



Faculty of Environmental Sciences Chair of Geo<u>informatics</u>

LLMs for Conversational Geodata Search

AGILE 2025 Tutorial, Dresden, Germany

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Agenda

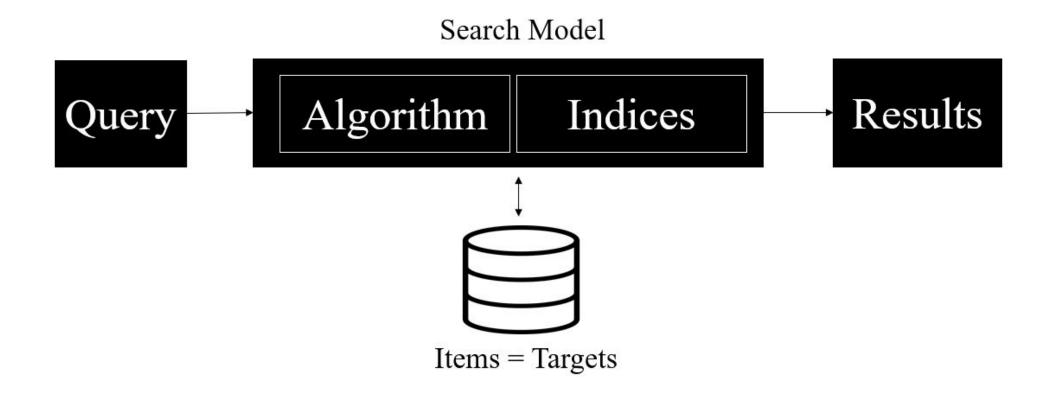
- Search Targets
- GeoQuery
- Retrieval-Augmented Generation





Automated Information Retrieval

Key abstract components

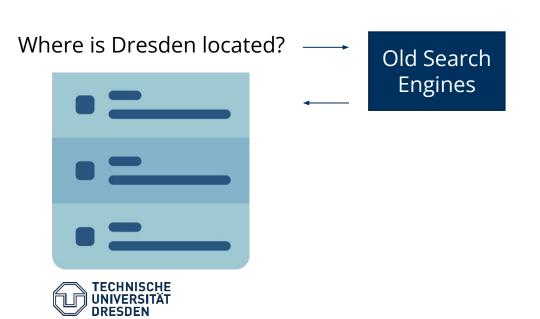


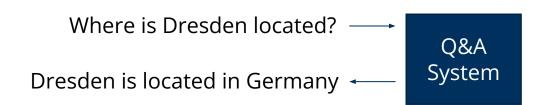




What are QA Systems?

"Question Answering (QA) Systems can be considered as an extension of Search Engines in the sense, that they aim at automatically **supplying users with precise answers to questions** posed in natural language, instead of simply returning a ranked list of relevant sources based on a set of keywords". (Dimitrakis et al, 2020)

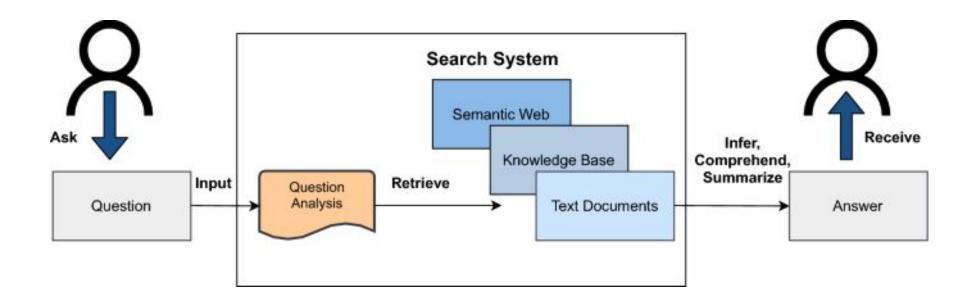






Question Answering Systems

Key abstract components



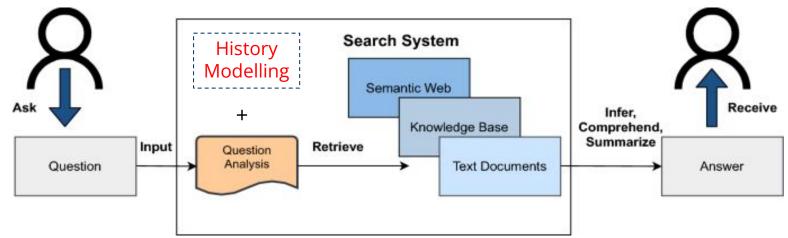
[Zaib et al, 2022]





