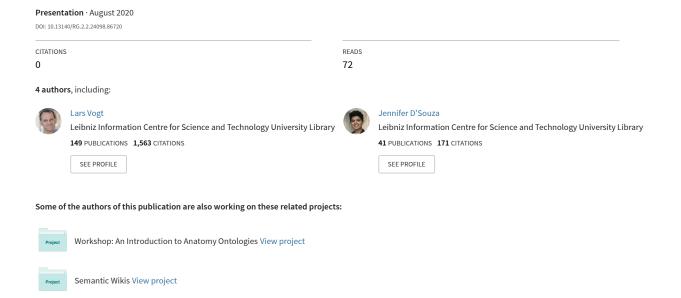
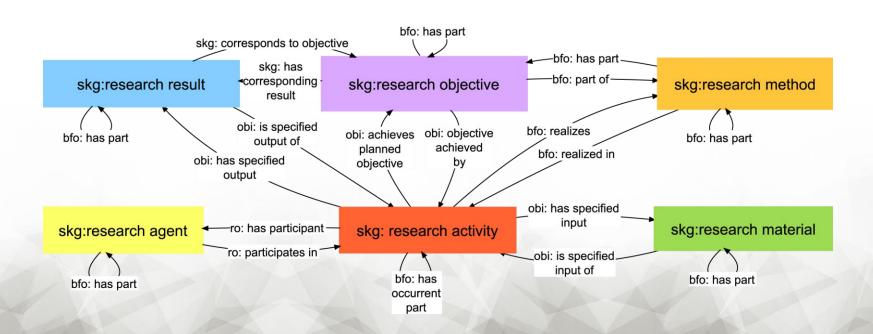
Towards Representing Research Contributions in Scholarly Knowledge Graphs Using Knowledge Graph Cells



Towards Representing Research Contributions in Scholarly Knowledge Graphs Using Knowledge Graph Cells



L. Vogt, J. D'Souza, M. Stocker, S. Auer







The Problem

Research is predominantly

communicated using unstructured

text. And the contents of

scholarly publications are not

machine-actionable.





The Problem

The number of publications is increasing exponentially, with more than 2.5 million new publications being issued each year.

Jinha (2010) Article 50 million: an estimate of the number of scholarly articles in existence. Learned Publishing 23(3), 258–263.





The Problem

As a result, researchers often have to search the contents of potentially relevant publications themselves to find those that are actually relevant to them. This becomes increasingly impossible with an exponentially increasing number of publications.

Landhuis (2016) Scientific literature: information overload. *Nature* 535(7612), 457–458.



The Solution

A promising solution to this knowledge management problem is to make these contents <u>machine-actionable</u>.



The Context – The FAIR Guiding Principles

Research communities and public stake holders have identified an increasing demand for the Findability, Accessibility, Interoperability, and Reusability of data and metadata (FAIR Guiding Principles).

Wilkinson et al. (2016) The FAIR Guiding Principles for scientific data management and stewardship. Scientific Data 3(1): 160018.



The Context – The FAIR Guiding Principles

The use of ontologies, knowledge graphs, the Resource Description Framework (RDF), and the Web Ontology Language (OWL) have proven to provide the semantic technologies required for implementing the FAIR Guiding Principles.

Jacobsen et al. (2019) FAIR principles: interpretations and implementation considerations. Data Intelligence 2(1-2), 10–29.

Vogt et al. (2019) SOCCOMAS: a FAIR web content management system that uses knowledge graphs and that is based on semantic programming.

Database 2019: baz067.





The Goal – A knowledge graph of scholarly publications

Our goal is to develop a knowledge graph of scholarly publications that makes available the <u>contents</u> of the publications in a form that complies with the FAIR Principles.

Challenges

Machine-actionability requires common data model

In order to build a FAIR knowledge graph of scholarly publications, some challenges have to be overcome. First, machine-actionability and FAIRness requires data to be formalized and standardized to some degree. This requires the development of a basic data model for integrating scholarly contents within the graph (Research Contribution Model).



Challenges

Machine-actionable graphs are often too complex for human readers

Another challenge results from the discrepancy between the

requirements for machine-actionability as opposed to human-readability

of data, with the former usually resulting in overly complex graphs with

lots of information that is irrelevant for a human reader. We developed

the idea of Knowledge Graphs Cells to tackle this problem.



Challenge

Modelling the contents of scholarly publications is very challenging, as they cover multiple domains, each with its own set of established standards and terminological conventions.

Representing Scholarly Knowledge Using Knowledge Graph Cells

Scholarly publications contain assertions

Scholarly publications contain assertions. An assertion is a proposition which is asserted or denied to be true. Independent of a particular domain, we can distinguish different basic types of assertions.

Types of assertions

- empirical data (descriptive, phenomenon, observation, measurement)
- activity of producing data (process of observing, measuring, etc.)
- method of producing data (plan for a data production activity)





Types of assertions

- result (ontological, hypothesis, theory, test-result value, explanation, etc.)
- activity of analyzing data (process of analyzing, testing, etc.)
- method of analyzing data (plan for a data analysis activity)

Types of assertions

Data (phenomena), results
(theories), and methods (plans for research activities) are the key elements of scholarly discourse.

Szostak (2007) Interdisciplinarity and the Classification of Scholarly Documents by Phenomena, Theories, and Methods. *Interdisciplinarity and transdisciplinarity in the organization of scientific knowledge: Actas del VIII Congreso ISKO-España*, 469–477.



Types of assertions

For each type of a scholarly assertion, we specify a graph pattern/template.

