









Human-Friendly RDF Graph Construction: Which one do you chose?

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¹Ontology Engineering Group, Universidad Politécnica de Madrid, Spain ²Declarative Languages and Artificial Intelligence, KULeuven, Belgium ³Flanders Make, Belgium ⁴Leuven.Al, Belgium







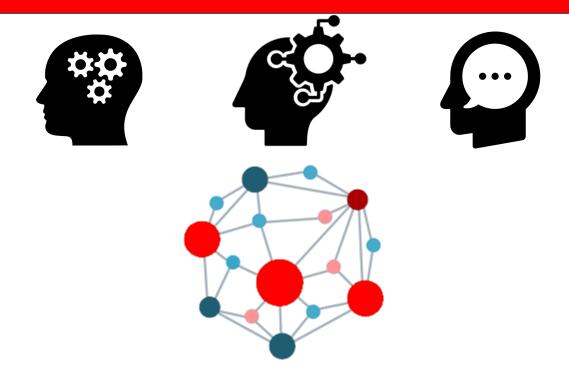


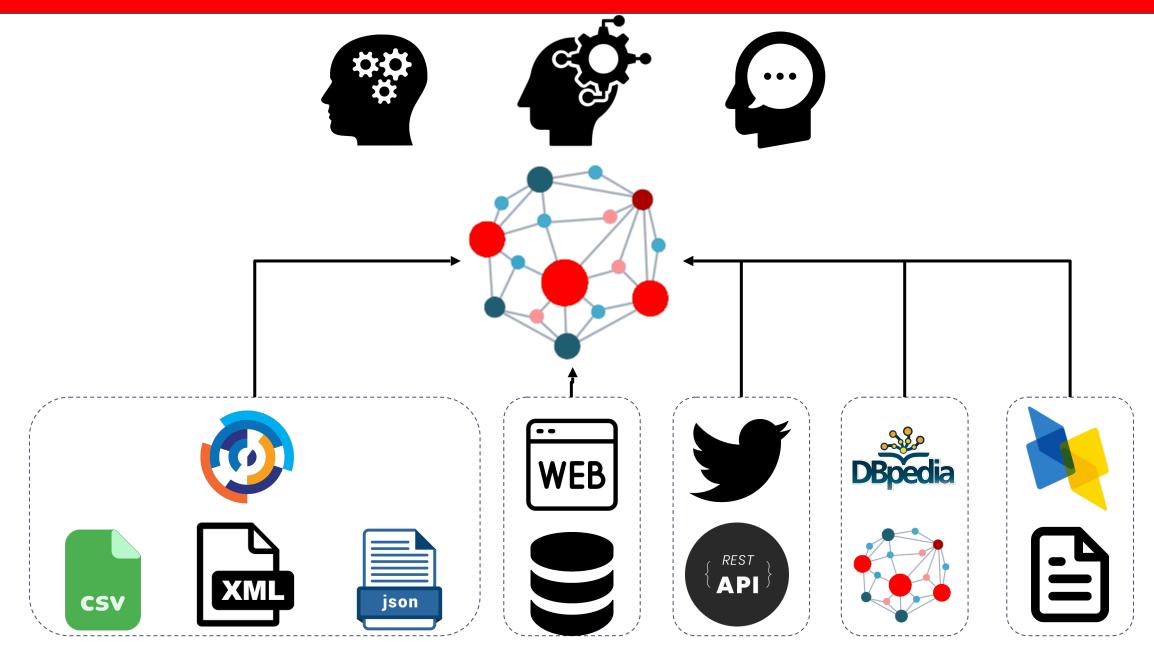


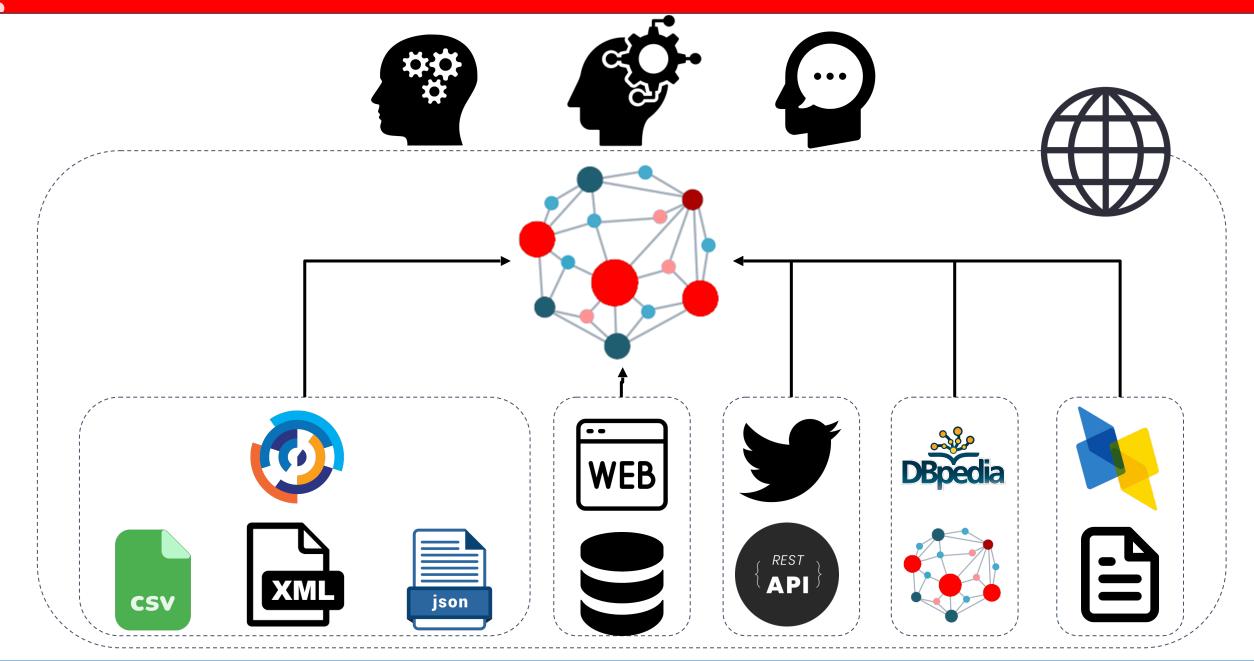
- Motivation
- Preliminaries: RML, YARRRML & RDF-star
- YARRRML-star & YATTER
- Validation & Comparison
- Conclusions and Future Work

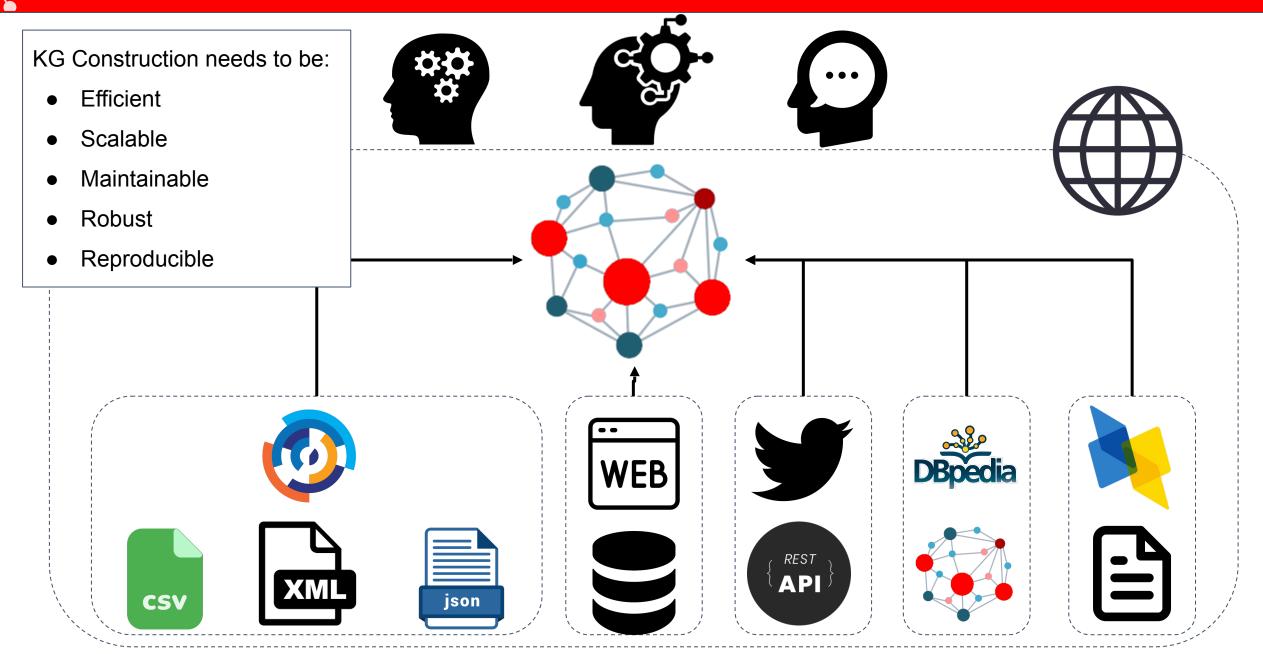
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Knolwedge Graphs in the Era of Al