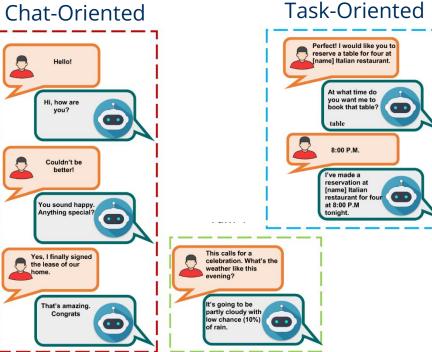
Conversational Question Answering Systems

Key abstract components



[Zaib et al, 2022]





Search Targets, GeoQueries





Search Target

A search target is a resource searched for.

- Georeferenced datasets
- Georeferenced videos
- Raster maps
- Interactive maps
- Geospatial services (e.g. OGC web services)
- Shapefiles
- Algorithms in scientific papers

Geographic Information Retrieval: Text Multimedia Information Retrieval: Audio, Video, ...

Dataset Search: Dataset

• • •





Search target for our scenario: document

metadata

document = id + metadata

Example: id: ('relation', 5651)

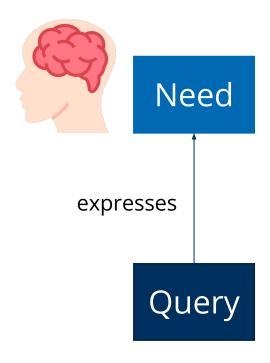
Visualization



```
cription:de': 'Führunge für Sehgeschädigte und Blinde',
     "('relation', 5651)",
       late': '2024-03-09',
 nternet access': 'wlan',
      ta': 'Q874373',
              '#727466',
              'Hygienemuseum',
             itecture': 'neoclassicism',
             de:Deutsches Hygiene-Museum',
        hours': 'Tu-Su 10:00-18:00',
   metry': '{"type": "Polygon", "coordinates": [[[13.7455854, 51.0450922], [13.7459654, 51.0449423],
internet_access:access': 'customers',
check date: opening hours': '2022-06-20',
start_date': '1928..1930',
```

GeoQuery

Need vs Query



[Baeza-Yates and Ribeiro-Neto, 1999]

A clear statement in natural language that describes what the user is asking for or wants to know.

'I am looking for restaurants near Dresden'.

The expression of the user information need in the <u>input language</u> provided by the information system.

Q1: "restaurant near Dresden"

Q2: SELECT r where

Q3

restaurant

3

within/near



Dresden





GeoQuery

Definition

Geoquery = A query that requests location-specific information

= The expression of the user's need for location-specific information in the input language provided by the information system





GeoQuery

Two forms of geoqueries

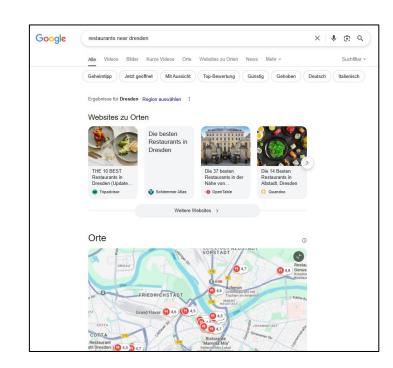
<theme><relationship><space> [Purves et al, 2018]
 (very often <object><relationship><place> [Carniel, 2023])

- Weather in Dresden
- Restaurants near Dresden
- Castles inside Dresden
- Houses north of Dresden

<resources> about <theme><space><time> [Degbelo, 2022]

Maps about the cities of Prussia in 1830

TECTIVIS VII leos about the Eiffel Tower in 2020, whose spatial locations are UNIVERSITATION TO THE PROPERTY OF THE PROPERTY O





GeoQuery Interpretation

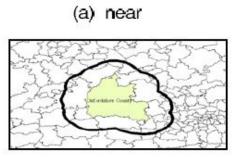
A geoquery has a footprint

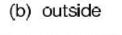
The footprint of a spatial term P-footprint indicates the geographical location of the intended place, and is specified in terms of map coordinates with a selected reference system. [Fu et al, 2005]

