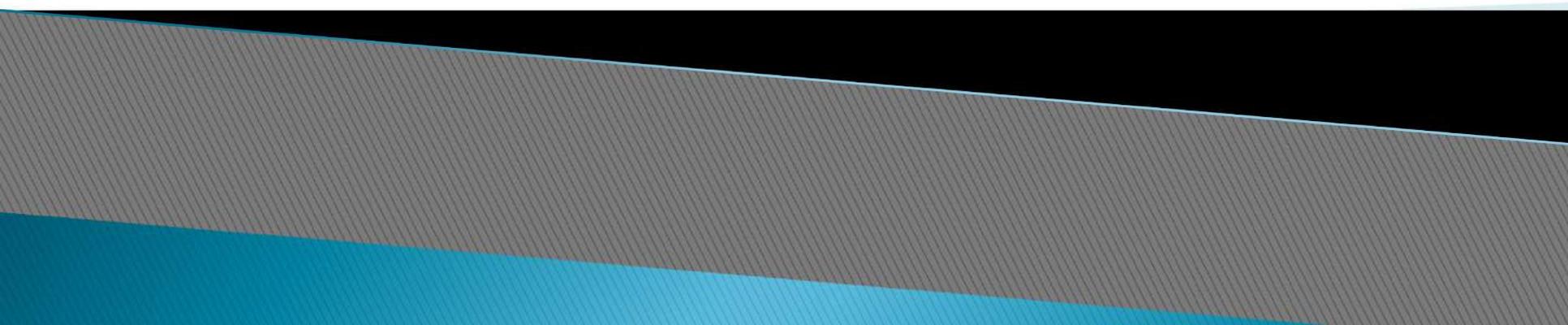
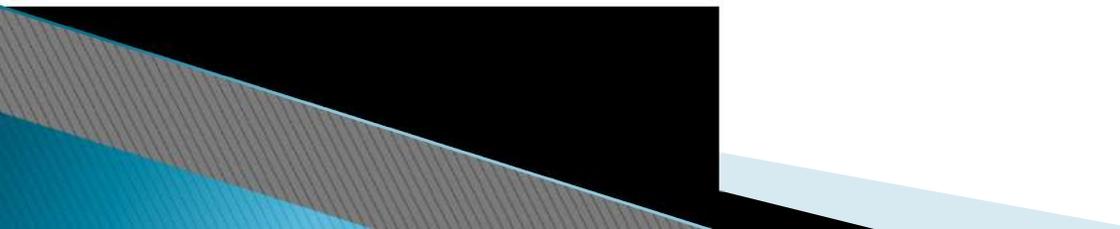


# Enabling Open Dataset relatedness

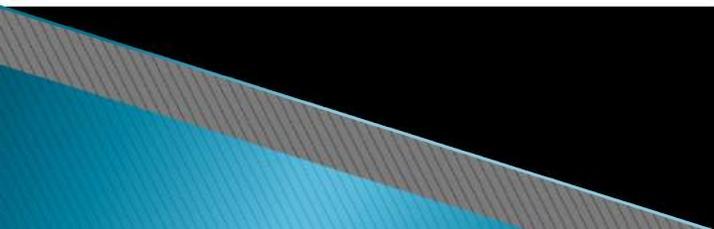
Oladipupo A. Sennaike



# Outline

- 🕒 Open Data Platforms
  - 🕒 Open Data Portals
  - 🕒 Objectives
  - 🕒 Dataset Relatedness
  - 🕒 Self Organising Maps (SOM)
  - 🕒 Dataset
  - 🕒 Model Development and Selection
  - 🕒 Topographic & Quantisation Errors
  - 🕒 Evaluation
  - 🕒 Dataset Recommender Service
  - 🕒 Related datasets for 'Parks' dataset
  - 🕒 Beyond Dataset Relatedness
  - 🕒 Knowledge Graphs
  - 🕒 Graph Schema
  - 🕒 Generating the Graph
  - 🕒 Generated Graph
  - 🕒 Centrality Measures
  - 🕒 Applying the Knowledge Graph
  - 🕒 Concluding Remarks
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# Open Data Platforms

