

# Travel & Tourism

## Ontology and Knowledge Graph

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# Project Scope

Domain: Travel & Tourism

## Objectives:

- Build an ontology and knowledge graph for tourist destinations
- Enable intelligent recommendations based on user preferences
- Connect destinations with attractions, activities, climate, and costs



# WHAT WE HAVE DONE SO FAR...

Creating a dataset containing travel destinations

- The dataset includes the following attributes:

City, Country, Accommodation type, Accommodation cost, Transportation type, Transportation cost, Category, Cost of Living Index, Rent Index, Cost of Living Plus Rent Index Groceries Index, Restaurant Price Index, Local Purchasing Power Index, Attractions

- Sources used:

- A base dataset from Kaggle
  - Enriched via web scraping using Python + BeautifulSoup from travel websites (e.g., tripadvisor.com)

- Data scraping approach:

- HTML parsing with BeautifulSoup
  - Cleaned and normalized into a structured format (CSV)
  - Prepared for conversion into RDF triples

# WHAT WE HAVE DONE SO FAR...

- Creating an ontology (creating classes, defining relationships between classes)
- Ontology was created using Protégé

- City
- Country
- Accommodation
- Transportation
- Category
- Attraction
- CostIndex
  - CostOfLivingIndex
  - RentIndex
  - CostOfLivingPlusRentIndex
  - GroceriesIndex
  - RestaurantPriceIndex
  - LocalPurchasingPowerIndex

Active ontology x Entities x Individuals by class x DL Query x

Classes Object properties Data properties Annotation properties Datatypes Individuals

Object property hierarchy: hasAttraction

hasAttraction — http://www.semanticweb.org/alin/ontologies/2025/3/hasAttraction

Usage: hasAttraction

Show:  this  disjoints

Found 6 uses of hasAttraction

hasAttraction

- hasAttraction Range Attraction
- ObjectProperty: hasAttraction
- hasAttraction Domain City

Characteristics:  Functional  Inverse functional  Transitive  Symmetric  Asymmetric  Reflexive  Irreflexive

Description: hasAttraction

Equivalent To +

SubProperty Of +

Inverse Of +

Domains (intersection) +

City

Ranges (intersection) +

Attraction

Disjoint With +

SuperProperty Of (Chain) +

protégé

# WHAT WE HAVE DONE SO FAR...

- Combine data from Kaggle to develop our dataset.
- Clean the dataset to remove any duplicates.

```
import pandas as pd

# Reading a CSV file into a DataFrame
travel_details = pd.read_csv('Travel details dataset.csv')
#print(travel_details.head(10))

tourism_df = pd.read_csv('tourism_dataset.csv')
#print(tourism_df.head(10))

cost_of_living_df = pd.read_csv('Cost_of_Living_Index_by_Country_2024.csv')
# print(cost_of_living_df.head(10))

df1_partial = travel_details[["Destination", "Accommodation type", "Accommodation cost", "Transportation type", "Transportation cost"]]
df2_partial = tourism_df[["Country", "Category"]]
df3_partial = cost_of_living_df.drop(columns=["Rank"])

df_final = pd.concat([df1_partial, df2_partial, df3_partial], axis=1)
df_final.to_csv("dataset_combinat.csv", index=False)
```

```
df_EUR = pd.read_csv("dataset_combinat.csv")
# print(df_EUR.index[:150])

df_EUR = df_EUR.dropna(subset=['City'])

print(df_EUR.shape)

print(df_EUR['City'].duplicated().sum())
df_EUR = df_EUR.drop_duplicates(subset='City', keep='first')
print(df_EUR['City'].duplicated().sum())

df_EUR.to_csv("dataset_tourism.csv", index=False)
```