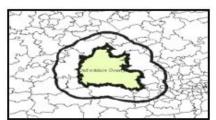
A query footprint Q-footprint defines a geographical space that covers the intended spatial search extent of the query, and it is specified in the form of map coordinates. [Fu et al, 2005]

Castles *rel* Oxfordshire

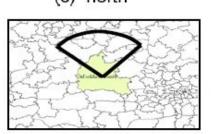
[Fu et al, 2005]







(c) north





Retrieval-Augmented Generation





Retrieval-Augmented Generation

"RAG is a technique for augmenting LLM knowledge with additional data.

LLMs can reason about wide-ranging topics, but their knowledge is limited to the public data up to a specific point in time that they were trained on. If you want to build AI applications that can reason about private data or data introduced after a model's cutoff date, you need to augment the knowledge of the model with the specific information it needs. The process of bringing the appropriate information and inserting it into the model prompt is known as Retrieval Augmented Generation (RAG)". [source]

RAG = LLMs + Your Own Data [CSV, JSON, Webpages, PDF, Graph Data, ...]

GeoRAG = LLMs + Your Own Data + Spatially-Explicit Reranking





Retrieval-Augmented Generation

A RAG Application typically needs three steps...

Indexing (dividing targets into smaller chunks and storing these, usually before the user query)

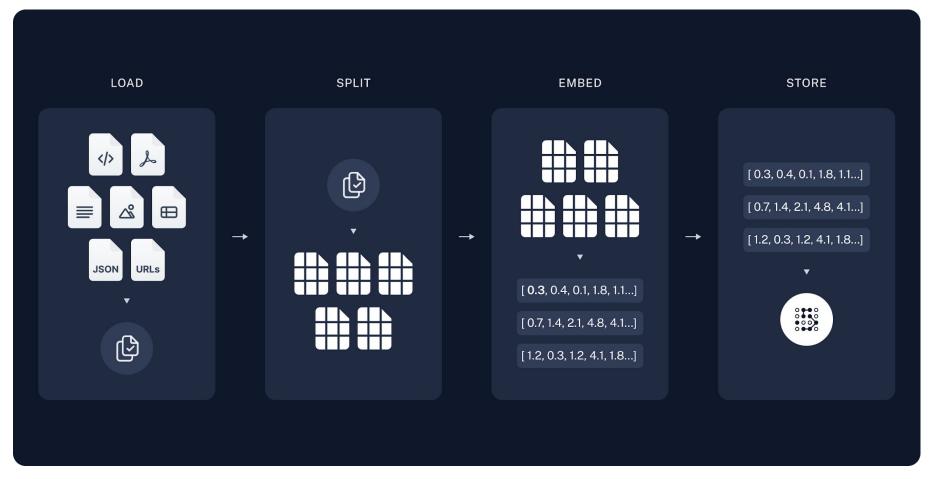
Retrieval (selection of relevant chunks to the user query)

Generation (answer formulation based on the chunks from the previous step)





RAG: Indexing and Storage



https://python.langchain.com/docs/tutorials/rag/



Preface

Auriol Degbelo (1) Serena Coetzee (2) Carsten KeBler (3) M, Monika Sester (3) S, and Sabine Timpf (2) (1) Christoff Geoinformatics. TU Dresden, Dresden, Germany (2) NULF-(2) ESS, Dresden, Germany

We are excited to welcome you to Dresden for the 28th AGILE international conference! This year's conference theme is 'Geographic Information Science responding to Global Challenges' to emphasise the critical role of geospatial data and analysis in informing decision-making for current global issues affecting humanity.

³Bochum University of Applied Sciences, Bochum, Germany

⁴Aalborg University, Copenhagen, Denmark ⁵Leibniz University Hannover, Hannover, Germany ⁶University of Augsburg, Augsburg, Germany

We are pleased to host researchers, developers, educators, students, and professionals from all areas of Geographic Information Science and Technology. AGILE 2025 of-fers a platform to learn about the latest research in Geographic Information Science, showscae products, and network with colleagues from Europe and the rest of the world.

