



# **EIFFEL Cognitive Search Engine in GEOSS Platform**

Yannis Kopsinis, Dimitris Bliziotis

LIBRA MLI, I-SENSE Group/ICCS





Learn more here:















# Data Discovery in Data Spaces/Platforms

- Data discovery is the ultimate goal of data platforms
- Search queries can be ambiguous in nature
- Search queries are performed on data object metadata
- Is conventional keyword-based search good enough?
- Ontology-based search might bring much overhead to the data publisher
- NLP-based search is a valuable alternative











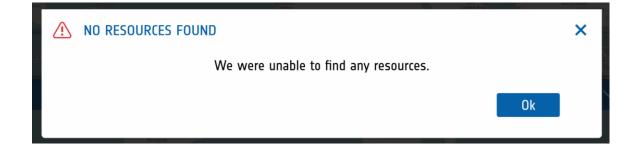


#### GEOSS Platform data discovery experience

#### Agricultural pollution to rivers



#### pollution to rivers due to agriculture



> The search engine needs to be resilient to rephrased queries











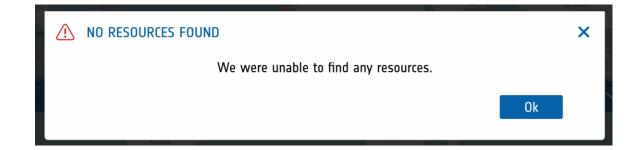


### GEOSS Platform data discovery experience

#### Pollution AND rivers AND agriculture



Pollution AND inland waters AND agriculture



> The search engine needs to tackle Semantically similar words and concepts consistently













### The Cognitive search data discovery experience

Agricultural pollution to rivers

Or

pollution to rivers due to agriculture

Or

Pollution, rivers, agriculture

Or

Pollution, inland waters, agriculture

# Diffuse agricultural pollution to rivers in Scotland

Modelled predictions of annual pollutant loads in rivers from agricultural source areas for...

# Water footprint of irrigated agriculture in Segura river basin...

Irrigated agriculture is a key activity in water resources management at the river basin level in arid and semi-arid areas, since this sector...

#### **Environmental Pollution Incidents**

Environmental Pollution Incident data filtered for Categories 1 and 2. Details of all pollution incidents reported to the Environment Agency...

### Discharges to rivers from abandoned metal mines

Information about average flows and water quality for known mine water discharges from abandoned metal mines in England...

# Baseflow chemistry of streams draining rural and agricultural...

Data from a water quality survey of streams draining rural and agricultural land to the North Sea from the Wolds region of the West...

# Angling in the rural environment - ecology and geomorphology data...

This dataset consists of an ecology-focused survey of stillwaters along the rivers Yure and Swale and sediment flux measurements...







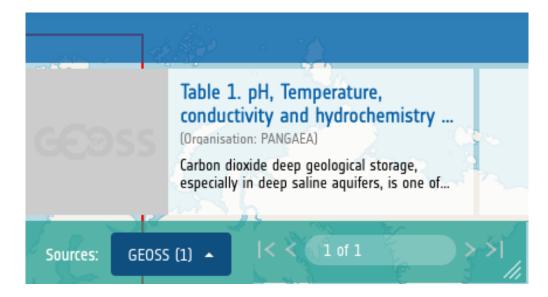




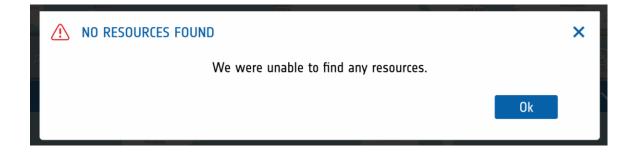


#### GEOSS Platform data discovery experience

#### greenhouse gases emissions



#### greenhouse gasses emissions



> The search engine needs to be resilient to misspelling













### The Cognitive search data discovery experience

greenhouse gases emissions

Or

greenhouse gasses emissions

# Annual CO2 emissions from regulated installations

Annual emissions of carbon dioxide equivalent from installations in England holding a Greenhouse Gas Emissions Permit under the...