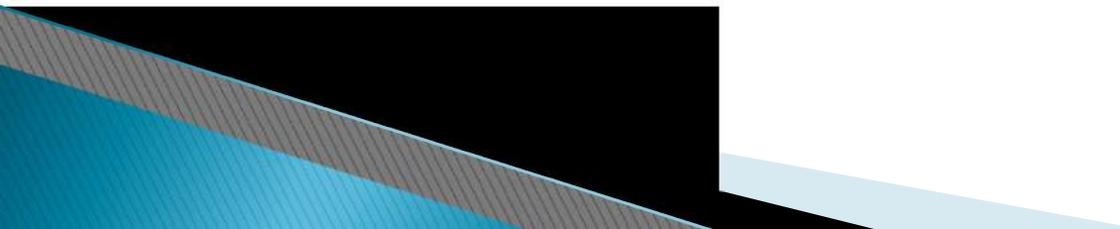
- Provides access to available data
  - Manage data catalogues
  - Publish, explore, analyse, visualise and share datasets
  - Over ten known open data platforms: CKAN, DKAN, Socrata, PublishMyData, Information Workbench, Enigma, Junar, OpenDataSoft, Callimachus, DataTank and Semantic Media Wiki
- 

# Open Data Portals

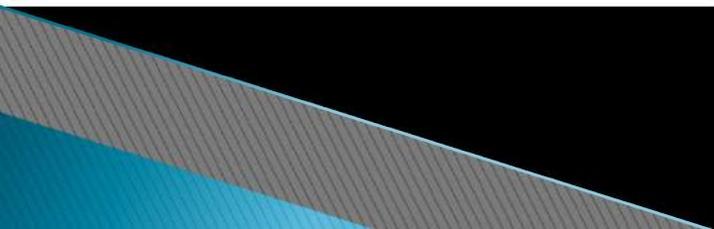
- Built on Open Data Platforms

- data.gov with over 195,000 datasets

- data.gov.uk with over 42,000 datasets



# Objectives

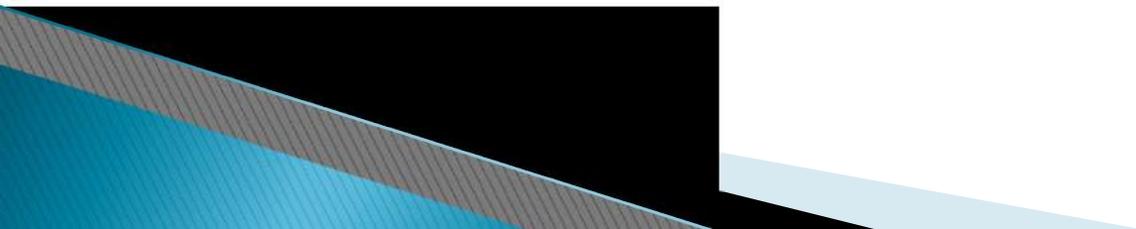
- Determine the implicit semantic relatedness of datasets
  - Provide recommendation features in open data platforms
  - Discovery of different categories or themes that are implicit in the datasets
  - Present data to the user in such a way that they have a good idea of what the portal has to offer.
- 

# Dataset Relatedness

- Relatedness defines an established or discoverable connection or association between two concepts
- Dataset relatedness is a measure of the proportion of shared concepts between two datasets in a catalog
- Explicitly methods
  - assigning Datasets with the same theme
  - tagging them with the same keywords
  - subjective, incomplete, sometimes absent
  - specifying dataset relatedness relationship manually is infeasible.

# Self Organising Maps (SOM)

- An unsupervised, competitive, winner take all neural network
- Projects high dimensional data onto a low (usually two) dimensional space
- Preserves topological order
- Related data are close on the resulting map.

