Aggregating and Reasoning

Introduction

- First step, Convert from Traditional format to RDF format
- Allows ontology store and manipulate with ontology-based tools
- Process need to assign identifiers to resources
- Re-represent data in terms of a shared ontology (Ex. FOAF)
- While conversion preserve their original schema
- Apply ontology mapping to unify data on the schema level
- Done by mapping classes (types) and properties from different schemas to a shared ontology (Ex. FOAF)

Aggregation task need to find identical resources across data sets

Two step process:

- Requires domain-specific knowledge to consider two instances are same
- RDF or OWL has limited knowledge to capture instance equality
- Determine equality applying threshold based similarity measure need procedural representation of knowledge
- Determine rules or procedures in the domain to carry out the actual instance unification or "smushing"
- Perform smushing as a reasoning task iteratively executing rules until no more equivalent instances is found

Representing Identity

- Main advantages of RDF over other representation to uniquely identify resources
- Primary mechanism is assignment of URIs to resources
- Every resource, except blank nodes is identified by a URI
- Many candidates for identifier exists (Ex. ISBN, ISSN etc.)
- All are unique but not single Ex. same publication is assigned two or more identifiers (DOIs)

- Multiple identifiers represented in RDF in two ways:
- First, introduce separate resource and use the identifiers as URIs
- Alternative way, to chose one of the identifiers and use it as a URI
- Equality of these resources can be expressed using the owl:sameAs property
- Good practice for Resource identifiers need to conform to the URI specification

- Good URIs are unique and stable
- Good URIs should be unambiguous
- If URI changes, there is no way to rename resources
- Only solution is to introduce a new resource and assert its equivalence with the old resource
- Difficult to notify changes to remote systems
- Abstract concepts one should not choose URIs that are recognized by a server

On the notion of equality

- RDF/OWL represent (in)equality using the owl:sameAs and owl:differentFrom properties
- Equality meaning depends on domain knowledge and level of modelling
- Requires characteristic to consider, level of modelling Ex. Individual or group (role equivalence)

Leibniz-law

- Identity of Indiscernibles or Leibniz-law: For any x and y,
 if x and y have all the same properties, then x is identical to y.
- $\forall P: P(x) \leftrightarrow P(y) \rightarrow x = y$
- converse of the Leibniz-law is called Indiscernibility of Identicals: For any x and y, if x is identical to y, then x and y have all the same properties
- $\forall P: P(x) \leftrightarrow P(y) \leftarrow x = y$

- Leibniz-law different interpretations in open and closed worlds
- open world no. of properties unknown Leibniz-law is not useful
- closed world iterate over all properties to assume two resources equal
- closed world assumption undesirable in situation due to lack of information
 Ex. same gender, but not want to assume they are identical
- Leibniz-law stronger than our natural notion of equality Ex. 2 perfect spheres at distance d to each other
- Solution to introduce weaker notions of equality, exclude impure, extrinsic properties, Ex. *foaf :based near, foaf :gender*

- OWL built on open world assumption, which means Leibniz-law cannot be used to infer identity
- But owl:sameAs conforms to Formula of Indiscernibility of Identicals (self-identical objects)
- two symbols denote the same object and thus they must be indiscernible (interchangeable in statements)
- (s1, owl:sameAs, s2) ∧ (s1, p, o) → (s2, p, o)
- (p1, owl:sameAs, p2) ∧ (s, p1, o) → (s, p2, o)
- (01, owl:sameAs, 02) ∧ (s, p, 01) → (s, p, 02)

- The reflexive, symmetric and transitive properties of sameAs:
- \(\forall s: (s, owl:sameAs, s)\)
- (s1, owl:sameAs, s2) → (s2, owl:sameAs, s1)
- $(s1, owl:sameAs, s2) \land (s2, owl:sameAs, s3) \rightarrow (s1, owl:sameAs, s3)$
- Below is not inconsistent in open world assumption
- (s1, owl:sameAs, s2)
- (s1, foaf :name, "John")
- (s2, foaf :name, "Paul") [But inconsistent in closed world]
- (because s1 has the foaf :name Paul and s2 has the foaf :name John exist somewhere, but missing assumption in closed world)