# Annual CO2 emissions from aircraft operators Cameroon Republic South Sudan Ethiopia Somalia

Annual emissions of carbon dioxide from those aircraft operators regulated under EUEmissions Trading Scheme and assigned to the UK...

# Methane, liquid petroleum gas, smoke, carbon monoxide and...

Methane, liquid petroleum gas, smoke, carbon monoxide and propan obtained during the pandemic period in Ankara, Turkey

# Green house gas and meteorology data obtained during pandemic...

In this study a greenhouse gas and meteorology measurement station is developed to monitor ozone, methane, ammonia, nitrogen dioxide...

# Copernicus Atmosphere Service near real-time biomess burning...

This service provides pre-operational daily analyses of biomass burning emissions based on fire radiative power satellite...

# Denitrification and greenhouse gas emissions in natural and semi...

Data comprise monthly field measurements of in-situ denitrification rates in different land use types of the Ribble Wyre catchment...







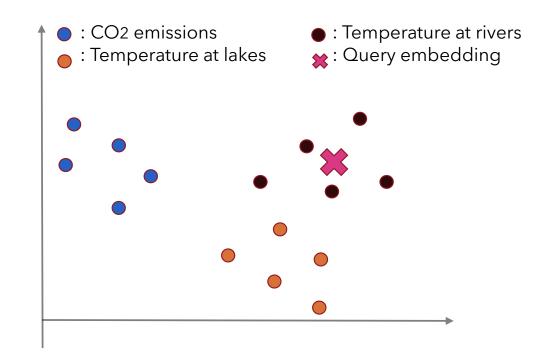






# Cognitive search engine facts

- Uses an ML-powered language model that performs
   NLP in unstructured text
- The language model inherently performs semantic analysis
- The language model converts text into mathematical vectors
- It can be domain-aware: In Eiffel we aim for CC domain specificity
- Semantic search adds language understanding to search results, promoting the most semantically relevant results to the top



Text embedding encodes words and sentences as numeric vectors







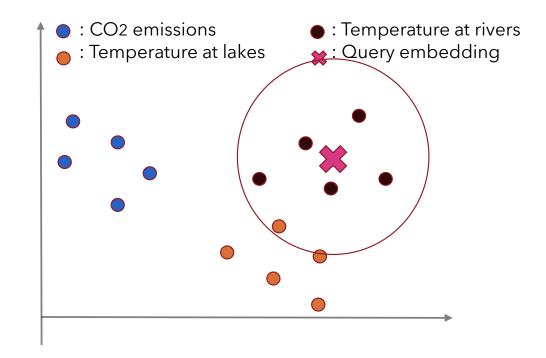






# Cognitive search engine facts

- Uses an ML-powered language model that performs NLP in unstructured text
- The language model inherently performs semantic analysis
- The language model converts text into mathematical vectors
- It can be domain-aware: In Eiffel we aim for CC domain specificity
- Semantic search adds language understanding to search results, promoting the most semantically relevant results to the top



Text embedding encodes words and sentences as numeric vectors







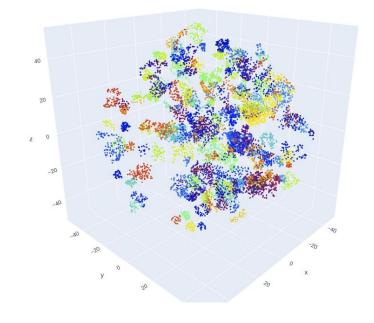






### Cognitive search engine facts

- Uses an ML-powered language model that performs NLP in unstructured text
- The language model inherently performs semantic analysis
- The language model converts text into mathematical vectors
- It can be domain-aware: In Eiffel we aim for CC domain specificity
- Semantic search adds language understanding to search results, promoting the most semantically relevant results to the top