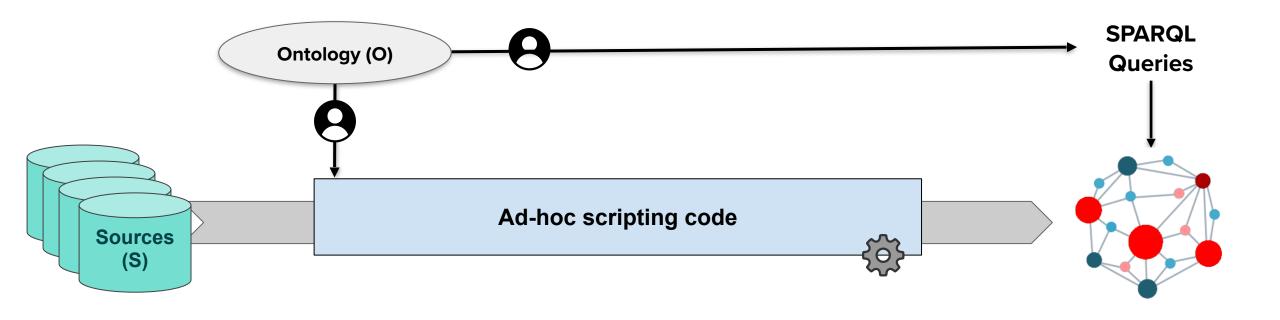




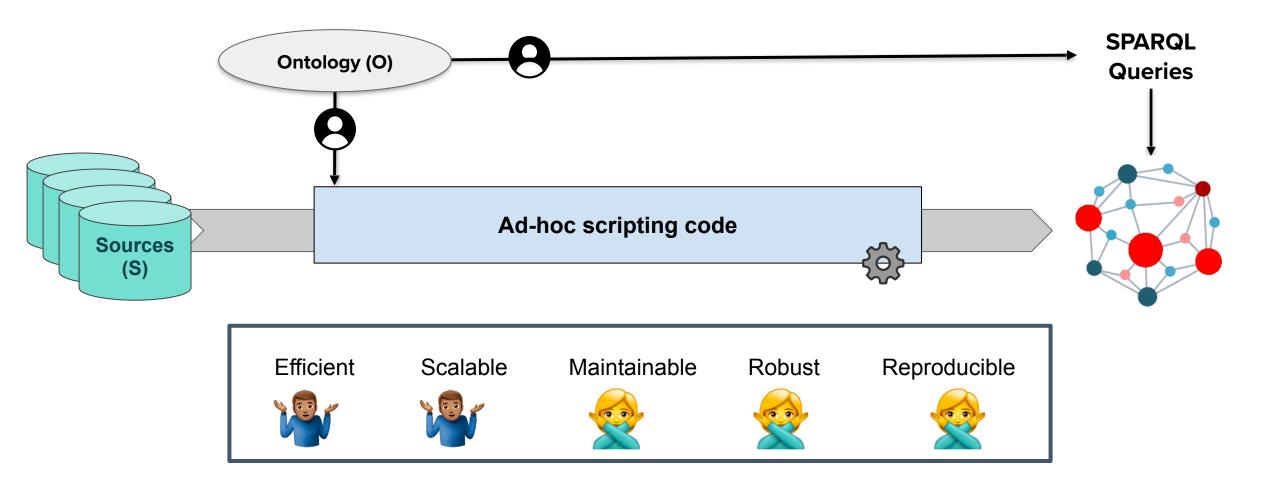


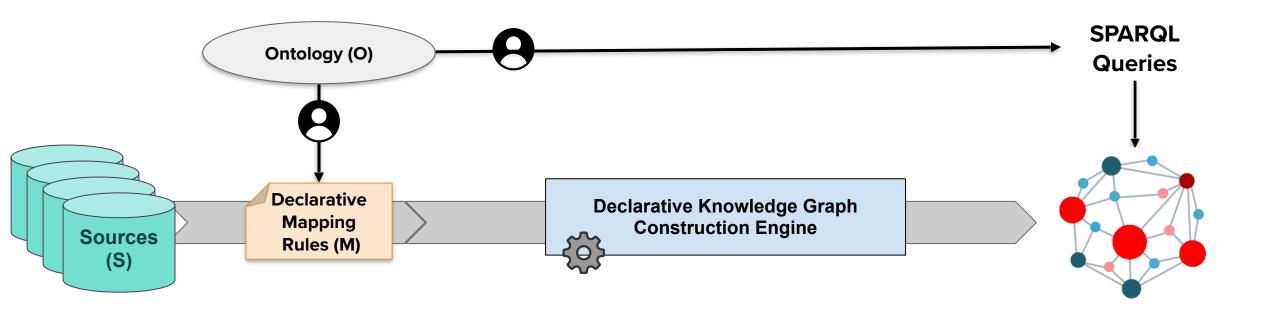


Knowledge Graph Construction: Scripting-based



