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Knowledge Graphs

How to create a Knowledge Graph?



Outline

- Overview
- Design of an RDF Graph
- Design of a Property Graph
- Summary



Overview

- Creating a Knowledge Graph
 - Design of Schema
 - Populating the knowledge graph



Overview

- Creating a Knowledge Graph
 - Design of Schema
 - Strictly speaking not required to get started
 - Design improves the usefulness
 - Populating the knowledge graph



Overview

- Creating a Knowledge Graph
 - Design of Schema
 - Strictly speaking not required to get started
 - Design improves the usefulness
 - Populating the knowledge graph
 - Structured and semi-structured sources
 - Text
 - Curation



Outline

- Overview
- Design of an RDF Graph
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Design of an RDF Graph

- Linked Data Principles
 - Use URIs as names of things
 - Use HTTP URIs so that people can look up those names
 - Whenever someone looks up a URI provide useful information using standards RDF and SPARQL
 - Include links to other things so that people can discover new things



Use URIs as name of things

- Identify the items of interest (People, Places, Product, Gene, ...)
 - Referred to as resources
 - Information resources
 - http://www.Wikipedia.Org
 - Non information resources
 - Person: http://biglynx.co.uk/people/dave-smith



Use URIs as name of things

- Identify the items of interest (People, Places, Product, Gene, ...)
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 - Person: http://biglynx.co.uk/people/dave-smith
- Keep them short and pneumonic
- Ensure persistence



Use HTTP URIS

- Use HTTP URIs so that people can lookup things
 - Do not use
 - Digital Object Identifier: doi:10.1038/nphys1170
 - Prefer:
 - https://doi.org/10.1038/nphys1170



Use HTTP URIS

- Use HTTP URIs so that people can lookup things
 - Looks up is also called Dereferencing
 - When we look up an information object
 - We get a representation of its current state
 - When we look up a non-information object
 - We get a set of RDF facts about it



- Dereferencing of a non-information object returns RDF data
 - Use standardized vocabularies
 - Catalogs, Organizations, Multi-dimensional data
 - Schema.Org



Dereferencing of a non-information object returns RDF data

```
@prefix uk_cabinet: <a href="http://reference.data.gov.uk/id/department/">http://reference.data.gov.uk/id/department/</a>
uk_cabinet:co rdf:type org:Organization
uk_cabinet:co skos:prefLabel "Cabinet Office"
uk_cabinet:co org:hasUnit uk_cabinet:cabinet-office-communications
uk_cabinet:cabinet-office-communications rdf:type org:OrganizationUnit
uk_cabinet:cabinet-office-communications skos:prefLabel "Cabinet Office Communications"
uk_cabinet:cabinet-office-communications org:hasPost uk_cabinet:post_246
uk_cabinet:post_246 skos:prefLabel "Deputy Director, Deputy Prime Minister's Spokesperson"
```

SKOS: Simple Knowledge Organization System

ORG: Organization



Dereferencing of a non-information object returns RDF data

```
@prefix uk_cabinet: <a href="http://reference.data.gov.uk/id/department/">
wk_cabinet:co rdf:type org:Organization
uk_cabinet:co skos:prefLabel "Cabinet Office"
uk_cabinet:co org:hasUnit uk_cabinet:cabinet-office-communications
uk_cabinet:cabinet-office-communications rdf:type org:OrganizationUnit
uk_cabinet:cabinet-office-communications skos:prefLabel "Cabinet Office Communications"
uk_cabinet:cabinet-office-communications org:hasPost uk_cabinet:post_246
uk_cabinet:post_246 skos:prefLabel "Deputy Director, Deputy Prime Minister's Spokesperson"
```

SKOS: Simple Knowledge Organization System

ORG: Organization



Dereferencing of a non-information object returns RDF data

SKOS: Simple Knowledge Organization System

ORG: Organization



- If creating a new vocabulary becomes necessary, ensure that
 - it is documented
 - It is self-describing
 - versioning policy
 - it is defined in multiple languages
 - it is published by a trusted sources



- If creating a new vocabulary becomes necessary, ensure that
 - it is documented
 - It is self-describing
 - Information about the schema is available within the data itself
 - versioning policy
 - it is defined in multiple languages
 - it is published by a trusted sources



