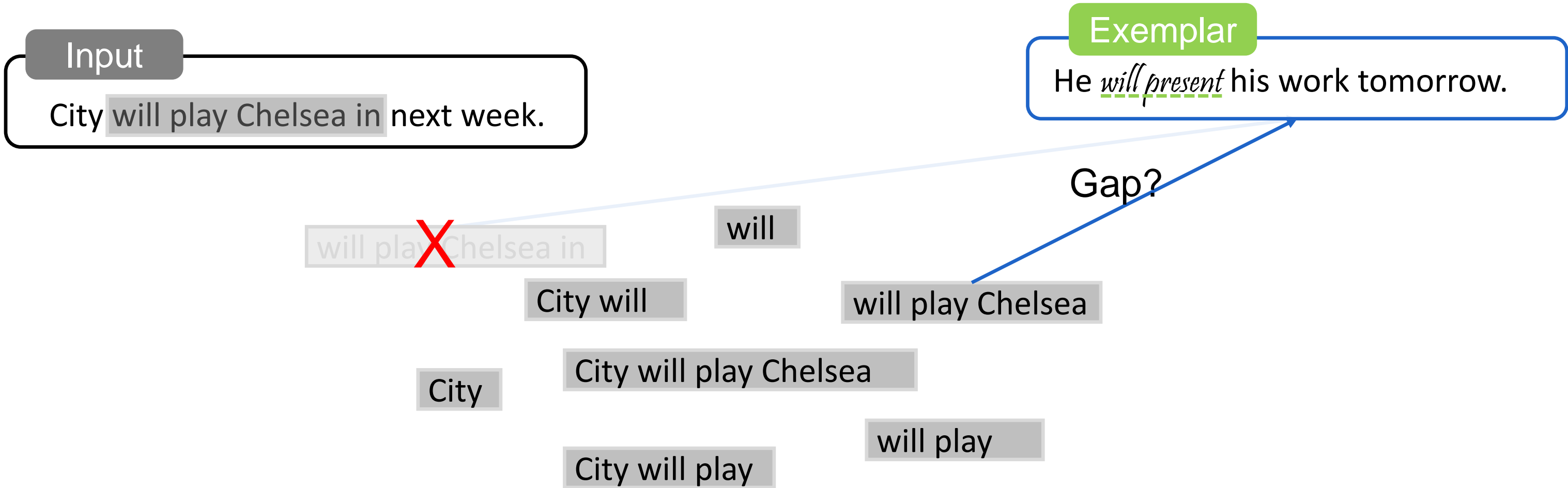
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- 1
- Given input text, extract spans (e.g. size of 4)
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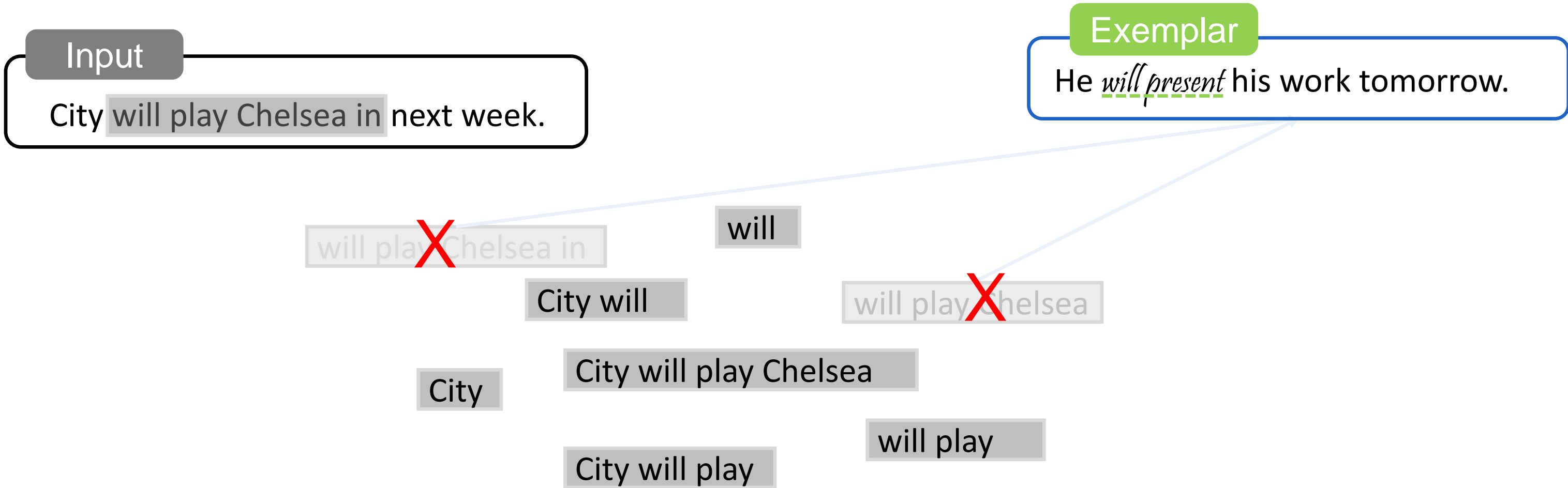
# Our approach