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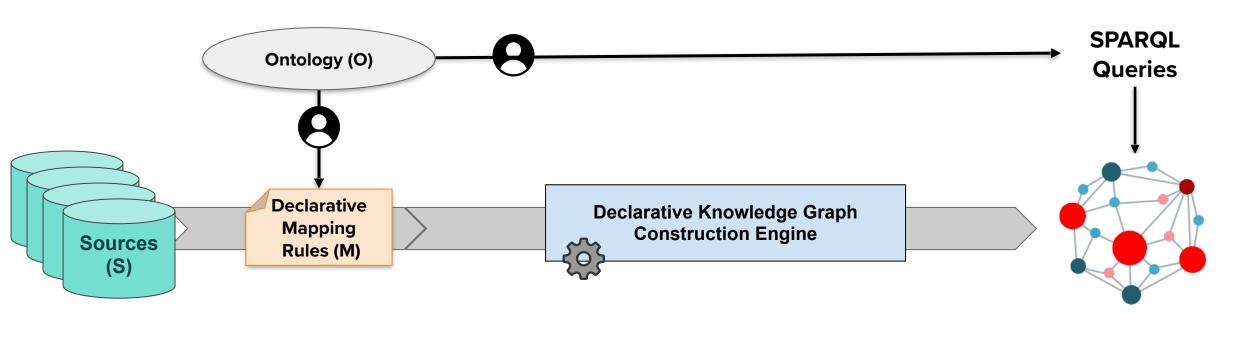




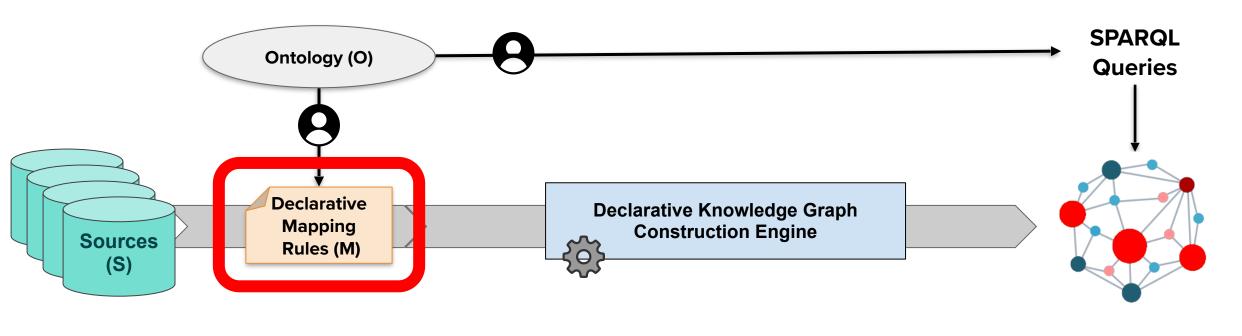
Knowledge Graph Construction = Data Integration System (DIS) = <S, M, O>