Types of assertions

• result (ontological, hypothesis, theory, test-result value,

e

And the RCM relates them to one another.

ar

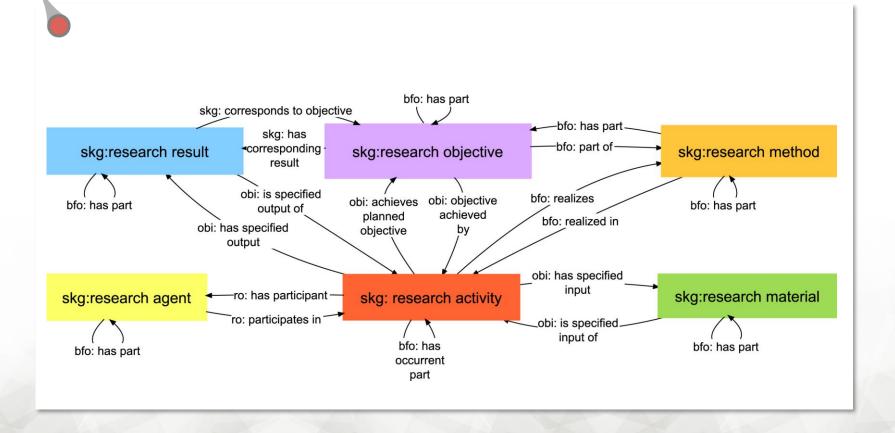
m

analysis activity)





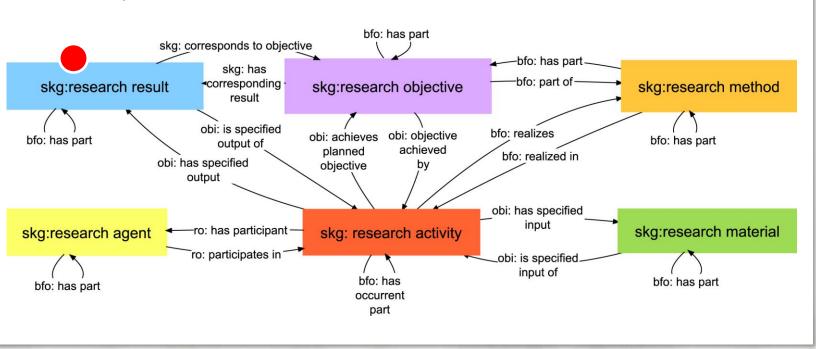
Integrating different types of assertions





Integrating different types of assertions

empirical data

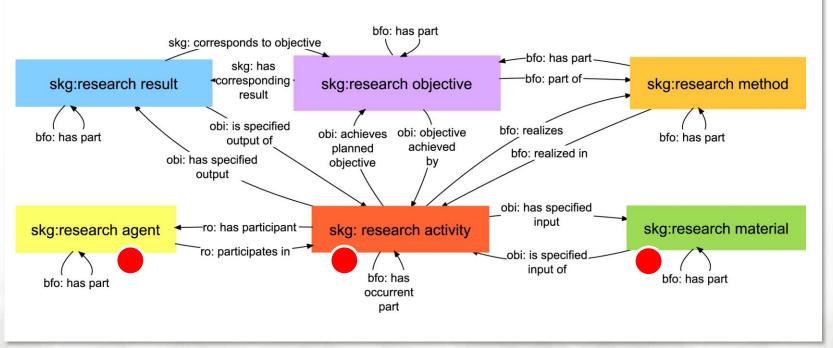






Integrating different types of assertions

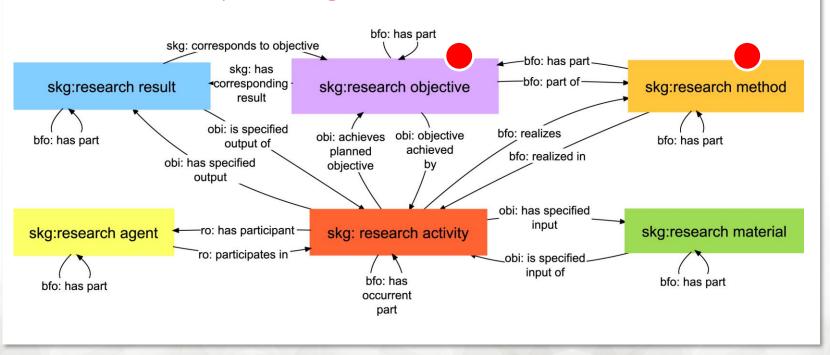
activity of producing data





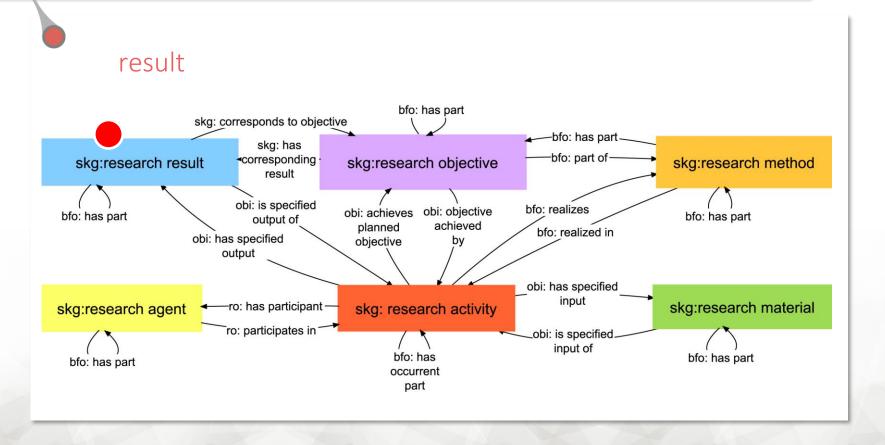
Integrating different types of assertions