1 About the host

TU Dresden was founded in 1828 and has been designated a University of Excellence by the German government since 2012. It is the largest university in the federal state of Saxony and one of the largest German universities of technology. It is home to 29,000 students, about 5,300 (20%) of whom are international students from 128 countries. The university offers 119 degree programme, 26 of which are taught in English and 26 of which are double degree programmes. As of 2075, the university has 8,500 employees, 3,500 of whom are funded by third parties. TU Dresden comprises five schools and 17 facilities.

The Faculty of Environmental Sciences unites the three disciplines of forest, geo., and hydro sciences, which is unique in Germany, Activities focus on monitoring and modeling the Earth Systems at global, regional, and looking the Earth Systems at global, regional, and looking the Earth Systems at global, regional, and looking the Earth Systems at global, regional and environment. Research and teaching cover a wide range of of the sustainable development of the human environment. Research and teaching cover a wide range of a looking the second control of the sustainable development of the human territories and are firmly embedded in both regional and international networks. The faculty's commitment to advantage and research in geographic information science and research in geographic information science.

ence is reflected through the following programmes: BSc Geodesy and Geoinformation, BSc Environmental Informatics, MSc Cartography, and MSc Geoinformation Technologies.

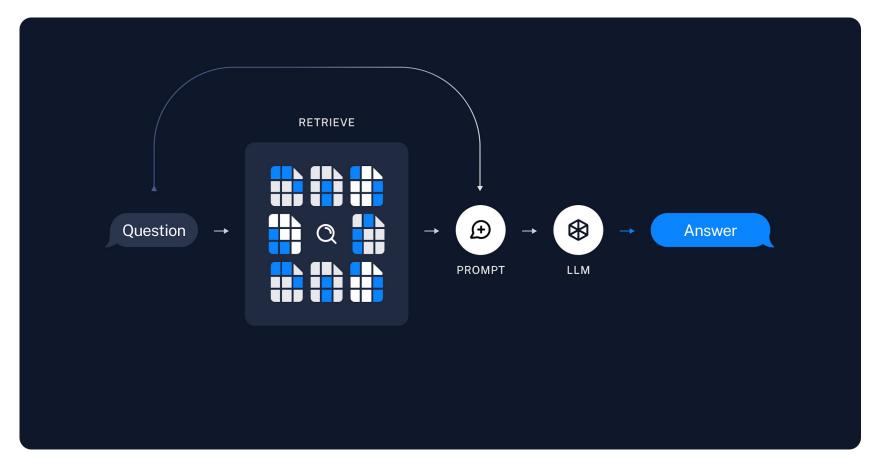
Within the Faculty of Environmental Sciences, some research groups focus on geographic information science themes, for example:

- The Chair of Cartographic Communication: core research interest include map generalization, govinsualization, and voluntered geographic information. Among others, the research goops is currently actively involved in the MSc Cartography, an Erasmus Mundus Master of Science Programme data provides a broad education in Cartography and Goolinformatics. The programme awards a joint degree from four universities: Technical University of Munich, TII Wien, TII Dresden and the Liiversity of Munich.
- The Chair of Geoiaformatics: core research interests include spatial data infrastructures, spatial decision support systems, and geoprocessing on the Weh Among others, the research group is currently actively contributing to the advancement of scientific (geodata infrastructure in Germany, through speaker roles in NFDHEarth (National Research Data Infrastructure for the Earth System Sciences) and BasesNFD (Basic Services for Research Data Infrastructure in Germany).

2 Programme composition

The call for papers welcomed submissions across five categories, each with its own submission process: workshopy/tutorials, full papers, short papers, posters, and published articles. The number of submissions in each category was: 9 workshop/tutorial proposals, 30 full papers,