- 1
- Given input text, extract spans (e.g. size of 4)
- 2
- Decide if each span is a suitable gap based on example



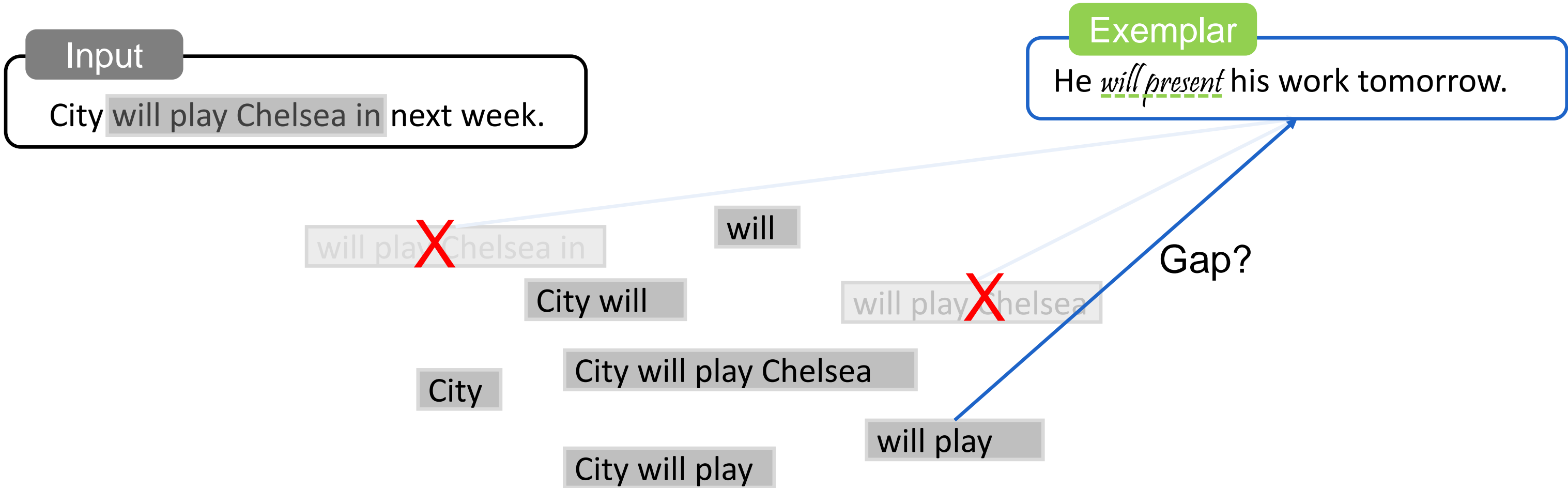
# Our approach

- 1
- Given input text, extract spans (e.g. size of 4)
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- Decide if each span is a suitable gap based on example