method of producing data





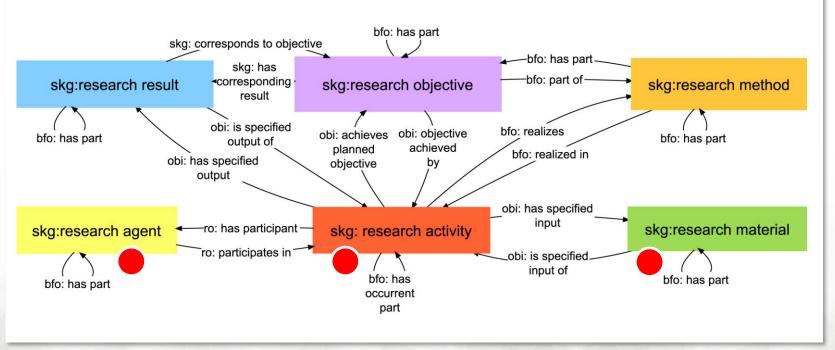
Integrating different types of assertions





Integrating different types of assertions

activity of analyzing data

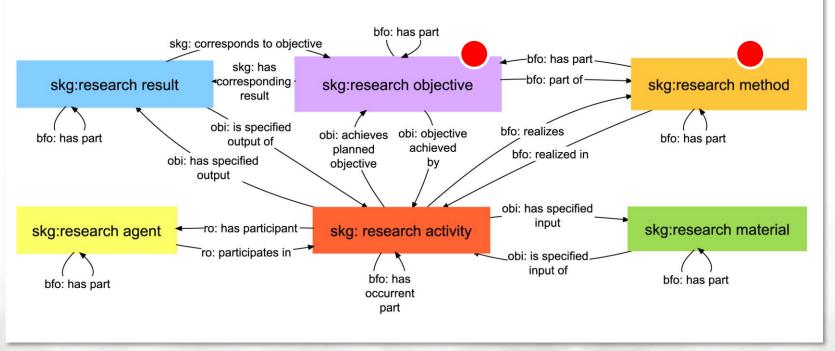






Integrating different types of assertions

method of analyzing data





Inherent nested hierarchy

Because the world is granular and because every whole can be partitioned

into finer grains—a research result consists of sets of results, a method of

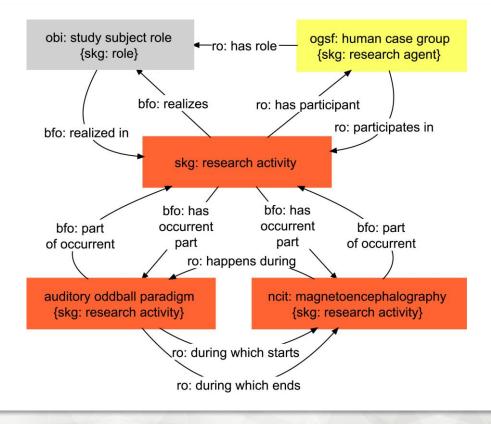
sets of steps, an activity of sets of events and material entities of sets

of parts—the RCM can be applied like a

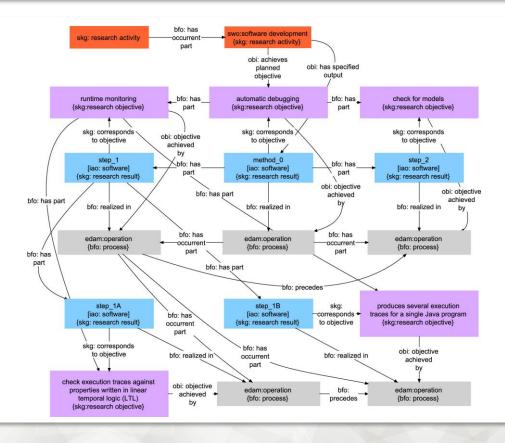
Matryoshka.



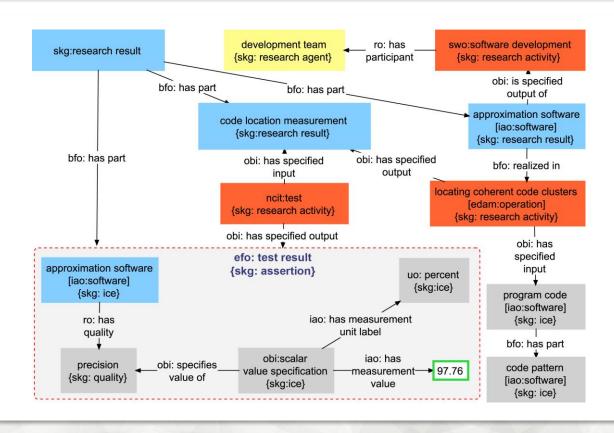
Magnetoencephalography during auditory oddball paradigm



Description of a software development



Measurement of precision





Bottom-up data entry—at the level of individual assertions

Europe PMC Funders Group

Author Manuscript

J Neurol. Author manuscript; available in PMC 2019 June 11.

Published in final edited form as:

J Neurol. 2015 October 1; 262(10): 2232-2240. doi:10.1007/s00415-015-7832-2.

