















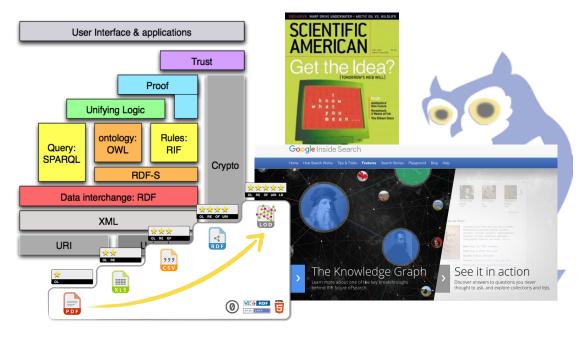


Data, Ontologies, Rules, and the Return of the Blank Node

Markus Krötzsch Knowledge-Based Systems, TU Dresden

Virtual 23-27 October 2022, Hangzhou, China





Vocabulary has Meaning

- Identity of "resources"
- Important online (HTTP semantics)
- Important in ontologies (vocabulary)

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- Shared conceptualisation
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Being Pedantic is OK

- Specifications are valued
- Formal semantics matters
- Caring about details

Knowledge is for Sharing

- Shared conceptualisation
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The Triple



The Triple



Great Advantages

- uniformity & simplicity
- scalability
- structural compatibility
- and the powerful "graph" metaphor

The Triple



Great Advantages

- · uniformity & simplicity
- scalability
- structural compatibility
- and the powerful "graph" metaphor

But ... the world is complex

- Other communities prefer less normalisation (RDBs, JSON, ...)
- OWL axioms and ShaCL shapes do not fit into single triples
- Modern Knowledge Graphs are not so simple ...



The Knowledge Graph of Wikipedia

- Free, community-built knowledge base
- Large and dynamic:
 - >100,000,000 items (since 19 Oct 2022)
 - >10,000 properties
 - >14.2B Triples in RDF
 - >20,000,000 edits/month
- · International, active community
 - >20,000 active users (contributing during a month)
- Many uses



Fig.: Wikidata is celebrating its 10th Birthday on 29th Oct 2022



British computer scientist



TimBL | Sir Tim Berners-Lee | Timothy John Berners-Lee | TBL | Tim Berners Lee | T. Berners-Lee | T Berners-Lee | Tim Berners-Lee | T.J. Berners-Lee



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instance of	human ▶ 1 reference		 	
employer	Start time end time position held	1984 1994 Fellow		
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award received

Queen Elizabeth Prize for Engineering

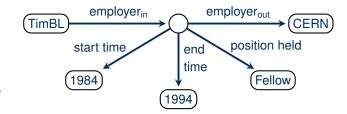
point in time
2013
together with
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Vint Cerf
Louis Pouzin
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Wikidata and the Semantic Web

Each Wikidata statement turns into several triples

Fig. Sketch of reified statement ▶



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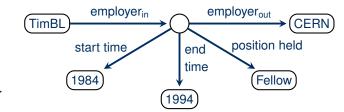


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Wikidata SPARQL & RDF usage

- Official IRI mapping and vocabulary
- Free RDF dumps + LOD exports
- Public live SPARQL endpoint at https://query.wikidata.org/ (BlazeGraph)

Key technologies for community and 3rd party users!

From objects to triples ... and back?

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The OWL approach:



From objects to triples ... and back?

The OWL approach:



Great for what it does ... but not always what we need

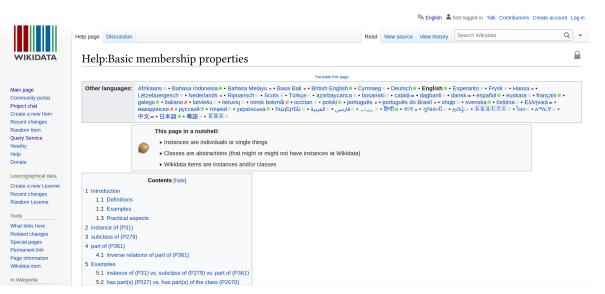
- Ontological information may be intertwined with KG
- What reasoning we want may depend on context
- We may need new semantic interpretations for our data

New semantic interpretations for data

Wikidata says: "universe — has part(s) of the class — astronomical object"

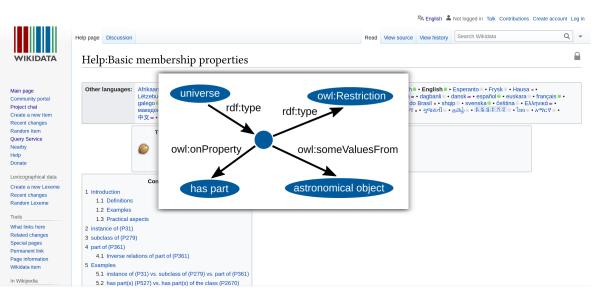
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Example: Find all cities

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    ?city rdf:type/rdfs:subClassOf* <https://example.org/city>.
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What kind of semantics can we implement in SPARQL?

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Theorem:

SPARQL cannot express reasoning tasks that are harder than NLogSpace.