- Relationship Links
- Identity Links
- Vocabulary Links



- Relationship Links
 - Relate object in one dataset to an object in another

```
@prefix big: <http://biglynx.co.uk/people/>
```

@prefix dbpedia: http://dbpedia.org/resource/

big:dave-smith foaf:based_near dbpedia:Birmingham



- Identity Links
 - Equate objects in one dataset to objects in another dataset

```
@prefix ds: <http://www.dave-smith.eg.uk>
```

@prefix owl: http://www.w3.org/2002/07/owl>

@prefix big: <http://biglynx.co.uk/people/>

ds:me owl:sameAs big:dave-smith



- Vocabulary Links
 - Links from the data to the definition of terms

@prefix big: <http://biglynx.co.uk/people/>

@prefix dbpedia: <http://dbpedia.org/ontology/>

big:SmallMediumEnterprise rdfs:subClassOf dbpedia:Company



Design of an RDF Graph

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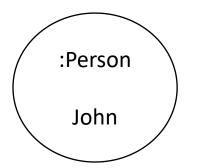


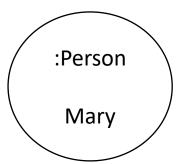
Design of a Property Graph

- Choosing nodes, labels and properties
- When to introduce relationships
- When to introduce relationship properties
- How to handle non-binary relationships



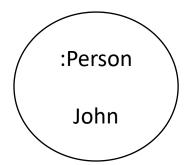
Nodes usually represent entities in a domain

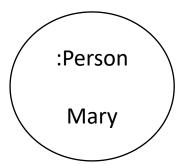






- Nodes usually represent entities in a domain
 - How to represent gender?







- Nodes usually represent entities in a domain
 - How to represent gender?

:Person :Male

John

:Person :Female Mary Introduce a new Label

Labels are like classes

Labels should be natural

Labels should not change with time

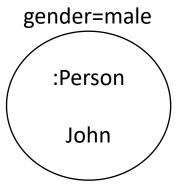
Could benefit from indexing



- Nodes usually represent entities in a domain
 - How to represent gender?

:Person :Male

:Person :Female Mary

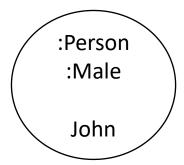


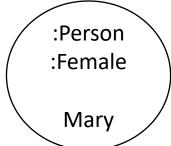
gender=female :Person Mary Introduce a new node property

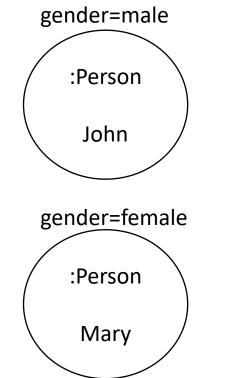
Property should not change with time

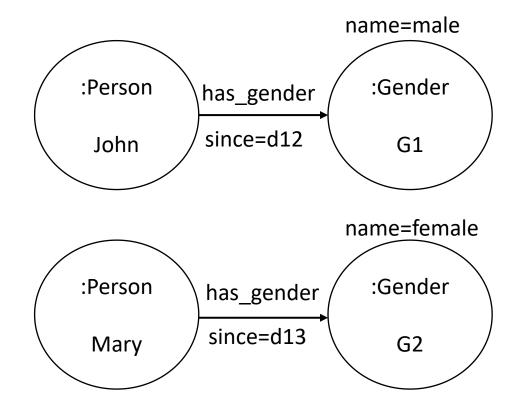


- Nodes usually represent entities in a domain
 - How to represent gender?





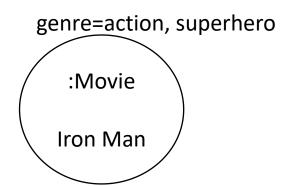


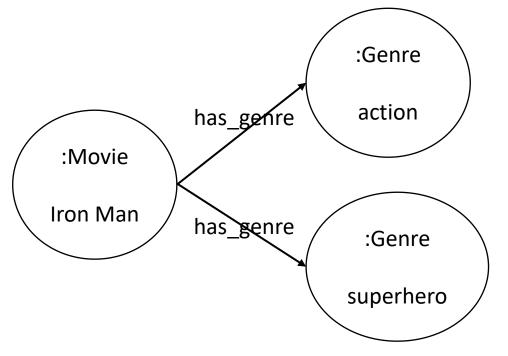




When to introduce a Relationship?