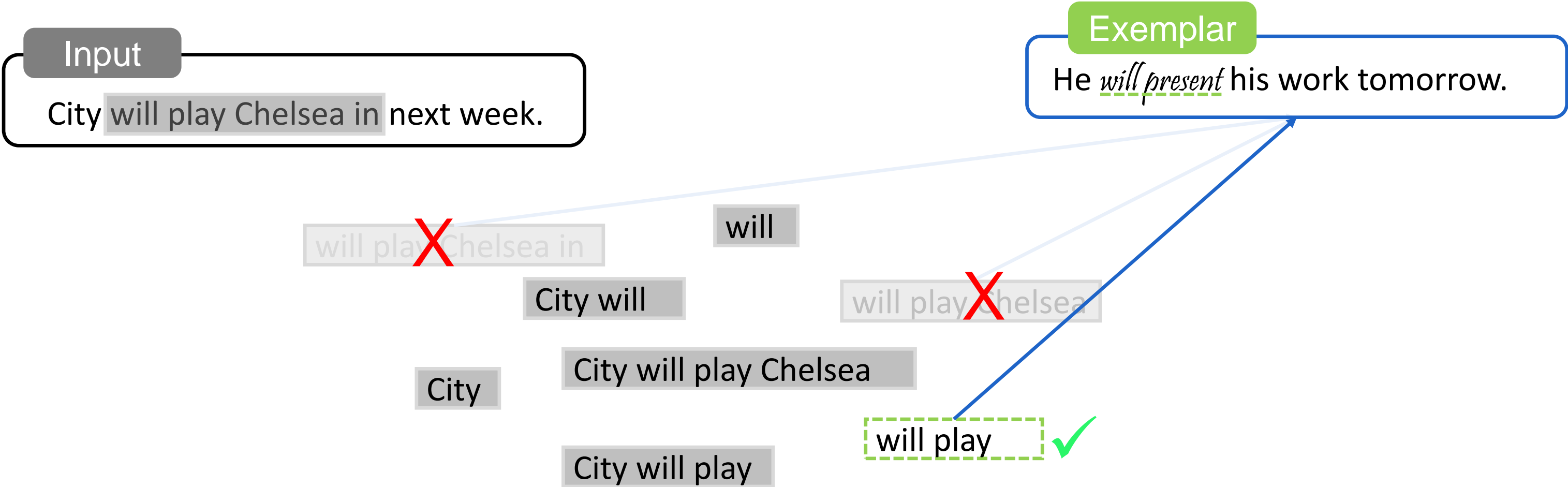
# Our approach

- 1
- Given input text, extract spans (e.g. size of 4)
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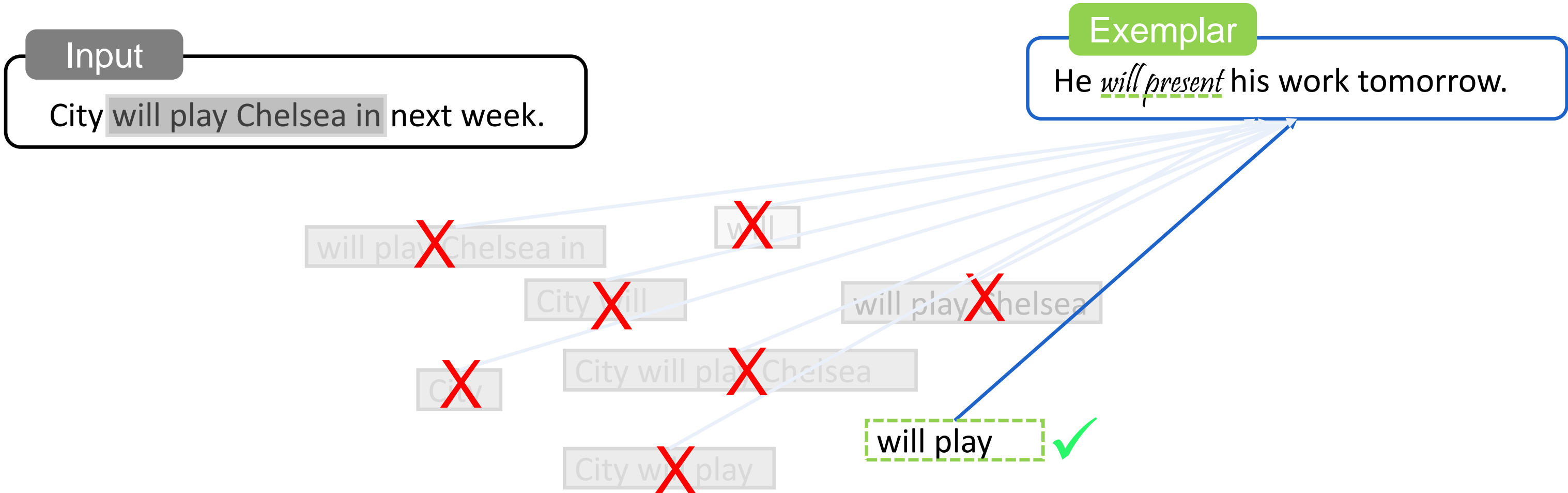
# Our approach