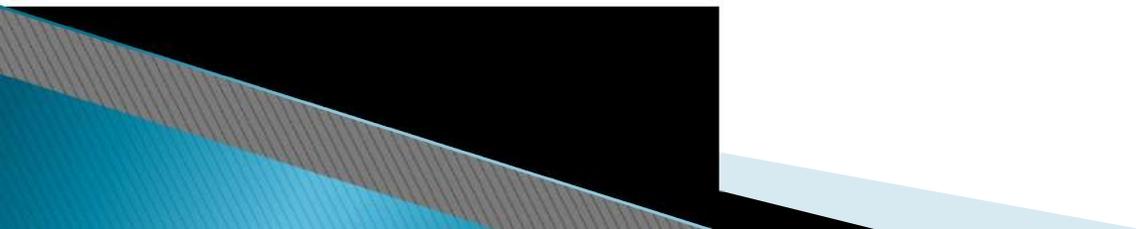


# Dataset

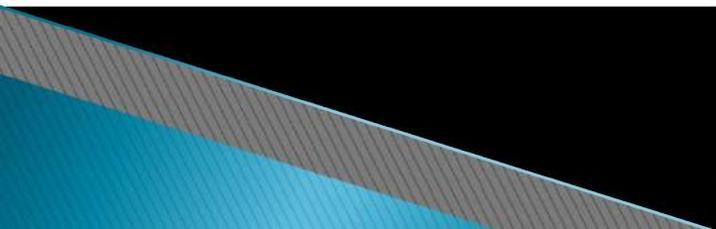
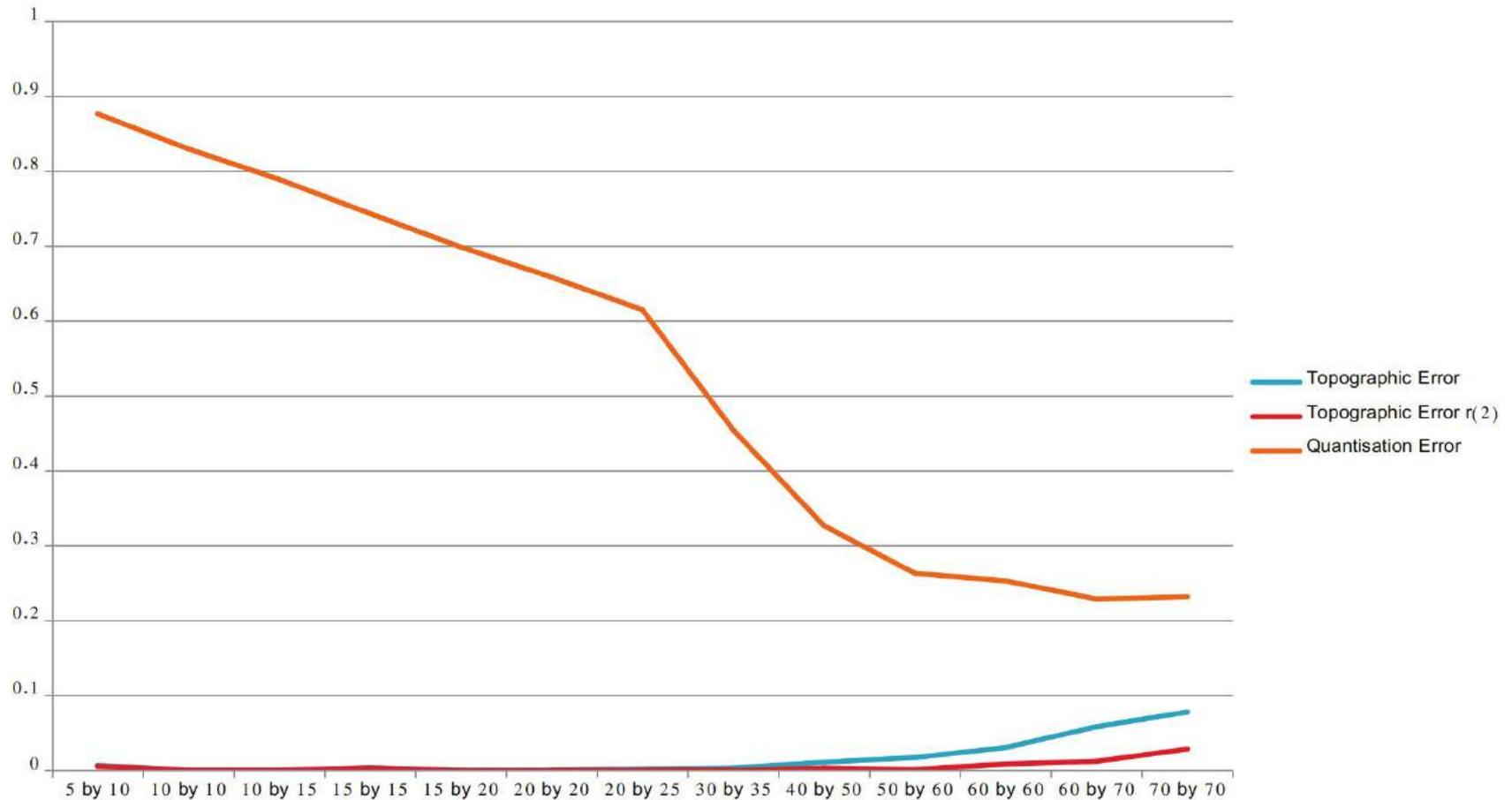
- Extracted from the Dublin City Council (<http://dublinked.ie/>)
- 255 available datasets and associated metadata
- Features include
  - Title, Organization, Theme, Notes and Tag extracted from metadata
  - Resource Fields extracted from field names of tabular data
  - Location, Person, Organization extracted using named entity recognition (NER)