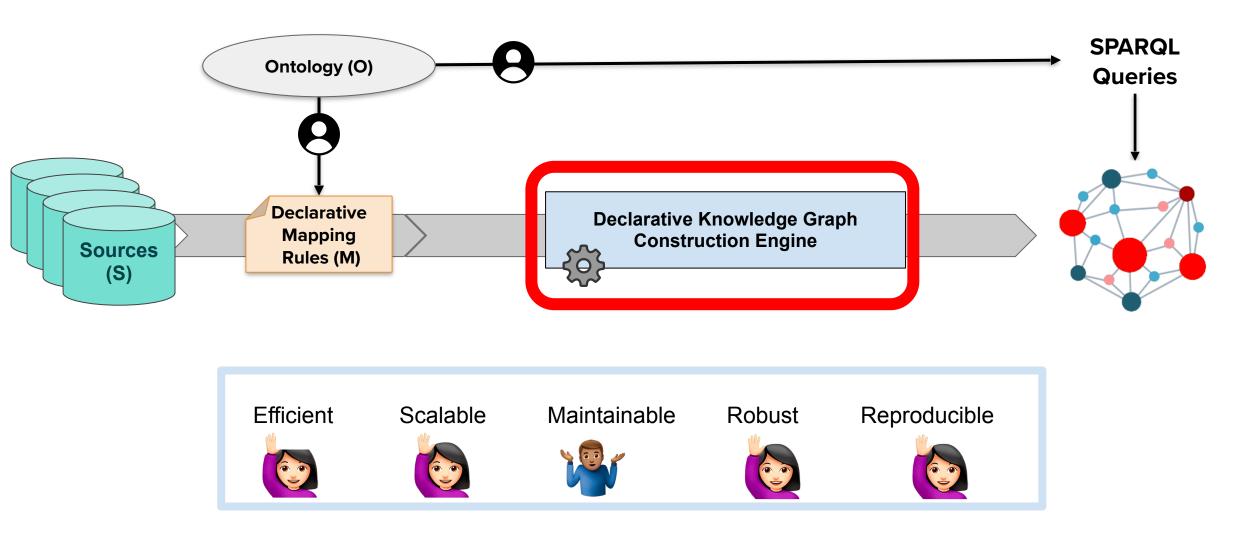
Poggi, A., Lembo, D., Calvanese, D., De Giacomo, G., Lenzerini, M., & Rosati, R. (2008). Linking data to ontologies. In *Journal on data semantics X*Lenzerini, M. Data integration: A theoretical perspective. In *Proceedings of the 21st ACM SIGMOD-SIGACT-SIGART symposium on Principles of database systems*