RAG: Retrieval and Generation



https://python.langchain.com/docs/tutorials/rag/

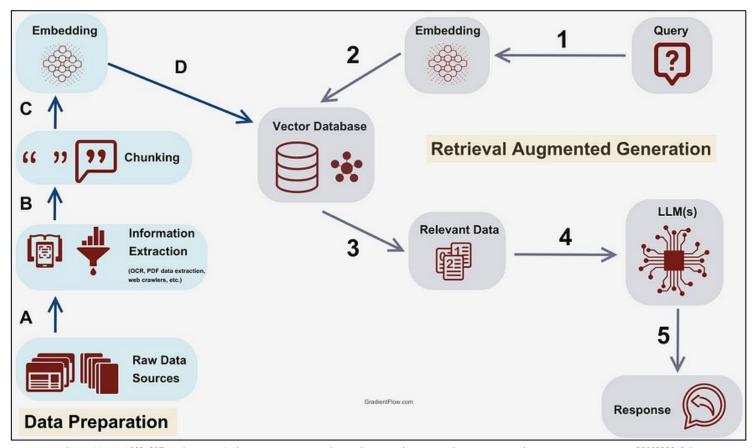
Q: "Who are the authors of this document?"

A: "The authors are..."





RAG: All steps at once

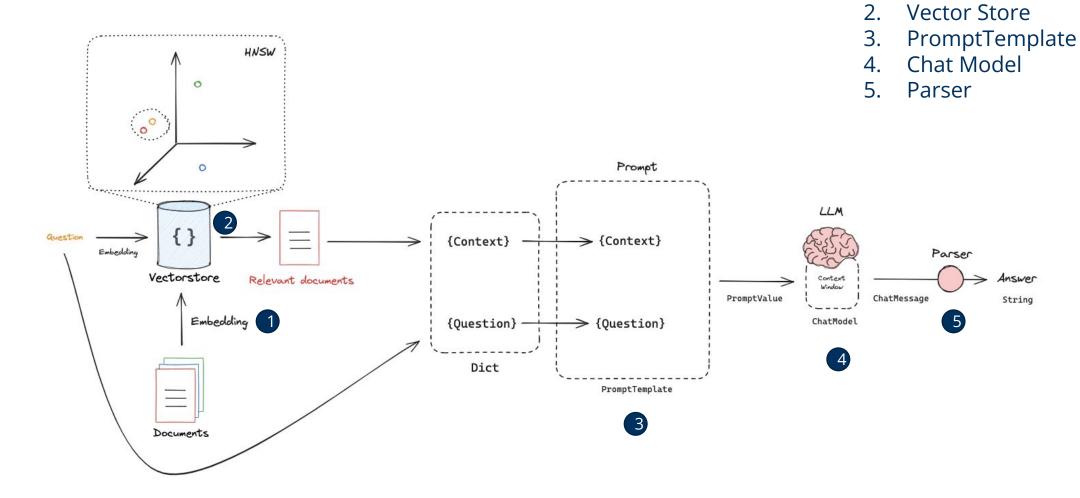


https://aswin19031997. medium.com/enhancing-conversational-ai-with-retrieval-augmented-generation-rag-leveraging-csv-integration-3000322819 ebuilded to the conversation of the conversa





Basic RAG Architecture







Embedding Model

Our scenario: from search target to embedding

all metadata

```
ind:description:de': 'Führunge für Sehgeschädigte und Blinde',
     "('relation', 5651)",
    :street': 'Lingnerplatz',
       ate': '2024-03-09',
 vebsite': 'https://www.dhmd.de',
name:en': 'German Hygiene Museum',
wikidata': 'Q874373',
              '#727466',
              'Hygienemuseum',
 ouilding:architecture': 'neoclassicism',
        ia': 'de:Deutsches Hygiene-Museum',
         ours': 'Tu-Su 10:00-18:00',
       'Deutsches Hygiene-Museum',
      ry': '{"type": "Polygon", "coordinates": [[[13.7455854, 51.
check_date:opening_hours': '2022-06-20',
'start date': '1928..1930',
addr:city': 'Dresden',
phone': '+49 351 4846400'}
```

selected metadata

embedding

Text-based metadata only

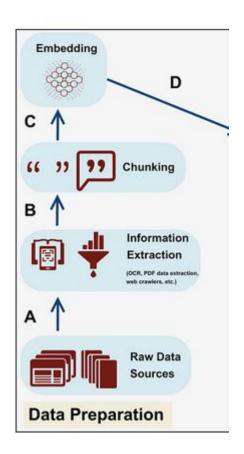
Additional examples

```
Document 1:
Name: Bürgerhaus Schönborn
addr:city: Dresden
addr:country: DE
addr:housenumber: 6
addr:postcode: 01465
addr:street: Seifersdorfer Straße
amenity: townhall
building: yes
source: HiRes aerial imagery
building description: yes
Document 2:
Name: A-Gebäude
building: yes
building description: yes
Document 3:
Name: B-Gebäude
building: yes
building description: yes
Document 4:
Name: Geschwisterwohnen WG
building: yes
operator: Outlaw
website: https://www.outlaw-ggmbh.de/wo
building description: yes
```