# Model Development and Selection

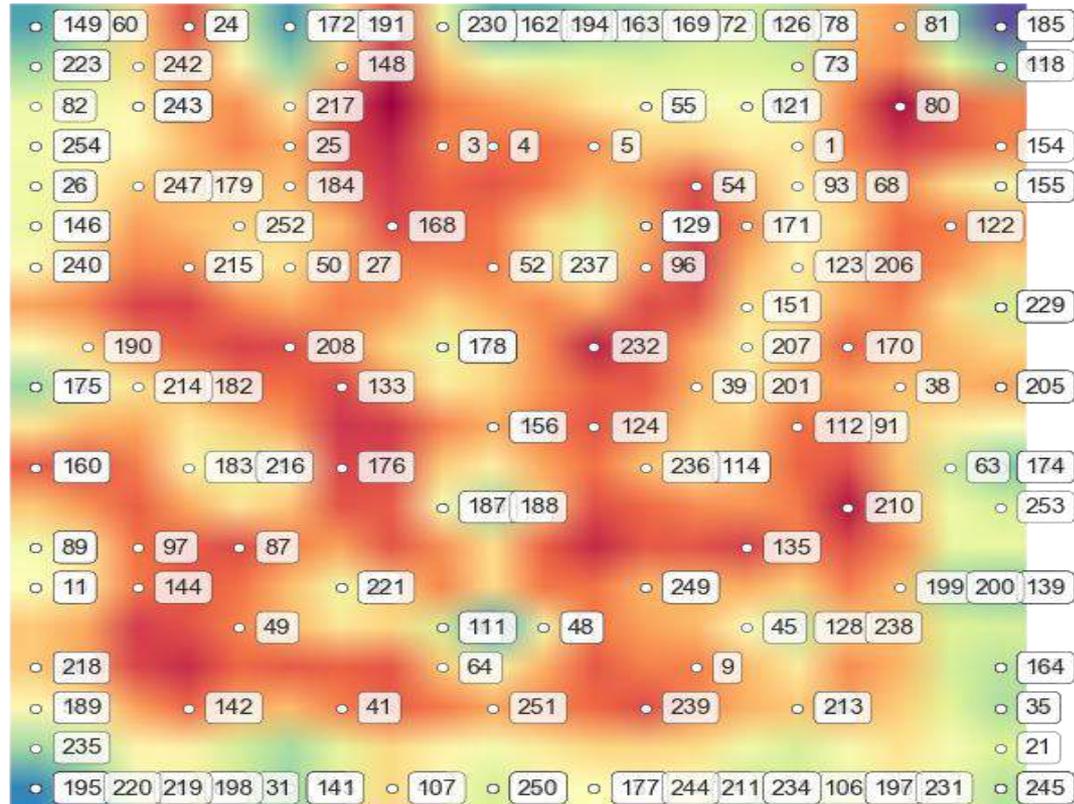
- SOM was trained with different SOM sizes
- The following measures were computed for each map instance
  - Topological error
  - Quantisation error
- A 20 by 20 map was selected