When efficient access is required

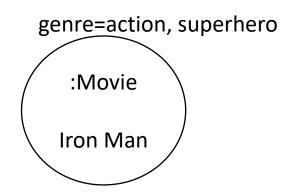


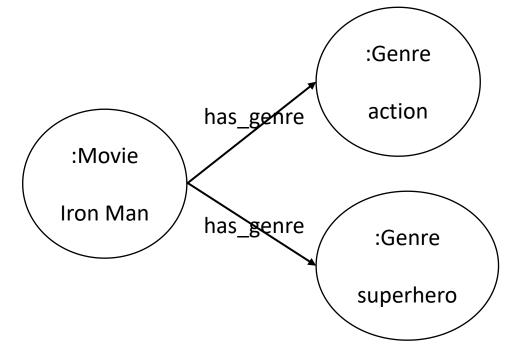




When to introduce a Relationship?

When efficient access is required





Find movies that have genres in common

MATCH (m1:Movie), (m2:Movie)

WHERE any(x IN m1.genre WHERE x IN m2.genre)

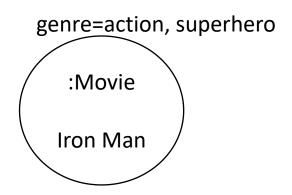
AND m1 <> m2

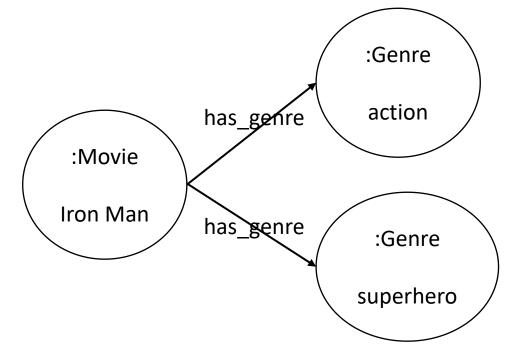
RETURN m1, m2



When to introduce a Relationship?

When efficient access is required





Find movies that have genres in common

MATCH (m1:Movie), (m2:Movie)

WHERE any(x IN m1.genre WHERE x IN m2.genre)

AND m1 <> m2

RETURN m1, m2

MATCH (m1:Movie)-[:has_genre]->(g:Genre), (m2:Movie)-[:has_genre]->(g)

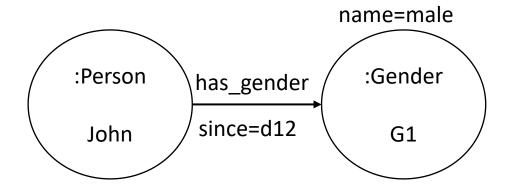
WHERE m1 <> m2

RETURN m1, m2



When to Introduce a Relationship Property

- Common use cases for relationship properties
 - Time varying relationships
 - Provenance
 - Confidence





When to Introduce a Relationship Property

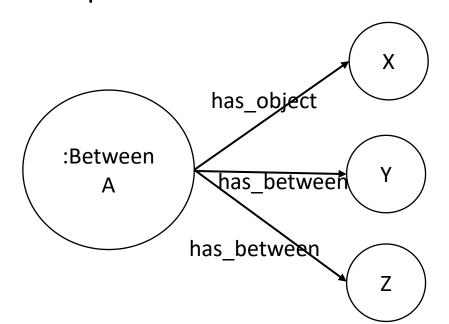
Disadvantages

- Many systems do not index on relationship properties
- This may not be a problem if relationship properties are used in the last stage of query processing
- For performance sensitive queries, it is better to reify the relationship



Handling non-binary relationships

- Reification is a common technique to handle relationships with arity higher than 2
 - Create an object representing the relationship
 - Create objects for each argument of the relationship
 - Introduce relationships to connect them



X is between Y and Z



Summary

- Common considerations
 - Choice of classes and relations
 - Reification and handling higher arity relationships
- RDF knowledge graph design driven by
 - Use over the WWW
 - Reuse of vocabularies
 - Linking data
- Property Graph design driven by
 - Optimizing query performance

Even though there are some guidelines to design, there are also equivalent good choices.



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