



## About me

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#### Disclaimer:

I am not a ML Researcher / Data Scientist Never implemented search before



# Who is the current mayor of Paderborn?

Michael Dreier, CDU, since 2014



# Let's ask OpenAl GPT-4

ChatGPT 4 V 



#### You

Who is the current mayor of Paderborn?





#### **ChatGPT**

The current mayor of Paderborn is Michael Dreier, a member of the Christian Democratic Union (CDU). He was elected in the mayoral election held on September 13, 2020.









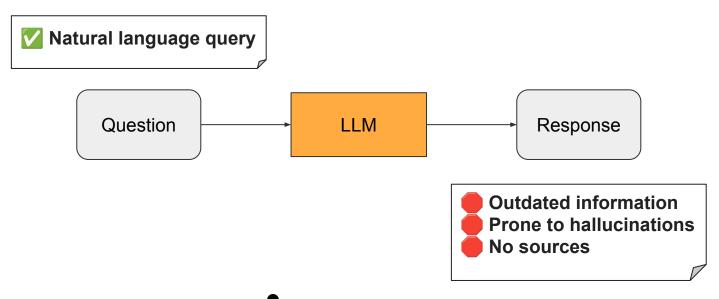
# What about Mistral 0.1?

Who is the current mayor of Paderborn?

As of my last update, the current Mayor of Paderborn is Thomas Wodzinski. However, I don't have access to real-time information so please verify with a reliable source.