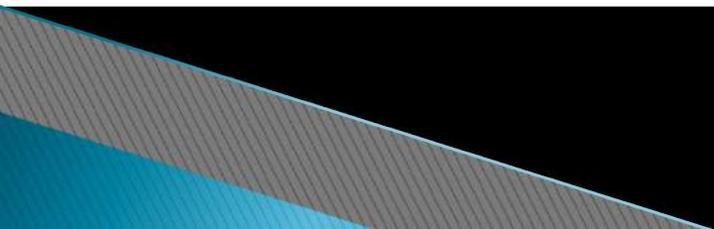
# Topographic & Quantisation Errors



# Topographic Map of Datasets



# Evaluation

- Results were presented to domain experts for evaluation
  - Each node and their neighbours, usually up to a radius of 2, were examined
  - The experts were able to identify the topics that relate each node and its neighbours in the datasets
- 

# Dataset Recommender Service

- Model was implemented in CKAN-based open data platform (Route-To-PA Platform)
  - Results for “Parks” in Dublin City produced a list of datasets on other parks, libraries, air pollution and monitoring data, trees, landscape maintenance, energy consumption.
  - Result relates recreation, sustainable environment and culture
  - The model has been extended to the Dutch Language with equally good results. It has also been used as a basis for recommending datasets that can be merged.
- 

# Related datasets for 'Parks' dataset

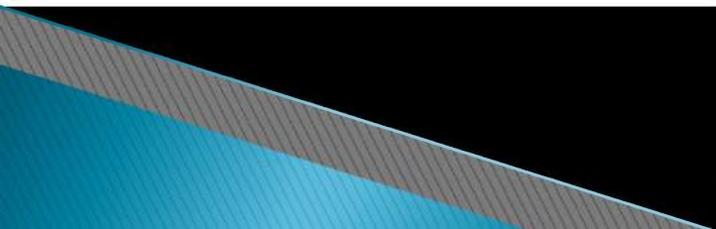


The image shows a screenshot of a web interface titled "Related Datasets". The title is in white text on a blue background. Below the title is a search bar with a magnifying glass icon on the left and a grey bar on the right. A list of 15 datasets is displayed below the search bar, each preceded by a blue bullet point. The datasets are:

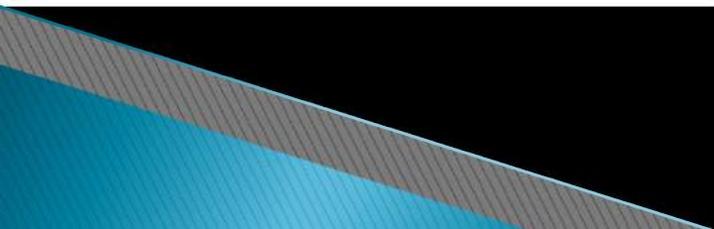
- [Art in the Parks - A Guide to Sculpture in Dublin City Council Parks](#)
- [DLR Martello Towers - Location & Gun Range](#)
- [DLR Libraries](#)
- [Libraries](#)
- [Air Pollution Monitoring Data Dublin City](#)
- [Air Quality Monitoring Data Dublin City](#)
- [Digital Elevation Model of Ireland](#)
- [DLR Landscape Maintenance & Additional Sites](#)
- [Coastline outline of Ireland](#)
- [Trees](#)
- [Urban Tree Survey of South Central Dublin City 2007-2009](#)
- [Mobile Libraries](#)
- [Dublin City Libraries Accessibility Audit](#)
- [Energy Consumption \(Gas and Electricity\) Civic Offices 2009-2012](#)