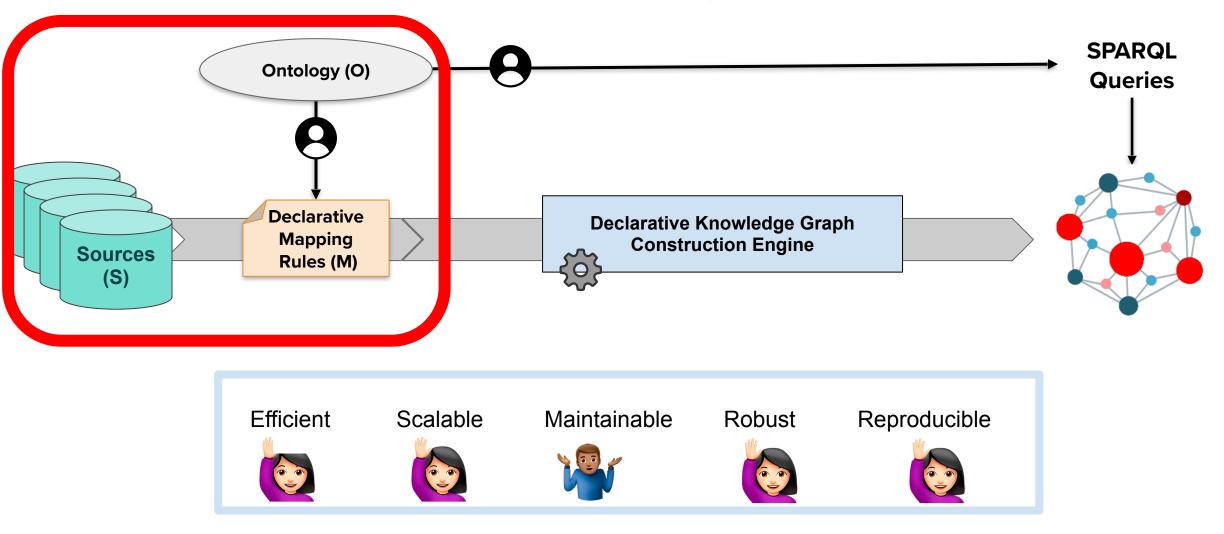


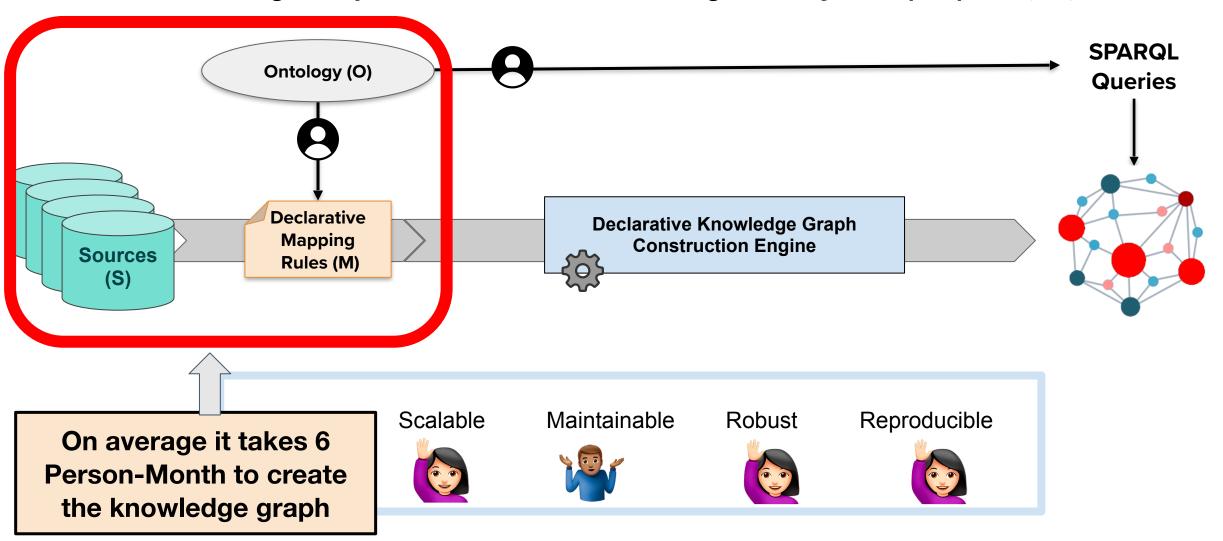


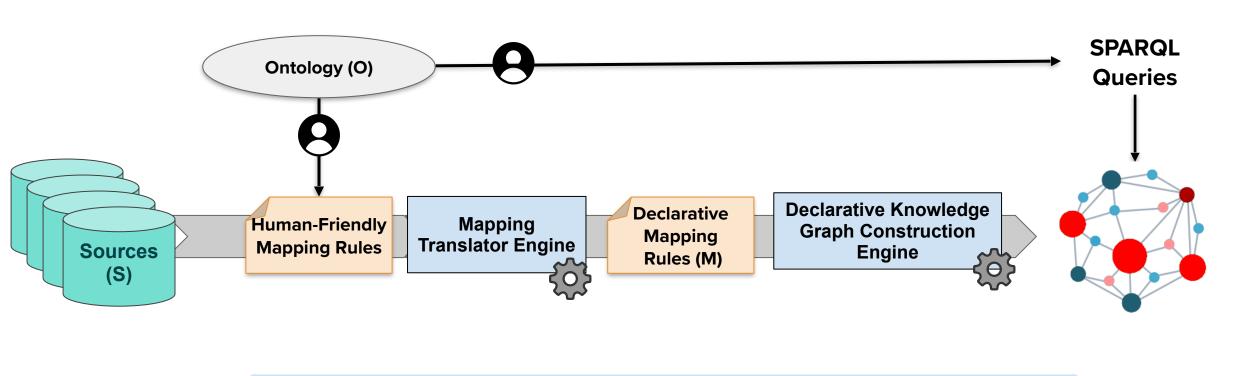




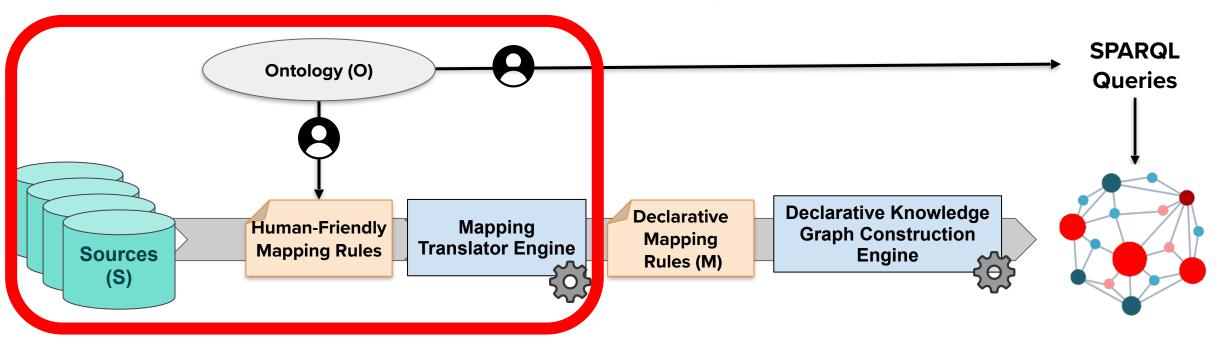














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One of the most used mapping languages is RML

- Extension of W3C Recommendation R2RML for heterogeneous data
- RDF syntax based (not very human-friendly)
- Specification → https://w3id.org/rml/portal

YARRRML is a human-based serialization of RML based on YAML

- Facilitates the construction of the rules
- Compact syntax
- Widely used in most of the real-life projects
- Even used by Google for their Entity Reconciliation API
- Specification → https://w3id.org/kg-construct/yarrrml



ID	DATE	MARK	PERSON
1	2022-03-21	4.80	Angelica
2	2022-03-19	4.85	Katerina

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```
<#innerTM> a rr:TriplesMap;
rml:logicalSource :marks;
rml:subjectMap [
    rr:template ":{PERSON}"];
rr:predicateObjectMap [
    rr:predicate :jumps;
    rml:objectMap [
        rml:reference
    "MARK"]].
```

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```