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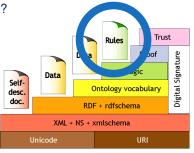
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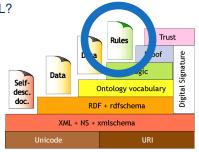
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A Complicated Relationship

- since 2000: Notation 3 Logic developed (incl. RDF rules)
- 2004: SWRL W3C member submission
- 2005: W3C charters WG for Rule Interchange Format (RIF)
- 2009: OWL RL becomes W3C Rec
- 2010: RIF enters recommendation
- 2010: 1st Datalog 2.0 Workshop
- all this time: SemWeb practitioners use various forms of rules (except RIF)



The Simplest Rule Language

Datalog: a very simple rule language

- Simple predicate-logic rules:
 rdf:type(X, Y) ∧ rdfs:subClassOf(Y, Z) → rdf:type(X, Z)
- Conjunctive query patterns + recursion
- Polynomial time data complexity
- Fast reasoners with RDF support: RDFox [Nenov et al. ISWC 2015], VLog [Carral et al. ISWC 2019]

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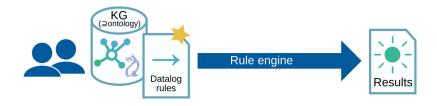
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Nothing complicated

- No negation
- No disjunction
- No built-ins or filters

OWL with Datalog





How complicated are these rules?

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subClassOf(?C,?D1) \land subClassOf(?C,?D2) \land \\ isInter(?D12,?D1,?D2) \rightarrow subClassOf(?C,?D12)
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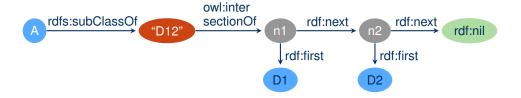
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RDF encoding of SubClassOf(A ObjectIntersectionOf(D1 D2)):



TRIPLE(?D12, owl:intersectionOf, ?L1) \(\Lambda \)

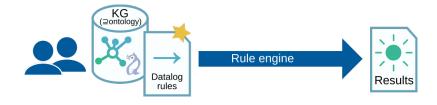
TRIPLE(?N1, rdf:next, ?N2) ∧ TRIPLE(?N2, rdf:next, rdf:nil) ∧

 $\mathsf{TRIPLE}(\mathsf{?N1},\mathsf{rdf:first},\mathsf{?D1}) \land \mathsf{TRIPLE}(\mathsf{?N2},\mathsf{rdf:first},\mathsf{?D2}) \rightarrow \mathsf{isInter}(\mathsf{?D12},\mathsf{?D1},\mathsf{?D2})$

→ 10 reasoning rules and 36 parsing rules for much of OWL EL [ECAl Tutorial 2020]

So ... what have we accomplished?

- From ontologies to data
- From W3C semantics to user-space semantics
- From dedicated reasoners to <50 lines of code



So ... what have we accomplished?

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However ...

- Triples are not enough! [Krötzsch, IJCAI 2011 & ISWC 2012]
- Flexibility has a performance cost (VLog on Snomed: 2min)
- Getting rules right is not easy

Why Datalog is not enough

Observation 1: Encoding complex objects in RDF requires auxiliary nodes

Observation 2: Datalog can only produce new relationships among existing nodes

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→ Major Weakness: We can parse complex RDF structures but not create them!

Solution: Enable value invention in rules

```
isInter(?D12,?D1,?D2) \rightarrow TRIPLE(?D12,owl:intersectionOf,\_:n1) \land \\ TRIPLE(\_:n1,rdf:next,\_:n2) \land TRIPLE(\_:n2,rdf:next,rdf:nil) \land \\ TRIPLE(\_:n1,rdf:first,?D1) \land TRIPLE(\_:n2,rdf:first,?D2)
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→ "Existential Rules"

From Datalog to Existential Rules

Existential Rules: a simple rule language

- Simple predicate-logic rule, like Datalog
- Conjunctive query patterns + recursion + value invention
- Query answering undecidable
- Fast reasoners with RDF support: RDFox [Nenov et al. ISWC 2015], VLog [Carral et al. ISWC 2019]

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Reasoners recursively apply rules and add new values, hoping for termination

→ Most tool support is for rule sets that "terminate"

The Power of Terminating Existential Rules

Recall:

- Datalog cannot see negative information (no negation)
- Datalog cannot solve non-polynomial tasks

Clear:

- Existential rules cannot see negative information (no negation)
- Terminating existential rules can only solve computable tasks

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Theorem* [Bourgaux et al., KR 2021]

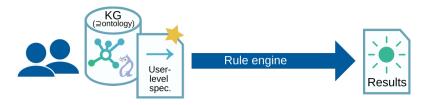
Terminating existential rules can solve every computable task that does not depend on negative information.

* Terms and conditions apply; see paper

The Return of the Blank Node?



Summary: User-level specifications for interpreting triples





Summary: What really matters

We have split the world into triples, but still struggle to put it back together

- SPARQL is a start, but limited
- Rules are powerful, but subtle

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- Real-world complexity eludes single triples and single (OWL) axioms
- Our needs change from context to context
- Managing knowledge requires more than one AI method

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... but declarative, shareable meaning is more relevant than ever.

- Explanation and accountability requires shared concepts
- Declarativity is key to interoperability and scalability
- Knowledge is human, it will not go away

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What shall we do about it?

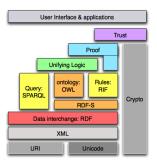
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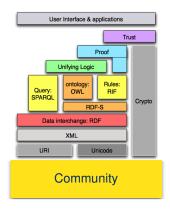
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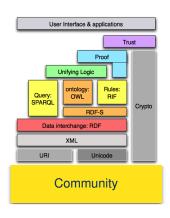
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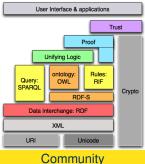
- 1. Appreciate what we stand for
- 2. Spread our values: meaning, sharing, precision
- 3. Focus on big challenges: flexibility, scalability, human collaboration, ...
- Find new ways to agree: on "standards", on concepts, on models
- Engage with communities who care and can help



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"Knowledge is human, it will not go away"

References All titles are links that lead to a download page

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We are always looking for new ideas. How about joining us? (Just get in touch, and we will see what can be done:-)