# Beyond Dataset Relatedness

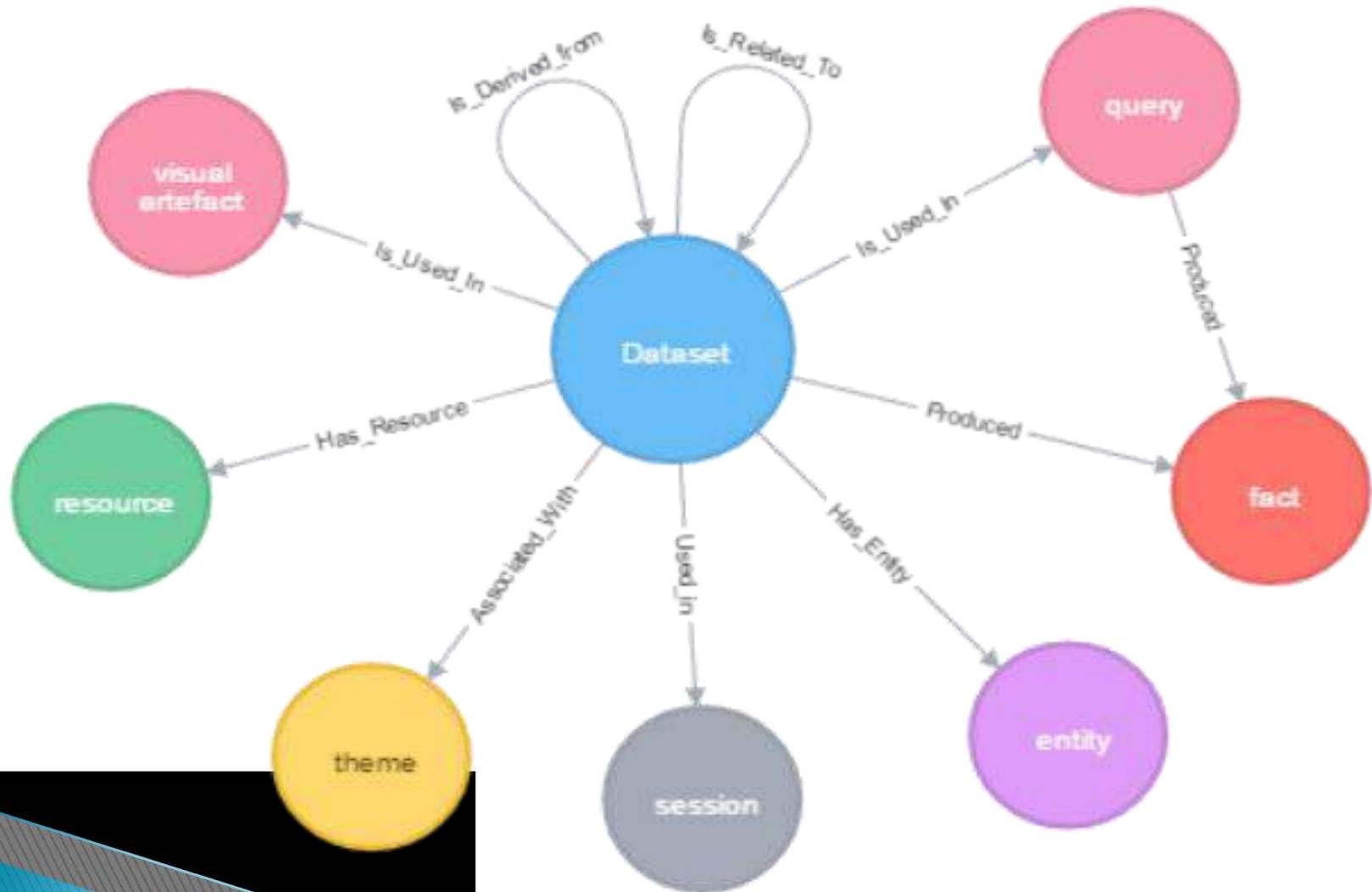
- ☞ Can we discover different categories or themes implicit in the datasets ?
- ☞ Can we build and explore the social network of the datasets ?
- ☞ Can we explore how these datasets are connected to one another ?
- ☞ Can we discover centrality or isolation of datasets ?