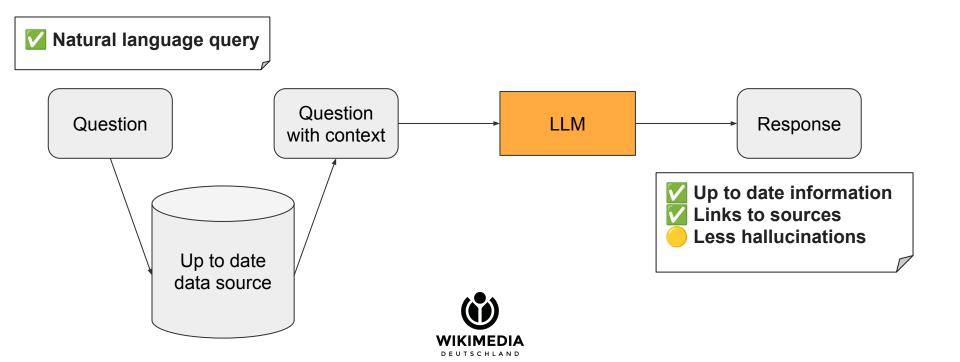


## LLM alone





# **LLM with RAG**

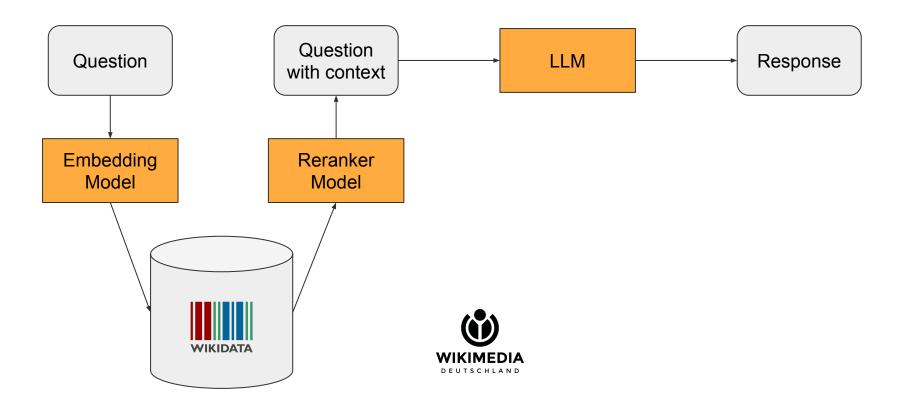


## **AskWikidata**

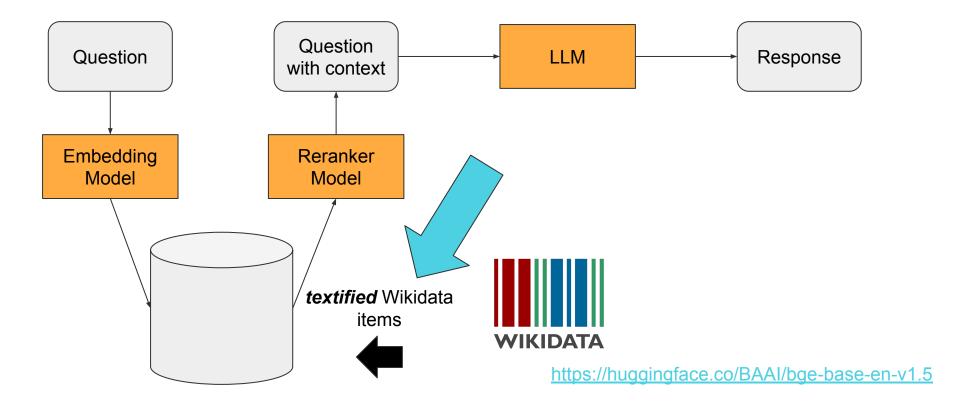
- A prototype I built in my freetime with support from Wikimedia Germany
- Open source software only
- LLM Mistral 7B (Apache-2.0 weights)
- Runs on
  - Consumer grade GPU, e.g. NVIDIA RTX 3070 8GB (from 2020)
  - Google Colab free tier (T4 GPU)
- Answers based on 13k city items from Wikidata



# Architecture



# Preprocessing



# Wikidata items as text

```
Paderborn shares border with Hövelhof.
Paderborn shares border with Bad Lippspringe.
Paderborn shares border with Altenbeken.
[...]
Paderborn twinned administrative body Le Mans since 1967-06-03 until today.
Paderborn twinned administrative body Bolton since 1975-01-01 until today.
Paderborn twinned administrative body Belleville since 1990-01-01 until today.
Paderborn twinned administrative body Pamplona since 1992-01-01 until today.
Paderborn twinned administrative body Przemyśl since 1993-05-14 until today.
[...]
Paderborn has license plate code PB.
Paderborn has head of government Michael Dreier since 2014 until today.
Paderborn population 149075 in 2017-12-31.
Paderborn population 103705 in 1975-12-31.
Paderborn population 150580 in 2019-09-30.
Paderborn population 152531 in 2021-12-31.
Paderborn population 157092 in 2023.
Paderborn population 154755 in 2022-12-31.
[...]
```

Paderborn: city in North Rhine-Westphalia, Germany



## Document chunks

```
Paderborn: city in North Rhine-Westphalia, Germany

Paderborn shares border with Hövelhof.

Paderborn shares border with Bad Lippspringe.

Paderborn shares border with Altenbeken.

[...]
```

```
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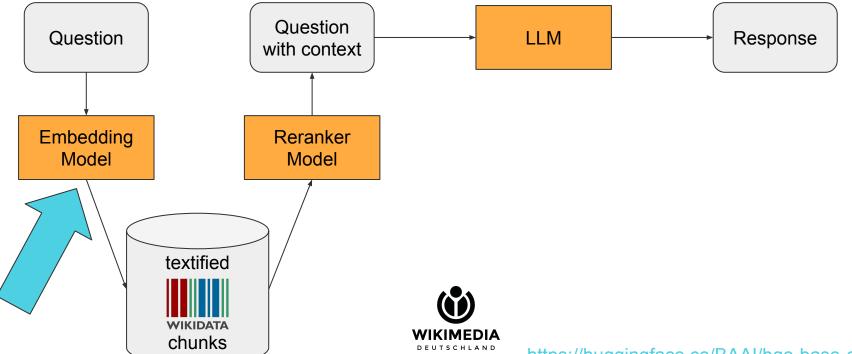
Paderborn population 154755 in 2022-12-31.

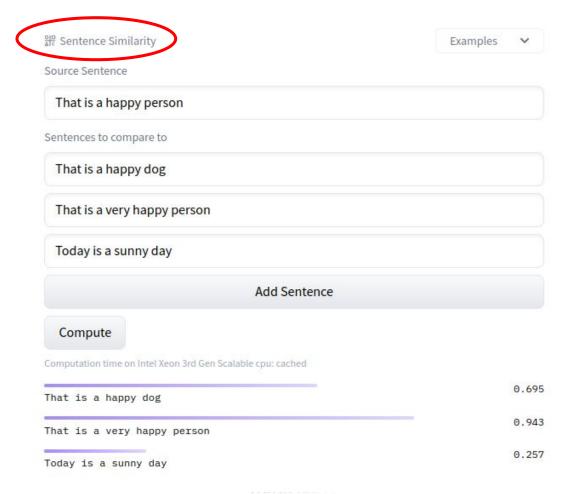
[...]
```