- 1
- Given input text, extract spans (e.g. size of 4)
- 2
- Decide if each span is a suitable gap based on example



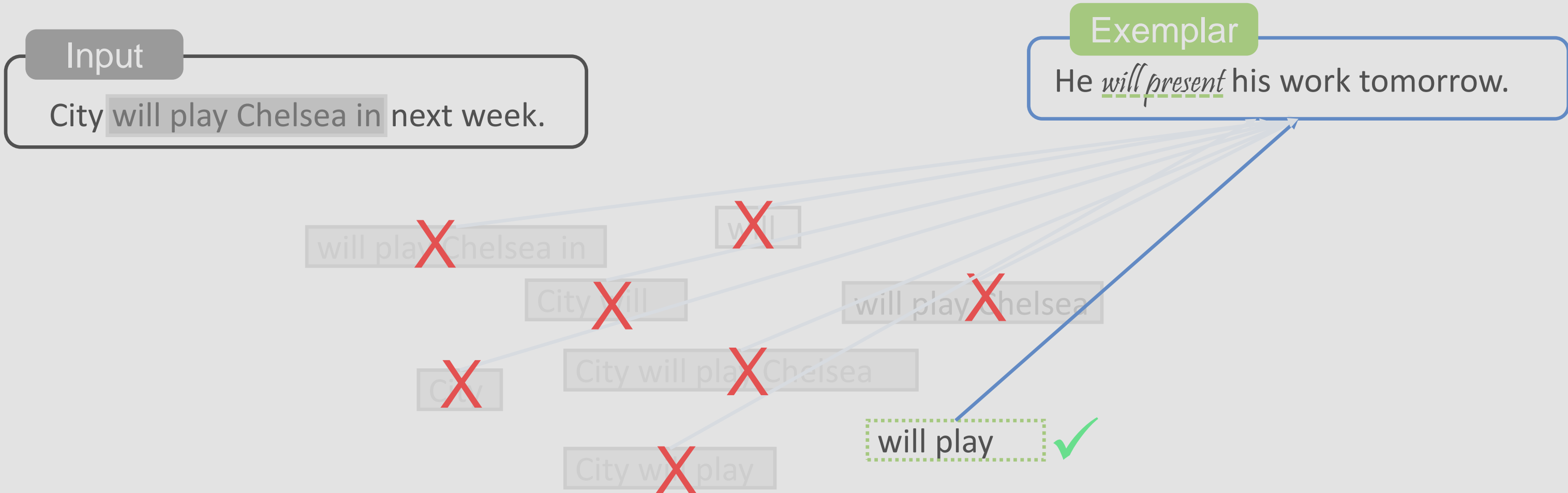
# Our approach

- 1
- Given input text, extract spans (e.g. size of 4)
- 2
- Decide if each span is a suitable gap based on example



# Our approach

- 1
- Given input text, extract spans (e.g. size of 4)
- 2
- Decide if each span is a suitable gap based on example



New Exercise

City will play Chelsea in next week.

# GF2 Grammar Dataset

A real-world corpus of existing exercises on mixed grammar topics

- ~ 800 exercise documents
- French grammar exercises

## Example 1

- 1 Vous travaillerez beaucoup?  
1 Will you work a lot?
- 2 En ne mangeant plus de bonbons,  
tu maigriras vite!  
2 By not eating sweets, you will lose  
weight quickly!
- 3 J'espère que mon équipe favorite  
ne perdra plus aucun match.  
3 I hope my favorite team won't lose any  
more games.
- 4 Maxime m'a promis qu'il ne  
mentira plus jamais.  
4 Maxime promised me that he will never  
lie again.
- 5 Maman préparera des spaghettis ce soir.  
5 Mum will make spaghetti tonight.