Text embedding encodes words and sentences as numeric vectors







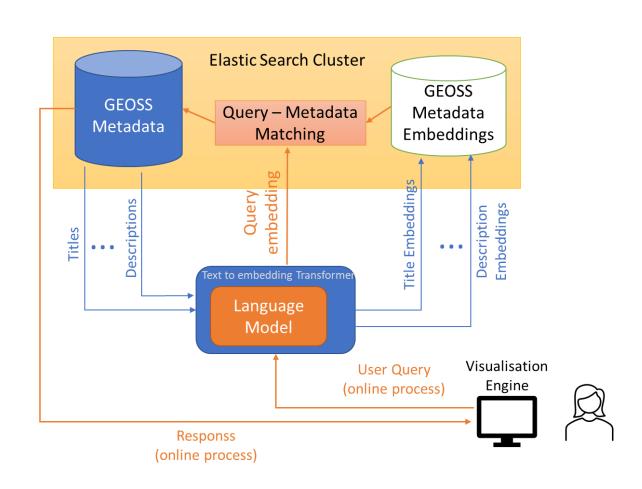






### Cognitive search pipeline

- The metadata (e.g., titles, descriptions, keywords) pass through the language model to produce metadata embeddings (offline process)
- The user query passes through the language model to produce the query embedding (online process)
- The semantically similar data objects are returned in ranked order
- Elasticsearch stores embeddings and calculates vector similarity fast







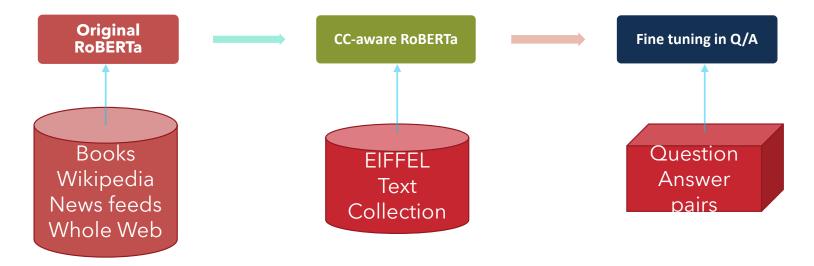








#### Domain-specific language model training



- Chose a baseline language model (Distilled RoBERTa)
- Collect extensive domain-relevant text
- Further train the language model with the domain-relevant text
- Fine tune in Q/A task (optional)









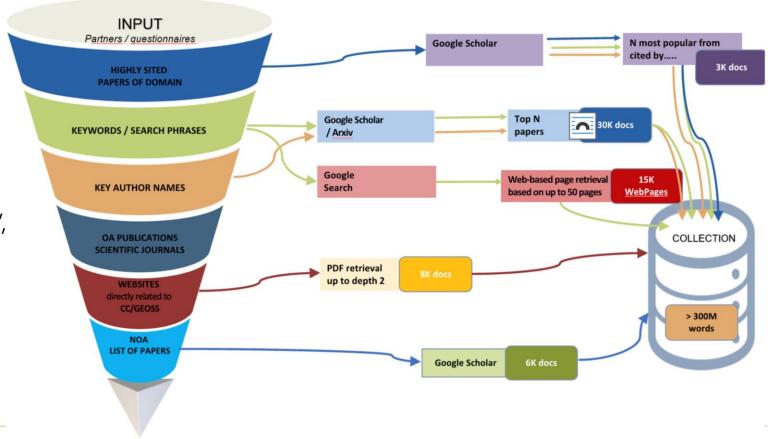




### Domain-specific corpus collection (13M sentences)

# Newly included terms in the language model

"basin", "distribution", "parameters",
"factors", "regions", "environmental",
"variables", "emissions", "simulation",
"atmospheric", "correlation", "modelling,
"measurement", "estimation", "greenhouse",
"radiation", "percentage", "climatic",
"cooling", "rainfall", "regression", "gases",
"pollution", "meteorological", "dioxide",
"flux", "anthropogenic", "indicator",
"humidity", "ocean", "baseline",
"ecosystems", "renewable", "hydrological",
"sustainable", "socioeconomic", "CO2"















# Further advance AI-enabled Cognitive Search

- Metadata curation and augmentation
- Fuse with filtering (e.g., geospatial)
- Perform advanced reranking
- Exploit domain-specific ontologies (Eiffel ontology)













#### **The EIFFEL Consortium**









































Dimitris Bliziotis, <u>dimitris.bliziotis@iccs.gr</u>, ICCS Yannis Kopsinis, <u>yannis.kopsinis@libramli.ai</u>, LIBRA