# Now it's a search problem

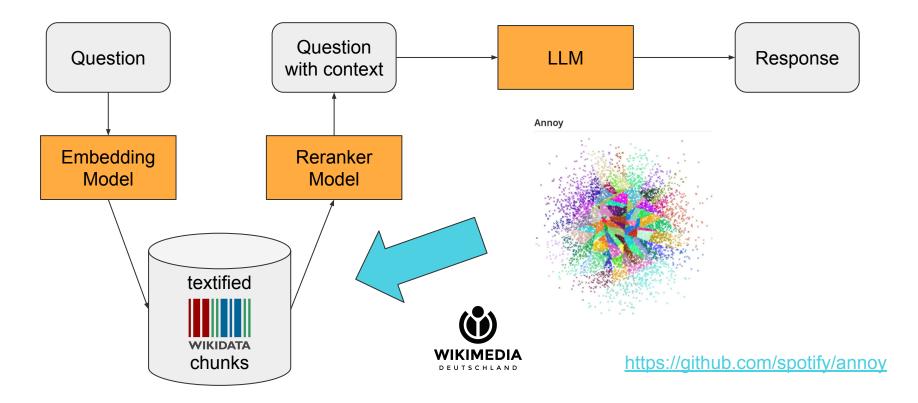


# **Embed question**

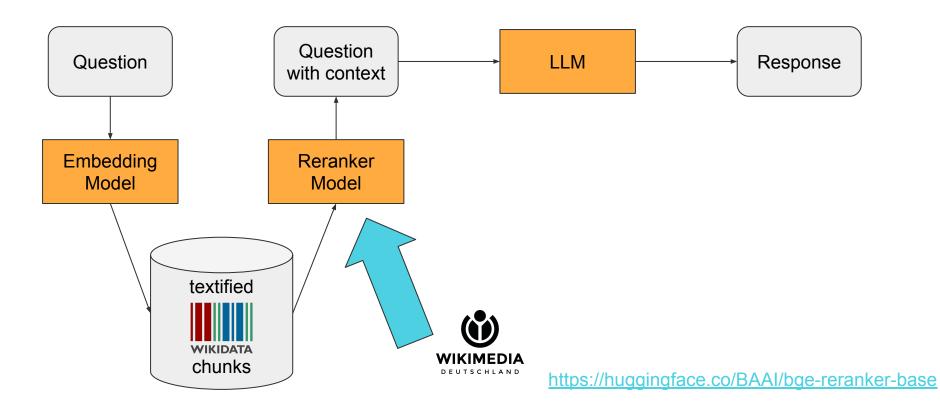




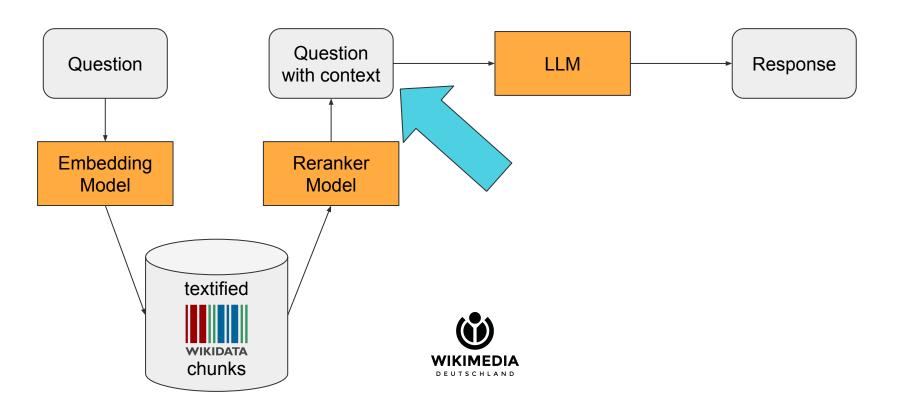
# Similarity search



## Rerank



# Prompt



```
<s>[INST] You are answering questions for a given CONTEXT.
Answer based on information from the given CONTEXT only.
If the answer is not in the CONTEXT say that you do not know the answer.
Only give the answer, do not provide any further explanations.
```

#### CONTEXT:

Paderborn: city in North Rhine-Westphalia, Germany

Paderborn shares border with Hövelhof.

Paderborn shares border with Bad Lippspringe.