Voxel based analysis in neuroferritinopathy expands the phenotype and determines radiological correlates of disease severity

MJ Keogh 1 , BS Aribisala 2 , J He 2 , E Tulip 3 , D Butteriss 4 , C Morris 5 , G Gorman 6 , R Horvath 1 , PF Chinnery 1,6 , and AM Blamire 2

¹Institute of Genetic Medicine, Newcastle University, Central Parkway, Newcastle upon Tyne, NE1 3BZ

²Institute of Cellular Medicine & Newcastle Magnetic Resonance Centre, Newcastle University, NE4 5PL

³School of Biomedical Sciences, Newcastle University, NE2 4HH

⁴Department of Neuroradiology, Royal Victoria Infirmary, Newcastle Upon Tyne, NE1 4LP

⁵Medical Toxicology Centre, Wolfson Building, Claremont Place, Newcastle University, Newcastle upon Tyne, NE2 4AA

Example taken from:

Europe PMC Funders Author Manuscripts





Bottom-up data entry—at the level of individual assertions

PDF Viewer

doi:10.1007/s00415-015-7832-2

Annotation

Neuroferritinopathy is an autosomal dominant adult-onset movement disorder which occurs due to mutations in the ferritin light chain gene (FTL). Extensive iron deposition and cavitation are observed post-mortem in the basal ganglia, but whether more widespread pathological changes occur, and whether they correlate with disease severity is unknown.

3D-T1w and quantitative T2 whole brain MRI scans were performed in 10 clinically symptomatic patients with the 460InsA FTL mutation and 10 age-matched controls. Voxel-based morphometry (VBM) and voxel-based relaxometry (VBR) were subsequently performed. Clinical assessment using the Unified Dystonia Rating Scale (UDRS) and Unified Huntington's Disease Rating Scale (UHDRS) was undertaken in all patients.

VBM detected significant tissue changes within the substantia nigra, midbrain and dentate together with significant cerebellar atrophy in patients (FWE, p < 0.05). Iron deposition in the caudate head and cavitation in the lateral globus pallidus correlated with UDRS score (p < 0.001). There were no differences between groups with VBR.

Our data show that progressive iron accumulation in the caudate nucleus, and cavitation of the globus pallidus correlate with disease severity in neuroferritinopathy. We also confirm sub-clinical

Text: "Voxel-based morphometry (VBM) and voxel-based relaxometry (VBR) were subsequently performed."

mark assertion in text

Example taken from:





Bottom-up data entry—at the level of individual assertions

PDF Viewer

doi:10.1007/s00415-015-7832-2

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Data Analysis Method



Text: "Voxel-based morphometry (VBM) and voxel-based relaxometry (VBR) were subsequently performed."

classify the assertion

Example taken from:





Bottom-up data entry—at the level of individual assertions

PDF Viewer

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Annotation

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T



Text: "Voxel-based morphometry (VBM) and voxel-based relaxometry (VBR) were subsequently performed."

x ero:morphometry

x chmo:relaxometry

semantic enrichment

Example taken from:





Bottom-up data entry—at the level of individual assertions

PDF Viewer

doi:10.1007/s00415-015-7832-2

Annotation

Neuroferritinopathy is an autosomal dominant adult-onset movement disorder which occurs due to mutations in the ferritin light chain gene (FTL). Extensive iron deposition and cavitation are observed post-mortem in the basal ganglia, but whether more widespread pathological changes

using templates for semantifying the assertion

Data Analysis Method

Text: "Voxel-based morphometry (VBM) and voxel-based relaxometry (VBR) were subsequently performed."

x ero:morphometry

x chmo:relaxometry

has part:

of the b-clinical

ptomatic

hometry

ssment ng Scale

n the

< 0.001).

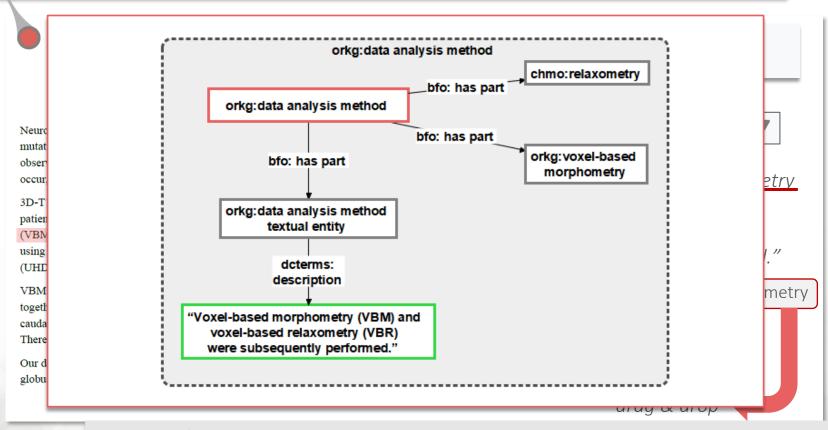
x ero:voxel-based morphometry

drag & drop or automated

c papers. hypothesis.is, https://web.hypothesis.is/blog/annotating-to-...



Bottom-up data entry—at the level of individual assertions

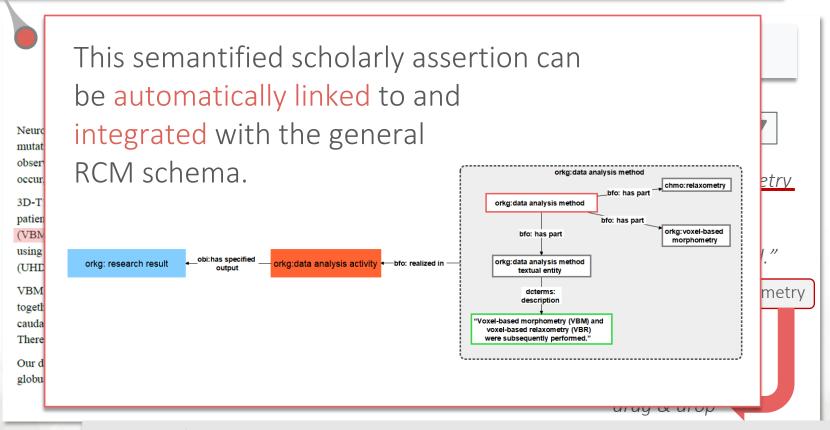


Example taken from:





Bottom-up data entry—at the level of individual assertions



Example taken from:

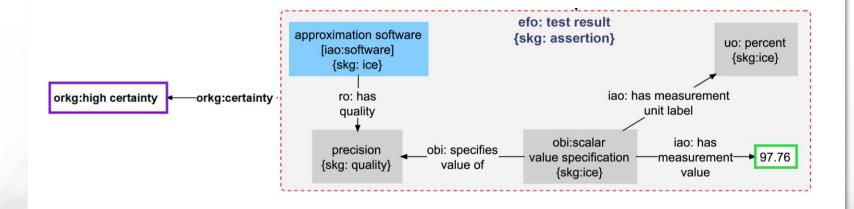
Udell (2015) Annotating to extract findings from scientific papers. *hypothesis.is*, https://web.hypothesis.is/blog/annotating-to-...





Use of named graphs allows statements about statements

Because each assertion is organized in its own named graph, we can e.g. specify its degree of certainty, ...



Prieto et al. (2019) Data-driven classification of the certainty of scholarly assertions. *PeerJ* 8, e8871.





Use of named graphs allows statements about statements

...or relate it to another assertion (supporting, contradicting, neutral), ...

orkg:research data orkg:hypothesis orkg:supports

Prieto et al. (2019) Data-driven classification of the certainty of scholarly assertions. PeerJ 8, e8871.

Use of named graphs allows statements about statements

... or provide personal opinions about it, for instance the data provider wants to point out that they conceived a logical inconsistency, or a wrong statistical method being applied.

Prieto et al. (2019) Data-driven classification of the certainty of scholarly assertions. PeerJ 8, e8871.



Goal

Provide a means to have the contents of scholarly publications in a machine-actionable format but at the same time present the contents in human-readable UI-pages.

Basic idea

The representation of the contents of a scholarly publication in a knowledge graph usually comprises several UI-pages.

Basic idea

We partition the overall data graph into integrated sub-graphs, with each sub-graph comprising information that should be represented on one such UI-page.



Basic idea

We specify a KGC for each sub-graph so that each UI-page of a scholarly knowledge graph has a specific KGC assigned to it.

Basic idea

A KGC can be instantiated through user input, resulting in the generation of

- 1) a sub-graph that is based on the graph-template specified in its KGCs and
- 2) a corresponding UI-page.

Basic idea

The user input for a given KGC can trigger the instantiation of another KGC. This way, KGCs can relate to one another and we can specify the entire organization of the data of a knowledge graph application as a set of interlinked KGCs.



Basic idea

A middleware reads the information contained in the KGCs and in the overall data graph and executes it, thereby generating the knowledge graph application.

Organization of an RDF-based KGC into sets of Quad Templates

An RDF-based KGC is organized into Quads:

Subject (URI) Property (URI) Object (URI/Literal) :NG(URI),

with each Quad being described in a KGC as a Quad Template (QT).



Organization of an RDF-based KGC into sets of Quad Templates

An RDF-k

Subject (l

with eac
Template

described in the
forthcoming paper
Quad
Quad



Organization of a Neo4j-based KGC

Currently, we are developing a Neo4j-based implementation of the KGC idea.



Case description

We want to model information about a population that has been

infected with the SARS-CoV-2 Coronavirus. We want to cover

Basic Reproduction Number (RO) and Case Fatality Rate (CFR)

measurements, each with 95% Confidence Intervals. All this

information should be represented on a single UI-page.

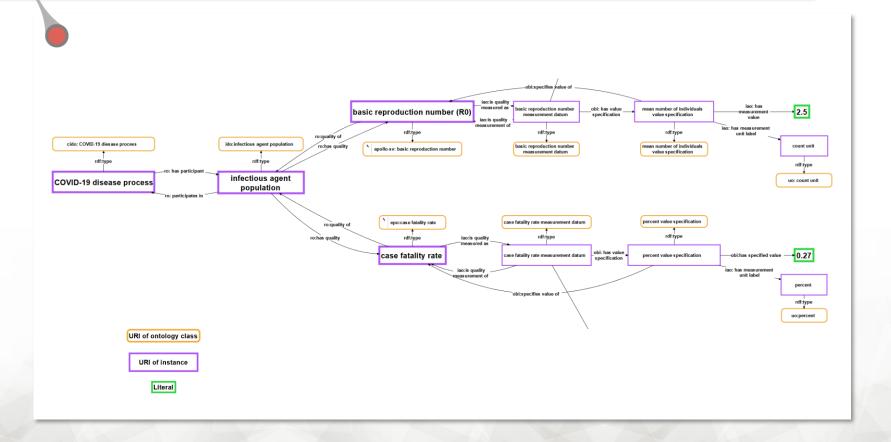
Representing Scholarly Knowledge Using Knowledge Graph Cells



Infectious Agent Population KGC

We want to model this information with a general Infectious Agent Population KGC, which can be reused for other types of infections.