Determining equality

- OWL has limited set of constructs for (in)equality statements
- Equality proved through Functional and inverse functional properties (IFPs) and maximum cardinality restrictions
- inverse-functional Ex. foaf :mbox , cardinality Ex. ex:hasParent
- Ways to conclude 2 symbols do not denote the same, objectowl:differentFrom Ex. instances of disjoint classes
- All knowledge cannot be expressed in OWL, need more expressive rule languages Ex. Rule Language - Horn logic

- Sometimes expressivity of rule languages is not sufficient
- Concatenation of literals is not part of either DL or rule languages –
 Ex. matching of person names
- programming language or transformation languages such as XSLT can perform using data manipulation functions
- Solution combine declarative and procedural reasoning
- Reasoning combines data manipulation services + execute regular Description Logic or rule-based reasoner

Reasoning with instance equality

- Reasoning inference of new statements (facts) follow from set of known statements
- Every piece of additional knowledge excludes some unintended interpretation to the knowledge base
- infinite number of new statements could be inferred from any nontrivial knowledge base
- Not all, but knowledge base should contain all the important knowledge relevant to that task

Description Logic versus rule-based reasoners

- OWL DL was language is expressive, *decidable*, completeness to create *efficient reasoners for it*
- Decidability guarantee to find an answer in finite time
- Completeness guarantee to find all the complete answers
- Complexity of OWL DL are theoretical, concern worst-case complexity
- In practice, only average case matters as worst cases are rare

- Description Logic reasoners primary tasks of classification, consistency checking of ontologies
- Other reasoning tasks are reformulated as consistency checking
- To check equality, check for inconsistency
- Inefficient to perform consistency check for every pair of instances in the ontology
- Alternative Rule-based reasoning

Forward versus backward chaining

- Rules used either in forward-chaining or backward-chaining manner with different trade-offs
- Forward chaining all consequences of the rules are computed to obtain a *complete materialization of the knowledge base*
- Done by repeatedly checking prerequisites of rules and adding their conclusions until no new statements can be inferred
- Advantage Queries are faster, Disadvantage takes huge space

- Backward-chaining, rules executed on demand, i.e. when queries needs to be answered
- given a conclusion and check whether it is explicitly stated or whether it could inferred from some rule
- Drawback longer query execution times
- Rule-based axiomatization advantage reasoning fine-tuned by removing rules that only infer knowledge and irrelevant to reasoning task
- Applied in forward chain can save significant amounts of space

- Ex. Flink System use built-in inference engine of the ontology store
 + Java based identity reasoner
- Reasoning is performed combining forward- and backward chaining to balance efficiency and scalability

Variations of Identity Reasoning

- 3 basic variations on what point the identity reasoning performed
- (Smushing is carried out while adding data into repository, if new instance already exists)
- Descriptions merged: only one identifiers is kept, all information of resource consolidated under that identifier
 - 1. Disadvantage: impossible to unmerge descriptions using *owl:sameAs* relationship later
- 2. Reasoning performed after added to repository for duplicates using owl:sameAs relationships
 - 1. Disadvantage: removing statements is an expensive operation
- 3. Aggregating data dynamically done at query time such as Ajax

Evaluating smushing

- Smushing considered as retrieval problem or a clustering problem
- Retrieval try to achieve a maximum precision and recall for correct set of mapping
- Conceptualize as clustering single resource mapped to a number of other resources
- evaluate clusters against the ideal clustering
- smushing considered as optimization task optimize an information retrieval or clustering-based measure

- Instance unification (smushing) is "easier" than ontology mapping
- Ontology mapping chances for two instances ends up in a local minimum
- Some cases have both positive and negative rules ends up inconsistent state
- Measuring the success of retrieval or clustering is application dependent

Advanced Representations

- Missing features in future versions Ex. *owl:ReflexiveProperty*
- More expressive Rule Interchange Format (RIF) include FOL is under development
- Additional expressive power using temporal logic (statement true over certain time or interval)
- Though ontology should be stable, still dynamism desirable at some instances
- Extending logic with probabilities for accurate equivalence checking