"An embedding is a numerical representation of a piece of information, for example, text, documents, images, audio" [source]



Embedding model for vector creation



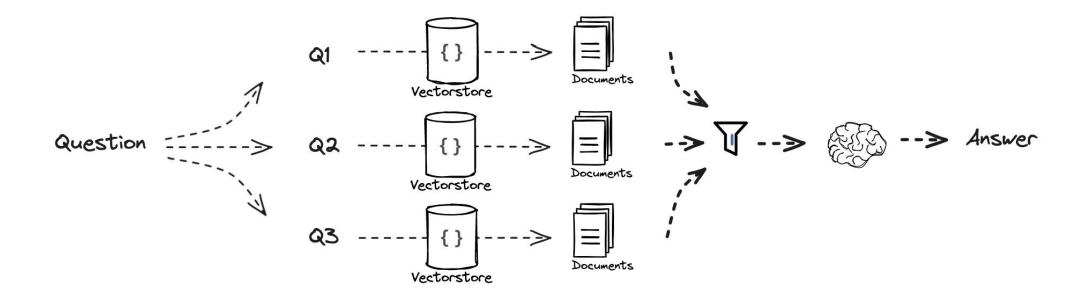
from chromadb.utils.embedding_functions import SentenceTransformerEmbeddingFunction
model_name = "paraphrase-multilingual-mpnet-base-v2"

ef = SentenceTransformerEmbeddingFunction(model name=model name)





Expansion: RAG Fusion

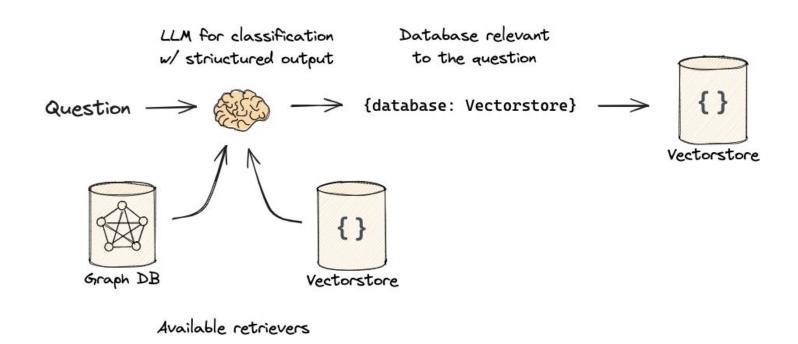


https://github.com/langchain-ai/rag-from-scratch/blob/main/rag_from_scratch_5_to_9.ipynb





Logical Routing: Let LLM choose DB based on the question

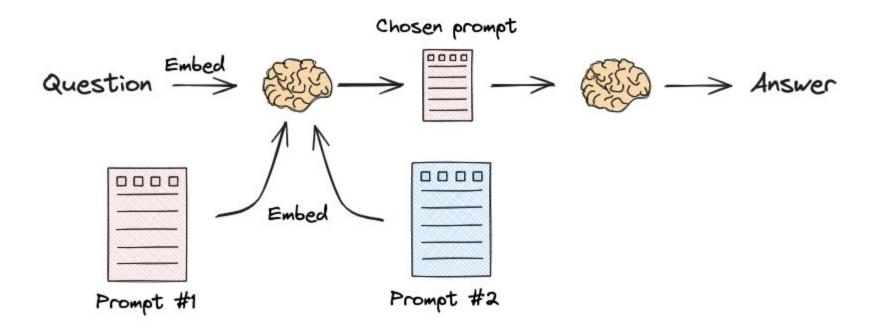


https://github.com/langchain-ai/rag-from-scratch/blob/main/rag_from_scratch_10_and_11.ipynb





Semantic Routing: Embed question and choose prompt based on similarity



https://github.com/langchain-ai/rag-from-scratch/blob/main/rag_from_scratch_10_and_11.ipynb





References

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