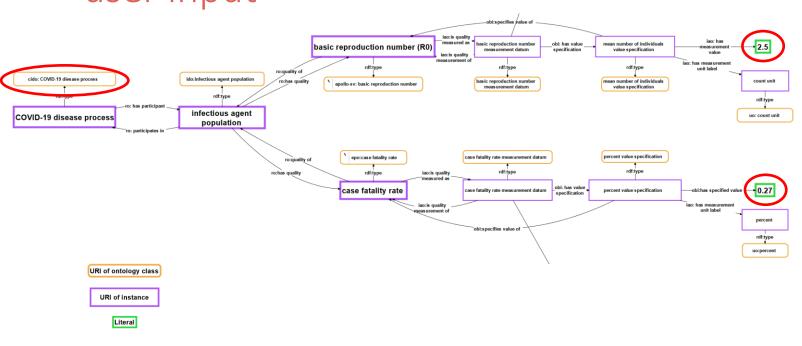
Underlying OWL graph pattern





Infectious Agent Population KGC







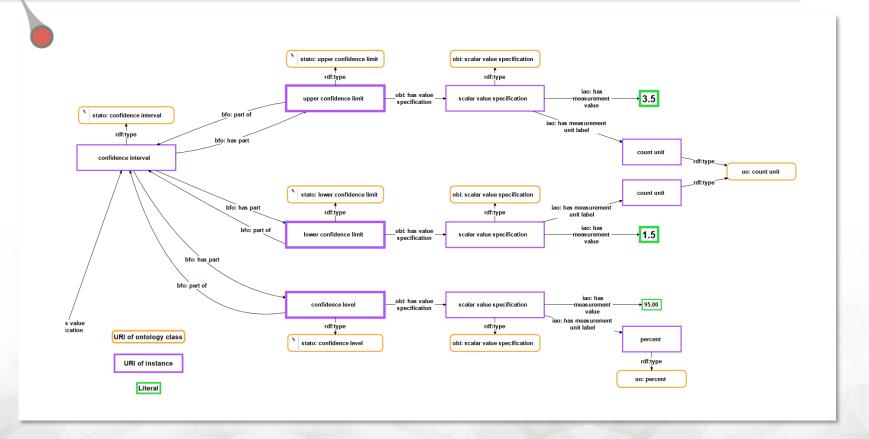
Infectious Agent Population KGC

user input basic reproduction number (R0) ido:infectious agent population apollo-sv: basic reproduction num infectious agent COVID-19 disease process population epo:case fatality rate case fatality rate measurement datum KGC input +0.27 case fatality rate URI of ontology class **URI** of instance Literal

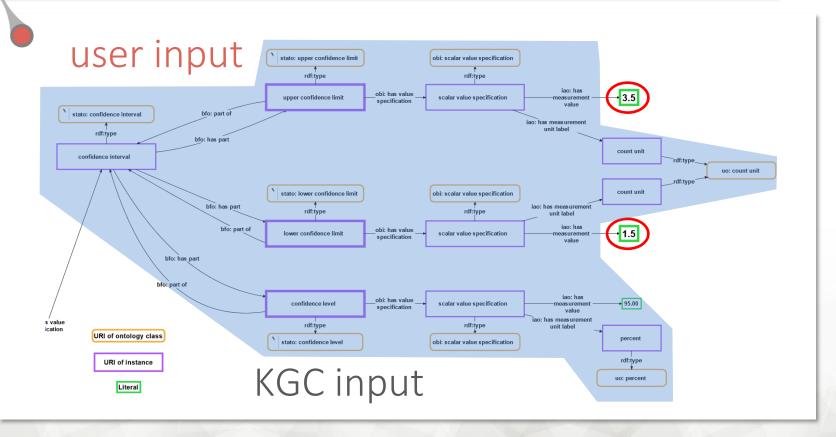




Underlying OWL graph pattern



Infectious Agent Population KGC





Infectious Agent Population KGC

Next, we described the Infectious Agent Population KGC as a set of Cypher scripts.

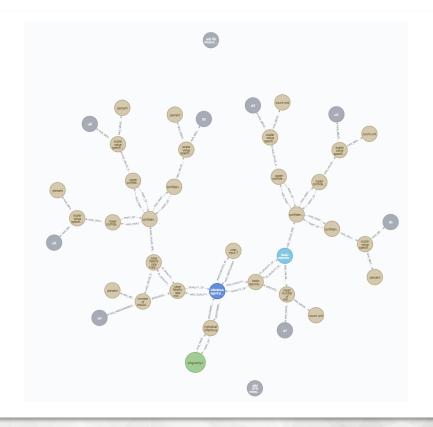
Infectious Agent Population KGC







Infectious Agent Population KGC



Infectious Agent Population KGC

UI-page Cypher script

// search for all nodes belonging to ORKG entry1 kgc data graph data_graph_entry1_kgc_1 that contain gui information

```
MATCH (n)
```

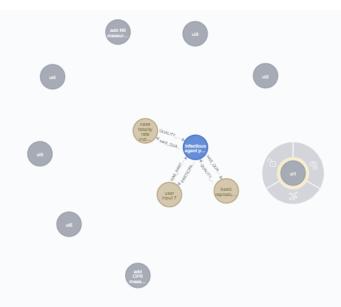
```
WHERE n.data_OrkgEntry="entry1" AND n.kgc_kgc_data_graph="data_graph_entry1_kgc_1" AND n.gui_information="true"
```

RETURN n



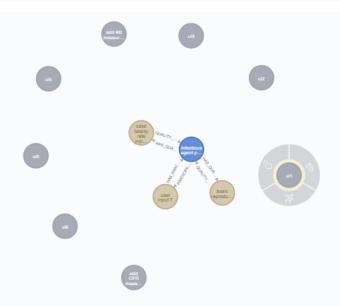


Infectious Agent Population KGC



Literal Value <id>:36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC_R0_UserInput1_URI gui_element: inputfieldX gui_group_order: 0 gui_information: true gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph: data_graph entry1_kgc_1 name: user input 1 value: ui1