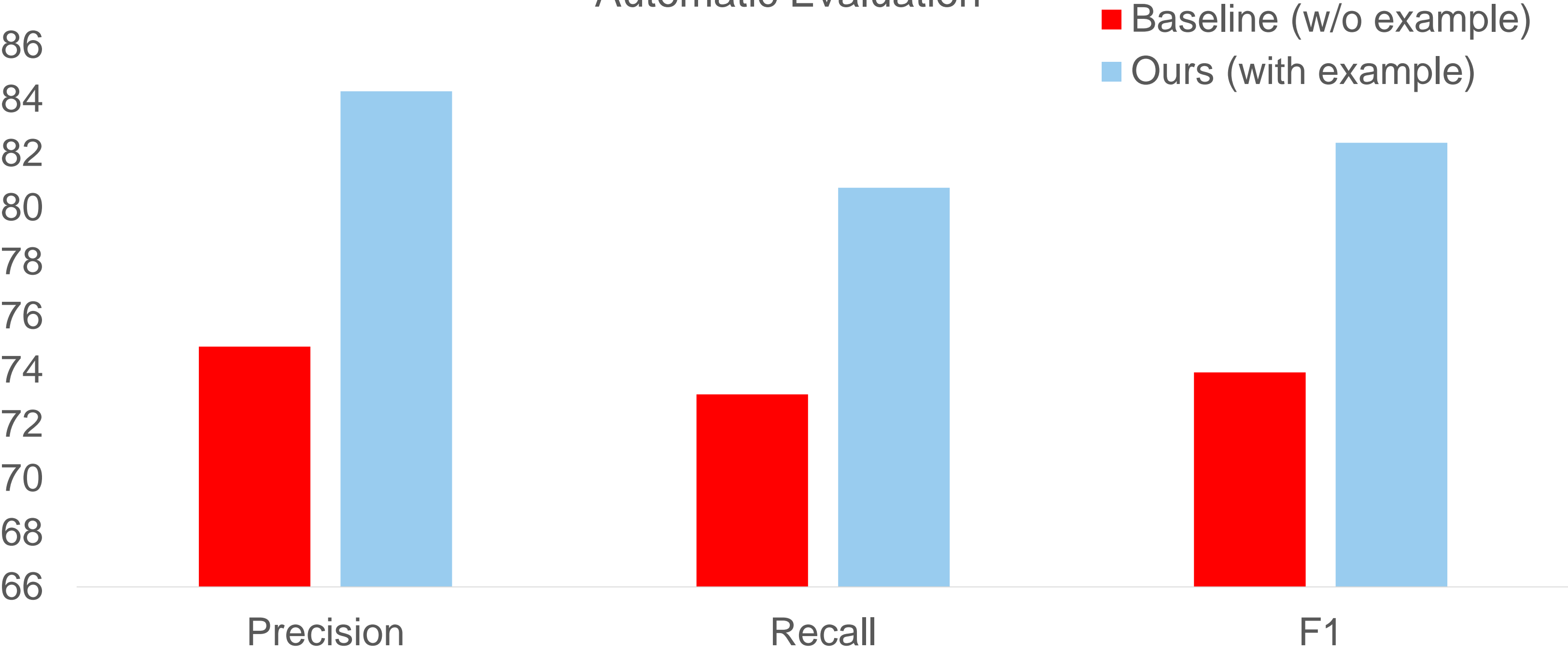
## Example 2

A l'âge de 27 ans, le Californien David Blancarte  
At the age of 27, Californian David Blancarte had  
a eu un grave accident de scooter. Quand il s'est  
a serious scooter accident. When he woke up  
réveillé à l'hôpital, il ne sentait plus ses  
in the hospital, he no longer felt his  
jambes. On lui a expliqué qu'il ne pourrait  
legs. It was explained to him that he couldn't  
plus marcher. C' était une vraie catastrophe  
walk anymore. It was a real disaster for him!  
pour lui! Pendant une longue période de  
During a long period of rehabilitation, he learned  
revalidation, il a appris à se déplacer en chaise.  
to move around in a wheelchair.  
roulante. ...