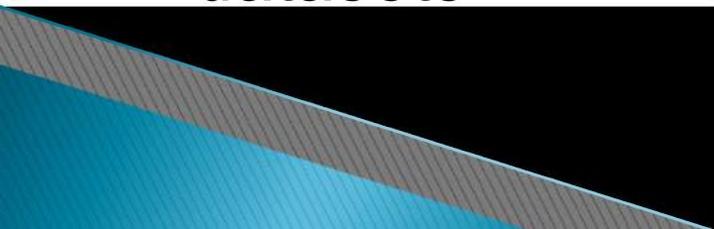
# Knowledge Graphs

- Large networks of structured information about entities and their semantic relationships.
  - Made up of entities as nodes and relationships between entities as edges
  - based on the Resource Description Format (RDF) data model
  - Querying the data in a KG is based on structured patterns, using query languages in the style of SPARQL.
- 

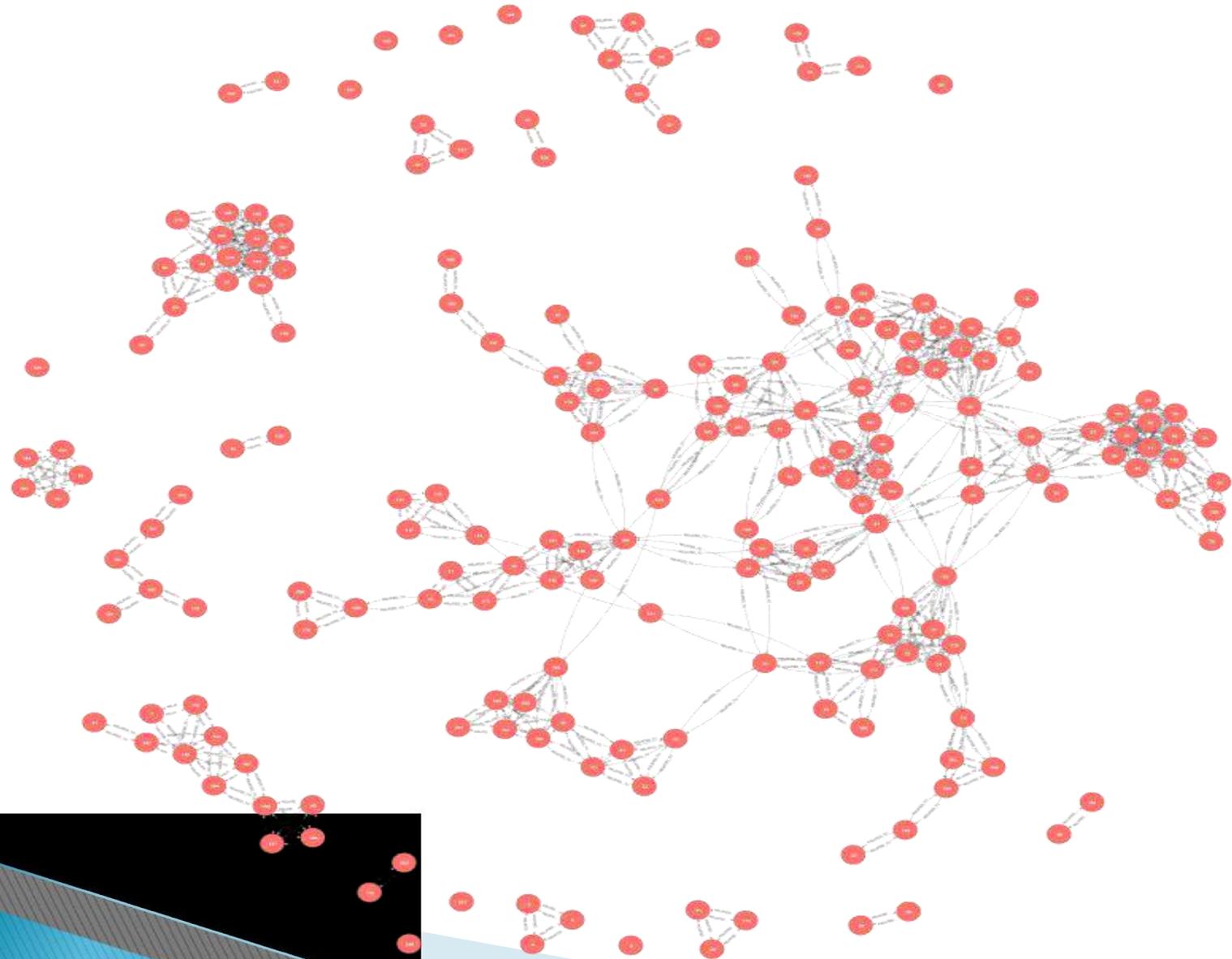
# Graph Schema



# Generating the Graph

- Focused only on dataset and the *is\_related\_to* relationship
  - degree of 1 for the dataset relatedness
  - 205 nodes and 956 edges
  - Each node is labelled with the serial number of the dataset
  - Each edge is labelled “RELATED\_TO” and has the following properties: the distance between the datasets, and the common terms between the datasets
- 

# Generated Graph



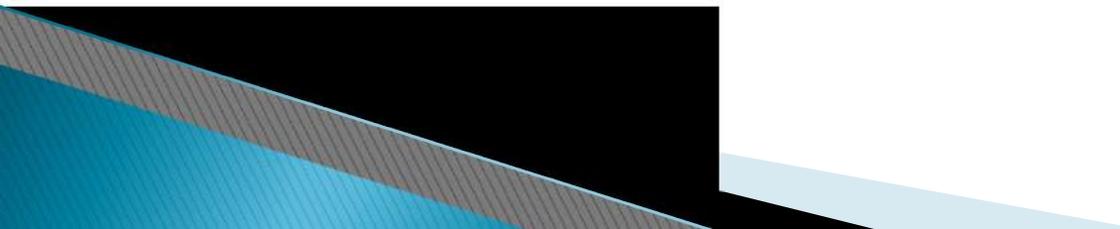