Infectious Agent Population KGC



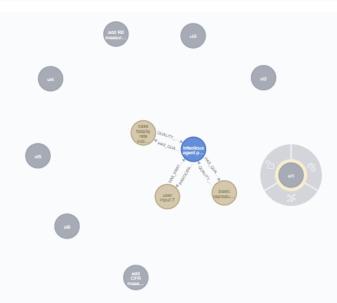
scholarly publication ID

Literal Value <id>: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC_R0_UserInput1_URI gui_element: inputfieldX gui_group_order: 0 gui_information: true gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph: data_graph entry1_kgc_1 name: user input 1 value: ui1





Infectious Agent Population KGC

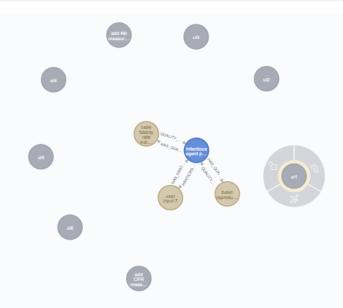


named graph information / UI-page ID

Literal Value <id>>: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC_R0_UserInput1 URI gui_element: inputfieldX gui_group order: 0 gui_information: true gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph: data_graph_entry1_kgc_1 name: user input 1 value: ui1



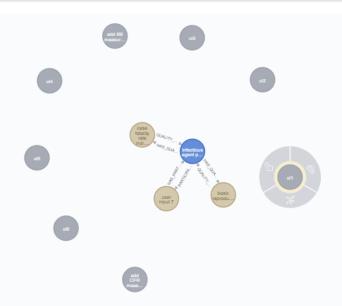
Infectious Agent Population KGC



data type specification: float

Literal Value <id>>: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC_R0_UserInput1_URI gui_element: inputfieldX gui_group_order: 0 gui_information: true gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph: data_graph_entry1_kgc_1 name: user input 1 value: ui1

Infectious Agent Population KGC

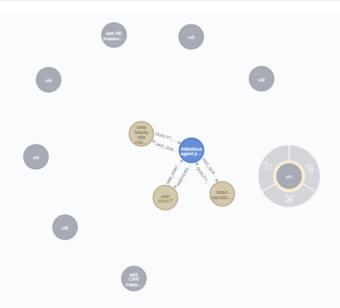


UI-page information

Liferal Value <id>: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC R0 UserInput1_URI gui_element: inputfieldX gui_group_order: 0 gui_information: true user input 1 value: ui1



Infectious Agent Population KGC

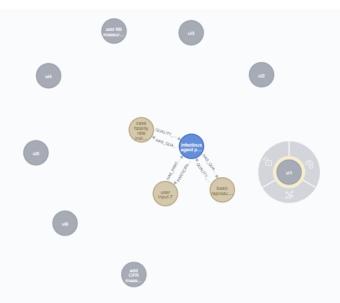


edit Cypher Script

Literal Value <id>: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC_R0_UserInput1_URI gui_element: inputfieldX gui_group_order: 0 gui_information: true gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph: data_graph entry1_kgc_1 name: user input 1 value: ui1



Infectious Agent Population KGC



value: yet unspecified

<id><id><: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC R0 UserInput1 URI gui_element: inputfieldX gui_group_order: 0 gui_information: true</td> gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph entry1 kgc 1 name: user input 1



Infectious Agent Population KGC

update Cypher script for RO mean value

```
// update the values for the R0 mean value [ui1] of entry1 and kgc data graph
data graph entry1 kgc 1
```

```
:param [{entry, dataGraph, quiGroupOrder, quiSectionOrder, ui1, quiOrder1, quiOrder2,
guiOrder3}] => {RETURN 0 AS guiSectionOrder, "entry1" AS entry, 1 AS guiOrder1, 2 AS
guiOrder2, 3 AS guiOrder3, "data_graph_entry1_kgc_1" AS dataGraph, 0 AS
quiGroupOrder, "2.5" AS ui1};
```

```
MATCH (n {data OrkgEntry:$entry, qui section order:$quiSectionOrder,
          qui group order:$quiGroupOrder, qui order:$quiOrder1,
          kgc kgc data graph:$dataGraph})
SET n.value=$ui1
```





Infectious Agent Population KGC

update Cypher script for RO mean value

// update the values for the R0 mean value [ui1] of entry1 and kgc data graph data graph entry1 kgc 1

:param [{entry, dataGraph, quiGroupOrder, quiSectionOrder, ui1, quiOrder1, quiOrder2, guiOrder3}] => {RETURN 0 AS guiSectionOrder, "entry1" AS entry, 1 AS guiOrder1, 2 AS guiOrder2, 3 AS guiOrder3, "data_graph_entry1_kgc_1" AS dataGraph, 0 AS quiGroupOrder, "2.5" AS ui1};