# Gain in performance using our approach

Automatic Evaluation



# Take-away Messages

# Burden on educators

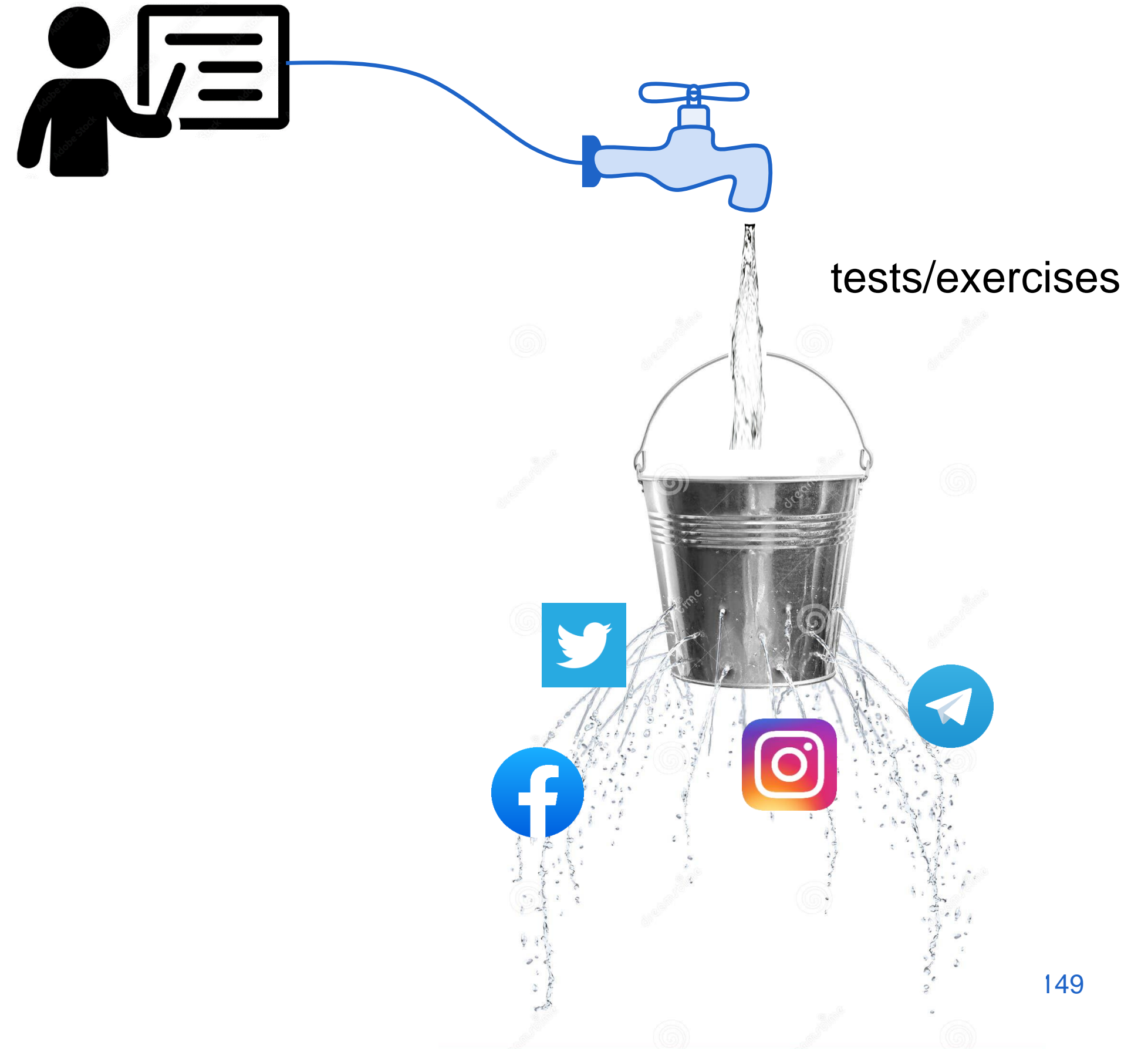


# Burden on educators

Tiny bit less burden!