# WHAT WE HAVE DONE SO FAR...

- Transformed data into RDF triples to facilitate semantic integration and querying.
- Utilized rdflib for the creation and serialization of RDF graphs.
- Extracted data from a CSV file pertaining to tourism.
- Defined a custom namespace: `http://example.org/tourism#`.
- Created RDF triples for each city, incorporating the following attributes:
  - a. Accommodation type and cost
  - b. Transportation type and cost
  - c. Cost of living, including rent, groceries etc.
- eval() used to parse the Attractions list from the CSV
- Each attraction becomes an RDF resource of type `ex:Attraction`
- Added labels using `rdfs:label` for human-readable names
- Linked to cities via the `ex:hasAttraction` property

```
generate_graph.py x
1 import pandas as pd
2 from rdflib import Graph, Literal, Namespace, URIRef
3 from rdflib.namespace import RDF, RDFS, XSD
4
5 df = pd.read_csv("dataset_tourism.csv")
6
7 EX = Namespace("http://example.org/tourism#")
8 g = Graph()
9 g.bind(prefix="ex", EX)
10
11 for _, row in df.iterrows():
12     city_uri = URIRef(EX + row["City"].replace(" ", "_"))
13
14     g.add((city_uri, RDF.type, EX.City))
15     g.add((city_uri, EX.country, Literal(row["Country"], datatype=XSD.string)))
16     g.add((city_uri, EX.accommodationType, Literal(row["Accommodation type"], datatype=XSD.string)))
17     g.add((city_uri, EX.accommodationCost, Literal(row["Accommodation cost"], datatype=XSD.float)))
18     g.add((city_uri, EX.transportationType, Literal(row["Transportation type"], datatype=XSD.string)))
19     g.add((city_uri, EX.transportationCost, Literal(row["Transportation cost"], datatype=XSD.float)))
20     g.add((city_uri, EX.category, Literal(row["Category"], datatype=XSD.string)))
21     g.add((city_uri, EX.costOfLivingIndex, Literal(row["Cost of Living Index"], datatype=XSD.float)))
22     g.add((city_uri, EX.rentIndex, Literal(row["Rent Index"], datatype=XSD.float)))
23     g.add((city_uri, EX.costOfLivingPlusRentIndex, Literal(row["Cost of Living Plus Rent Index"], datatype=XSD.float)))
24     g.add((city_uri, EX.groceriesIndex, Literal(row["Groceries Index"], datatype=XSD.float)))
25     g.add((city_uri, EX.restaurantPriceIndex, Literal(row["Restaurant Price Index"], datatype=XSD.float)))
26     g.add((city_uri, EX.localPurchasingPowerIndex, Literal(row["Local Purchasing Power Index"], datatype=XSD.float)))
27
28 try:
29     attractions = eval(row["Attractions"]) if isinstance(row["Attractions"], str) else []
30     # print(f"{row['City']} -> {attractions}")
```

# WHAT WE HAVE DONE SO FAR...

```
28     try:
29         attractions = eval(row["Attractions"]) if isinstance(row["Attractions"], str) else []
30         # print(f"{row['City']} -> {attractions}")
31
32         for attr in attractions:
33             attr_uri_safe = attr.strip().replace(" ", "_").replace(",", "")
34             attraction_uri = URIRef(EX + attr_uri_safe)
35             # labels for attractions
36             g.add((attraction_uri, RDFS.label, Literal(attr, datatype=XSD.string)))
37             g.add((attraction_uri, RDF.type, EX.Attraction))
38             g.add((city_uri, EX.hasAttraction, attraction_uri))
39     except Exception as e:
40         pass
41
42     g.serialize(destination="tourism_data_generated.ttl", format="turtle")
43     g.serialize(destination="tourism_data_generated.rdf", format="xml")
44     g.serialize(destination="tourism_data_generated.owl", format="xml")
45
```

**GraphDB**

## SPARQL Query & Update

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?city
3 WHERE {
4   ?city a ex:City ;
5   ex:hasCountry ex:France .
6 }
```

Table Raw response Pivot Table Google Chart

Filter query results Compact view Hide row numbers

city
1 ex:Paris

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?attraction ?label
3 WHERE {
4   ex:Paris ex:hasAttraction ?attraction .
5   ?attraction rdfs:label ?label .
6 }
```

Table Raw response Pivot Table Google Chart

Chart Config

Showing results from 0 to 3 of 3. Query took 0.1s, moments ago.

attraction	label
http://example.org/tourism#Eiffel_Tower	Eiffel Tower

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?city
3 WHERE {
4   ?city a ex:City .
5 }
6 LIMIT 10
```

Table Raw response Pivot Table Google Chart

Filter query results Compact view Hide row numbers

city
1 ex:Accra
2 ex:Algiers
3 ex:Amsterdam
4 ex:Asuncion
5 ex:Athens
6 ex:Auckland
7 ex:Bali
8 ex:Bangkok
9 ex:Barcelona
10 ex:Belgrade

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?city ?attraction
3 WHERE {
4   ?city a ex:City ;
5   ex:hasAttraction ?attraction .
6 }
7 LIMIT 100
```

Table Raw response Pivot Table Google Chart

Filter query results Compact view Hide row numbers

Showing results from 0 to 100 of 100. Query took 0.1s, yesterday at 22:40.

city	attraction
1 ex:Accra	ex:Jamestown_Lighthouse
2 ex:Accra	ex:Kwame_Nkrumah_Mausoleum
3 ex:Accra	ex:Labadi_Beach
4 ex:Algiers	ex:Casbah
5 ex:Algiers	ex:Martyrs_Memorial
6 ex:Algiers	ex:Notre_Dame_dAfrique
7 ex:Algiers	ex:Notre_Dame_dAfrique
8 ex:Algiers	ex:Martyrs_Memorial
9 ex:Amsterdam	ex:Anne_Frank_House
10 ex:Amsterdam	ex:Rijksmuseum

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?city
3 WHERE {
4   ?city a ex:City .
5 }
6 LIMIT 10
```

Table Raw response Pivot Table Google Chart

Filter query results Compact view Hide row numbers

city
1 ex:Accra
2 ex:Algiers
3 ex:Amsterdam
4 ex:Asuncion
5 ex:Athens
6 ex:Auckland
7 ex:Bali
8 ex:Bangkok
9 ex:Barcelona
10 ex:Belgrade

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?attraction ?label
3 WHERE {
4   ex:Paris ex:hasAttraction ?attraction .
5   ?attraction rdfs:label ?label .
6 }
```