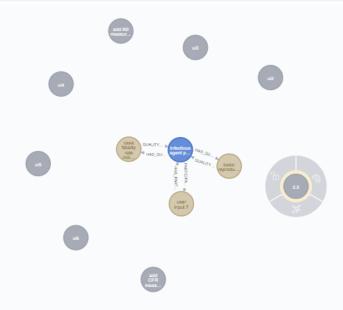
MATCH

provided by frontend/middleware and user-input





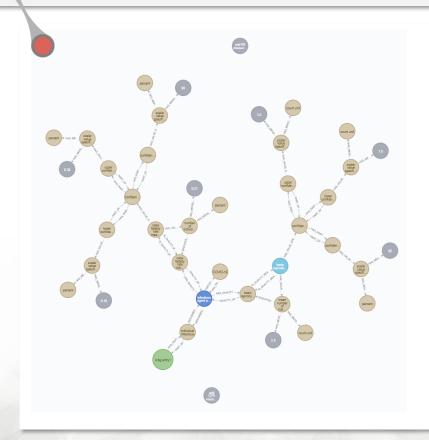
Infectious Agent Population KGC



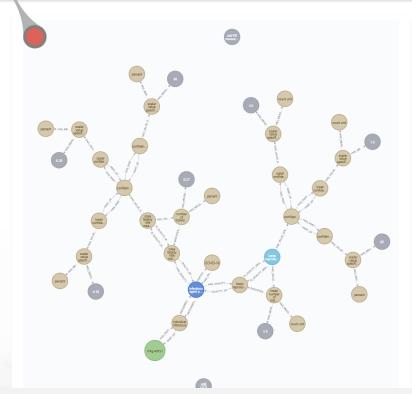
Value: 2.5

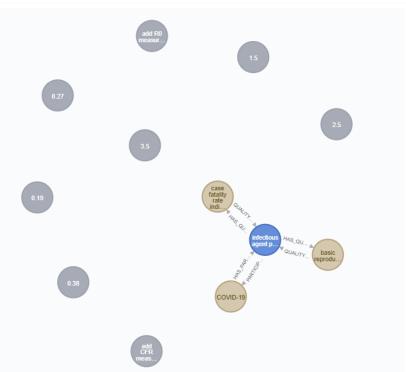
Literal Value <id>>: 36 data_OrkgEntry: entry1 gui_data_type: xsd:float gui_edit_cypher_address: infectiousAgentPopulationKGC_R0_UserInput1_URI gui_element: inputfieldX gui_group_order: 0 gui_information: true
gui_information_text: mean value gui_label2: key:value gui_order: 1 gui_section_order: 0 gui_tooltip: The mean basic reproduction number kgc_kgc_data_graph: data_graph: data_graph entry1_kgc_1 name: user input 1 value: 2.5

Infectious Agent Population KGC



Infectious Agent Population KGC





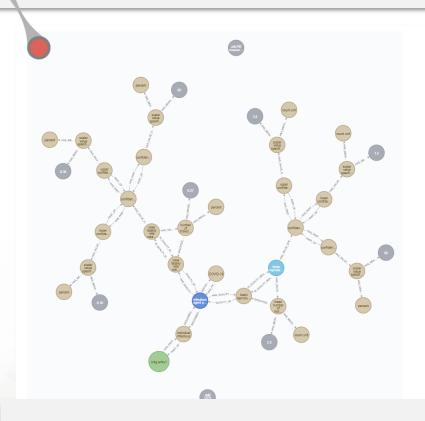
machine-actionable graph

human-readable UI-page





Infectious Agent Population KGC



Infectious Agent Population

participates in

Covid-19 disease process [cido]

Basic reproduction number (95% confidence interval)

2.5

(1.5 - 3.5)

add basic reproduction number measurement

Case fatality rate (95% confidence interval)

0.27 % (0.19 - 0.38 %)

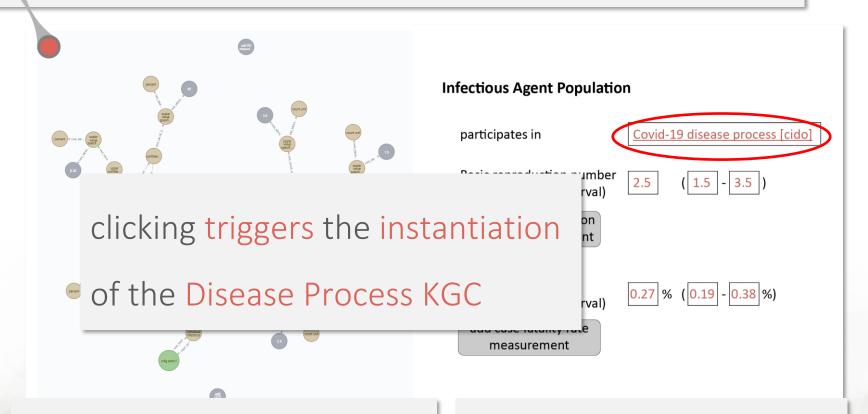
add case fatality rate measurement

machine-actionable graph

human-readable UI-page



Infectious Agent Population KGC



machine-actionable graph

human-readable UI-page





Uniform modeling scheme

KGCs can be used for implementing a uniform modeling scheme and a specific data model (e.g. RCM) in a knowledge graph application, with all user-input being enforced to comply with the model. This results in semantically consistent and FAIR contents without the users having to be experts in semantics and understanding graphs.



Data consistency

KGCs enforce a certain degree of data consistency through

- (i) input-control that structures and restricts user input and
- (ii) by employing KGCs in tools and procedures for checking

the contents of the knowledge graph for consistency

without having to rely on DL-based reasoning.

Querying

With predefined SPARQL/Cypher queries, they provide means to interact with the data graph at a fine-grained level without requiring users to understand the query languages.

Human-readability

KGCs filters information contained in the data graph to what is relevant to a human reader and makes this information available to the frontend.

Agility, flexibility

A knowledge graph application can be developed and specified as a set of interlinked KGCs. The middleware runs the application. New KGCs can be added and existing ones be modified.

RCM and KGCs combined in a Knowledge Graph for Scholarly Publications

FAIRness

When combining the KGC idea with the RCM data model for scholarly publications, we can build a Knowledge Graph for Scholarly Publications that provides data and metadata that are compliant with the FAIR Guiding Principles.

Towards Representing Research Contributions in Scholarly Knowledge Graphs Using Knowledge Graph Cells



L. Vogt, J. D'Souza, M. Stocker, S. Auer