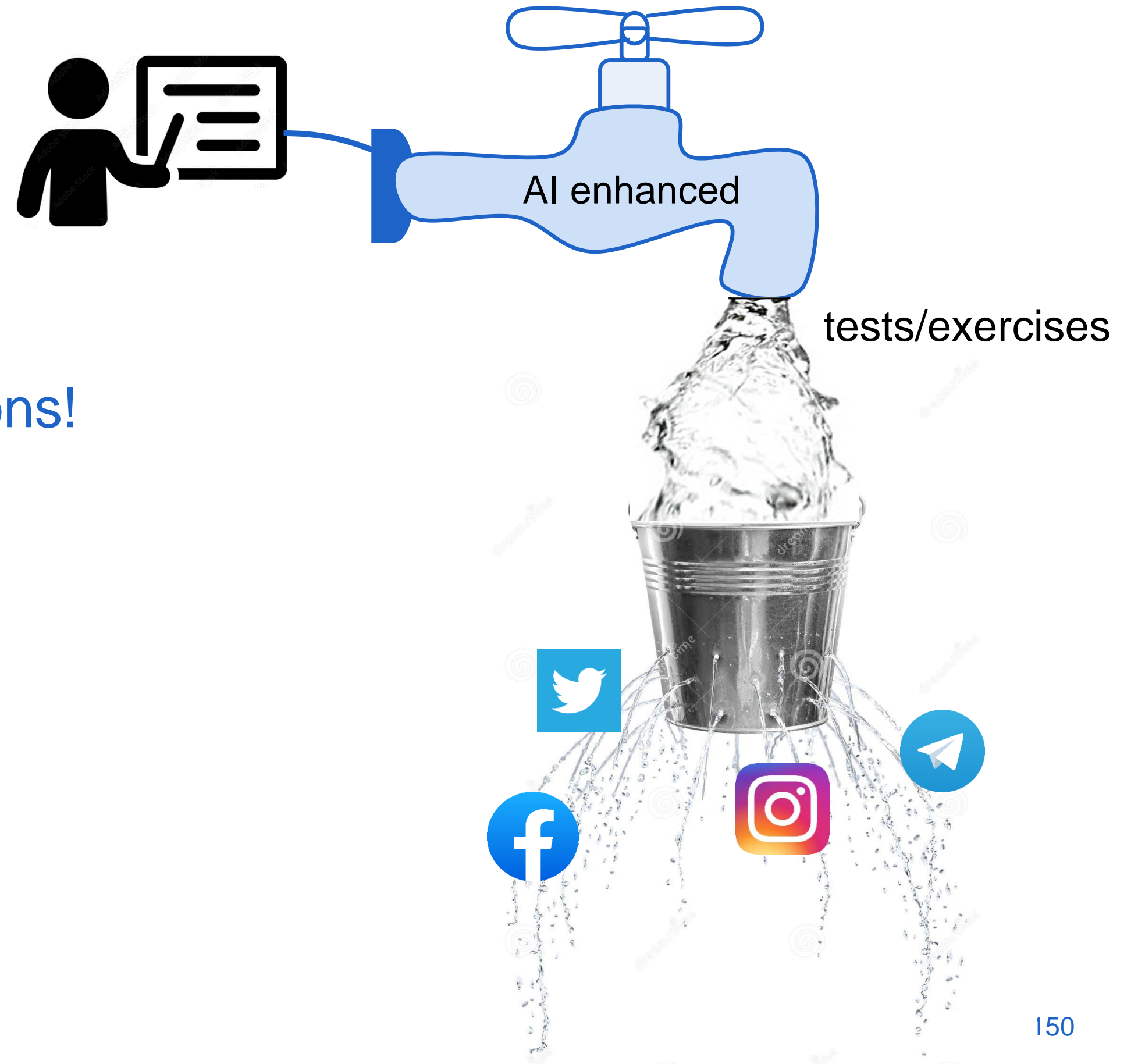


# Single-use dilemma





# Single-use dilemma



Ability to generate many questions!

# Distractor Generation

- Smartly combining locally fine-tuned models with LLMs such as ChatGPT improves distractor generation

# Distractor Generation

- Smartly combining locally fine-tuned models with LLMs such as ChatGPT improves distractor generation
- Teacher evaluations: critical for assessing quality of AI educational tools



# Gap-filling exercise generation

- Our example-aware gap-filling exercise generator better than baseline that doesn't integrate examples

# Gap-filling exercise generation

- Our example-aware gap-filling exercise generator better than baseline that doesn't integrate examples
- Facilitates targeted **formative** assessment
  - Teachers can use it for introducing new grammar exercises
  - Students can practice on grammar exercises they want to master

# Ethical and practical consideration

- Deployment of AI tools in education:
  - Rigorous critical evaluation of AI models and human supervision
  - Emphasis on privacy of students and educators!

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- Address data bias in LLMs

# Ethical and practical consideration

- Deployment of AI tools in education:
  - Rigorous critical evaluation of AI models and human supervision
  - Emphasis on privacy of students and educators!
- Address data bias in LLMs
- Consider environmental impact during the development of these tools!



Thanks!









# Let's do a quick poll: Personal Trivia

What is my **last** name?

A

Kiros

C

Semere

B

Bitew

D

Kiros Bitew

# Let's do a quick poll: Personal Trivia

What is my **last** name?

A

BMW

C

Gent

B

Bitew

D

Kiros Bitew