# Centrality Measures

• Degree Centrality

• Betweenness Centrality

• Closeness Centrality

• Clusters



# Applying the Knowledge Graph

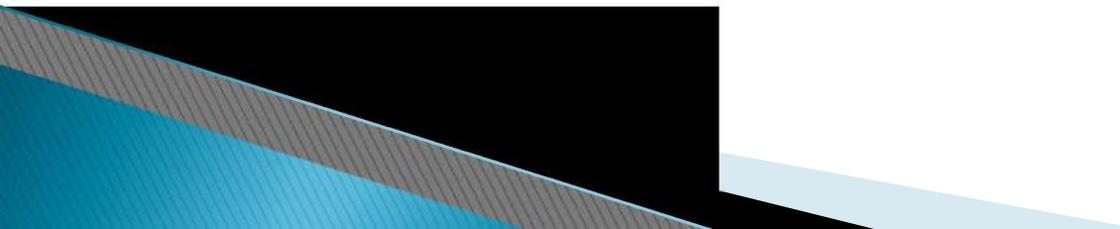
## 🌀 Profiling

- degree centrality for each cluster serves as entry point to the different clusters
- datasets with the highest betweenness centrality are datasets that provides a bridge for two apparently different concepts

## 🌀 Recommendation

- content-based recommendation
- collaborative recommendation (use user profiles)
- hybrid approaches

## 🌀 Integration



# Concluding Remarks

Our representation of relatedness is a simplistic view of the relationship in the dataset considering our proposed graph schema. Interestingly, this simplistic representation gives a lot of insight into the dataset, revealing very otherwise unknown and interesting properties in the dataset.