Table Raw response Pivot Table Google Chart

Chart Config

Showing results from 0 to 3 of 3. Query took 0.1s, moments ago.

attraction
http://example.org/tourism#Eiffel_Tower

Import Explore {...} SPARQL GraphQL Monitor Setup Lab Help

Unnamed X Unnamed 1 X Unnamed 2 X Unnamed 3 X Unnamed 4 X +

```
1 PREFIX ex: <http://example.org/tourism#>
2 SELECT ?city ?attraction
3 WHERE {
4   ?city a ex:City ;
5   ex:hasAttraction ?attraction .
6 }
7 LIMIT 100
```

Table Raw response Pivot Table Google Chart

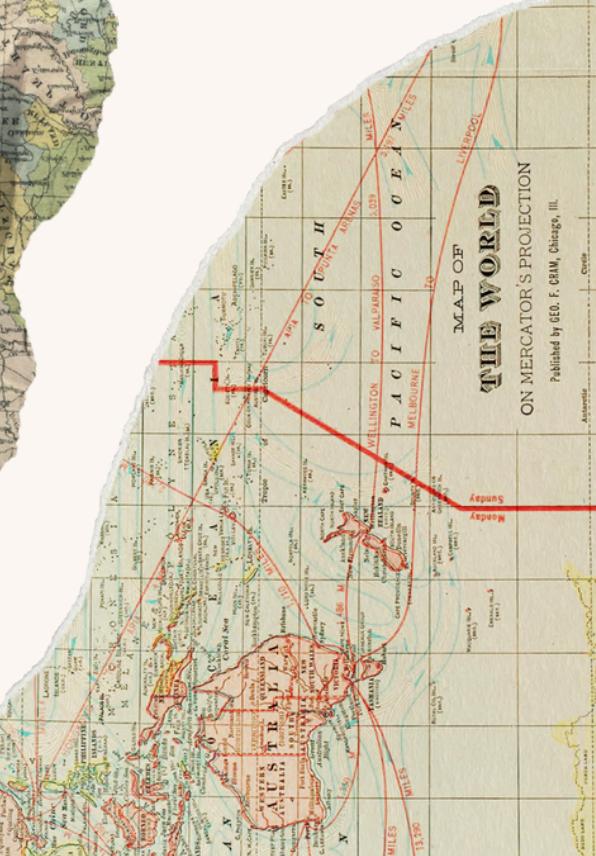
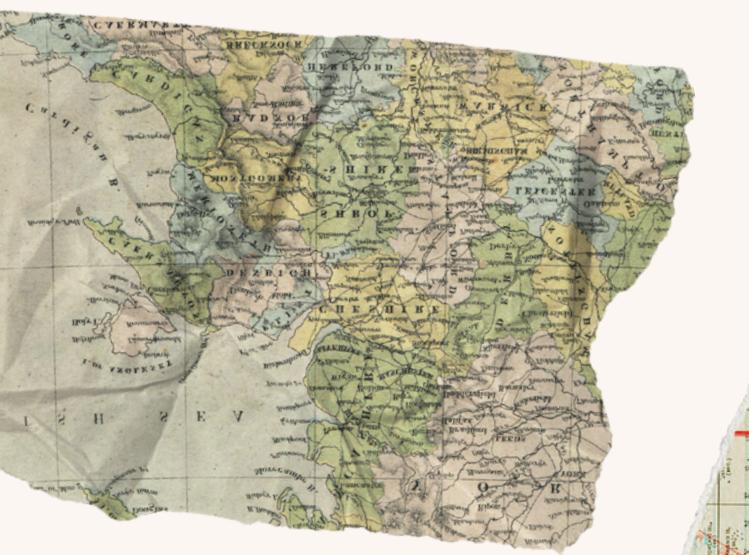
Filter query results Compact view Hide row numbers

Showing results from 0 to 100 of 100. Query took 0.1s, yesterday at 22:40.

city	attraction
1 ex:Accra	ex:Jamestown_Lighthouse
2 ex:Accra	ex:Kwame_Nkrumah_Mausoleum
3 ex:Accra	ex:Labadi_Beach
4 ex:Algiers	ex:Casbah
5 ex:Algiers	ex:Martyrs_Memorial
6 ex:Algiers	ex:Notre_Dame_dAfrique
7 ex:Algiers	ex:Notre_Dame_dAfrique
8 ex:Algiers	ex:Martyrs_Memorial
9 ex:Amsterdam	ex:Anne_Frank_House
10 ex:Amsterdam	ex:Rijksmuseum

# Next Steps

- Improving the database
- Ontology improvement
- Using inference
- Complex queries



# Thank You

## Questions?

# Bibliography

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