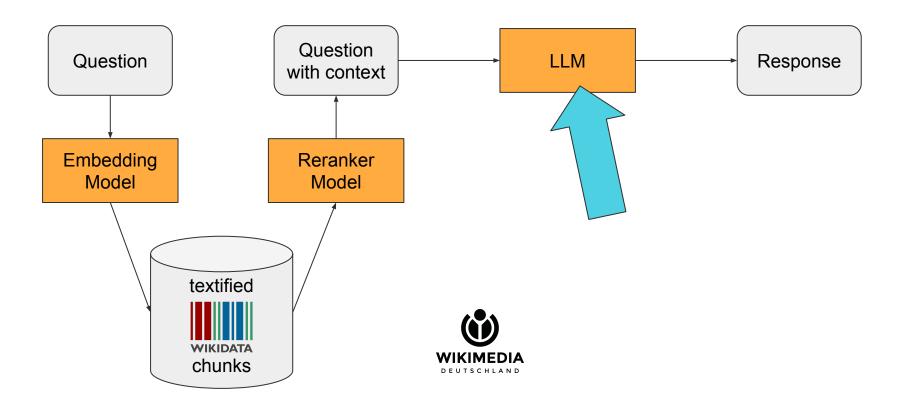
Paderborn shares border with Altenbeken.

[...]

Paderborn has head of government Michael Dreier since 2014 until today. [...]

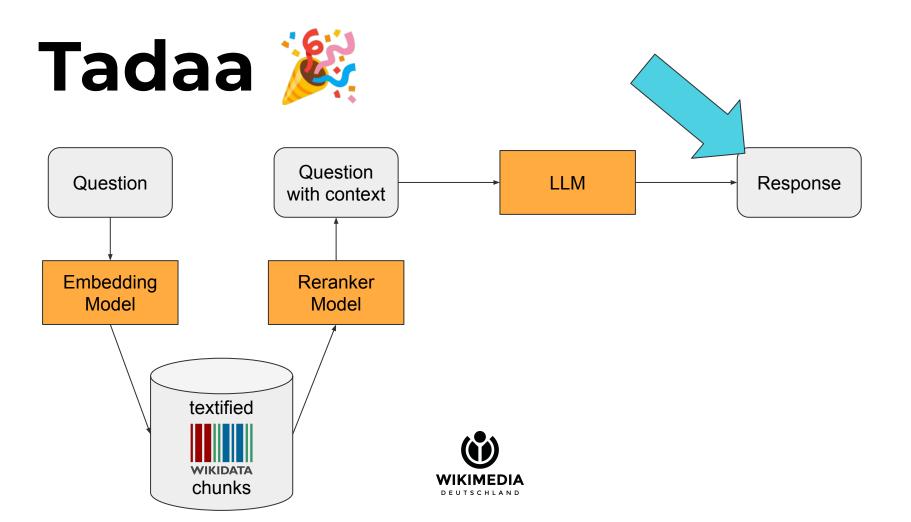
Who is the current mayor of Paderborn? [/INST]

# Generation



# Mistral 7b 4 bit quant ~5GB GPU RAM





# Demo

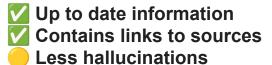


### The current mayor of Paderborn is Michael Dreier.

#### Sources:

- https://www.wikidata.org/wiki/Q1022488
- https://www.wikidata.org/wiki/Q1055
- https://www.wikidata.org/wiki/Q1901003
- https://www.wikidata.org/wiki/Q2971
- https://www.wikidata.org/wiki/Q51694





# Want to try?

### github.com/rti/askwikidata

https://colab.research.google.com/drive/1yRZshpNj0kXwY0XuUYw5ziqjw\_RffxH-



# Limitations

Text items contain useless information

Paderborn is located in the administrative territorial entity Paderborn. Paderborn commons gallery Paderborn. Paderborn is capital of Paderborn.

- LLMs sometimes break out of the context
- Amount of Wikidata Items currently limited 13k cities



### **Future**

- Optimizations: Chunks to retrieve, Chunking strategy, Re-chunk for reranking
- Improve Item text generation, can Abstract Wikipedia help?
- Scale up the item count and topics
- Finetune the LLM to stay in the context
- Finetune embedding and reranker model to improve performance
- Or should we maybe actually use the graph directly?



# Let's stay in touch

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Senior Software Engineer at Wikimedia Germany Wikibase Suite Team

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