```
mappings:
innerTM:
source:
    - [marks.csv]
subject: ":{PERSON}"
predicateobjects:
    - [:jumps, $(MARK)]
```

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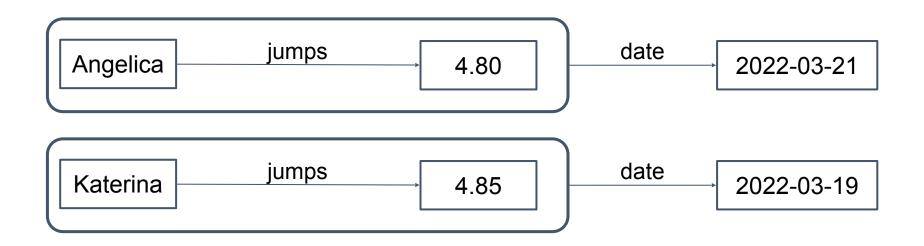
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Statements about Statements

How can we describe statements about statements in RDF?

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The RDF-star solution

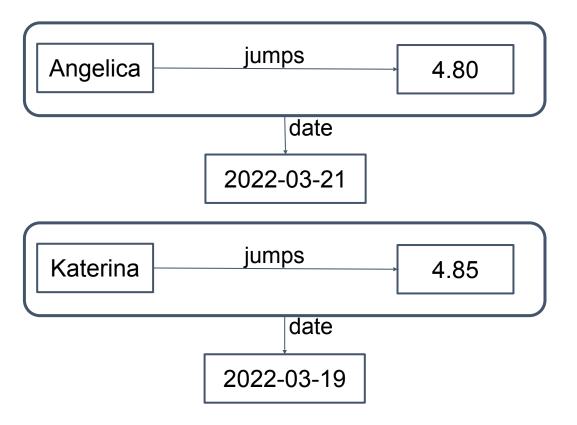
Triples that include a **triple as a subject or an object** are known as RDF-star triples An RDF-star graph is a **set of RDF-star triples**.

SPARQL-star extends SPARQL to query RDF-star graphs **Towards RDF 1.2** with 16 specifications being reviewed

The RDF-star solution

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SPARQL-star extends SPARQL to query RDF-star graphs **Towards RDF 1.2** with 16 specifications being reviewed



RDF-star features

Wide adoption of the approach from industry and vendors Standardization process through the World Wide Web Consortium (W3C) No sustainable procedure to generate RDF-star graphs







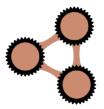






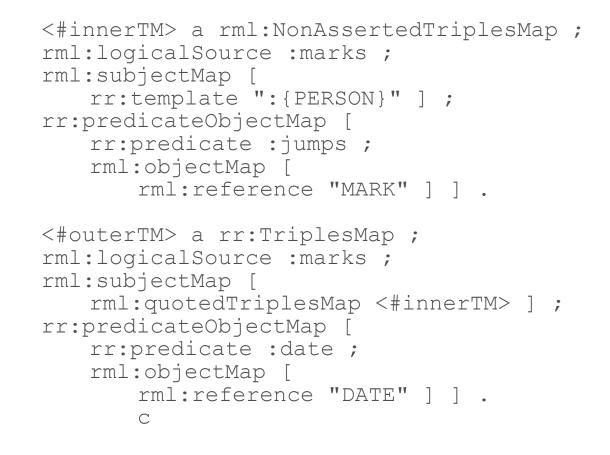






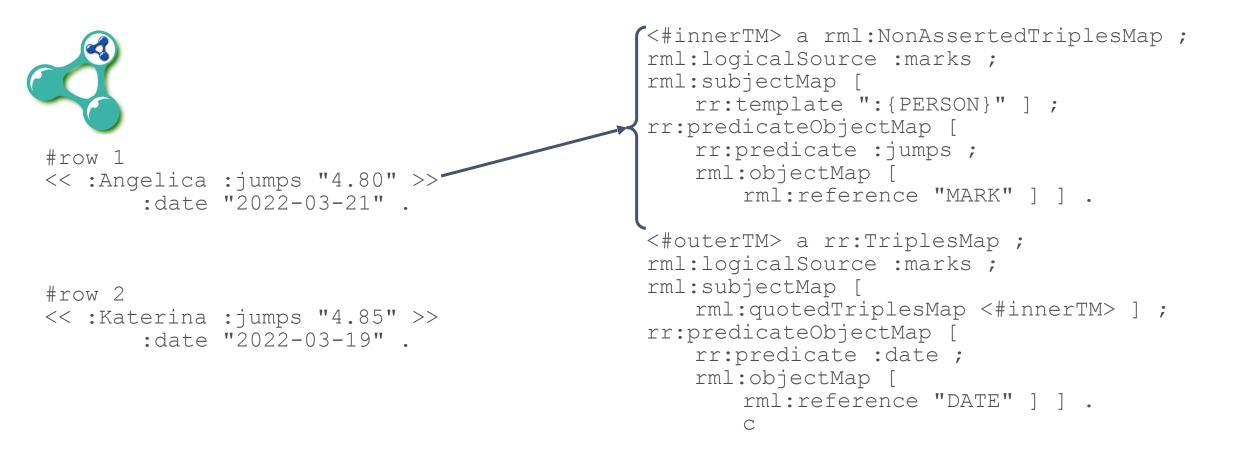






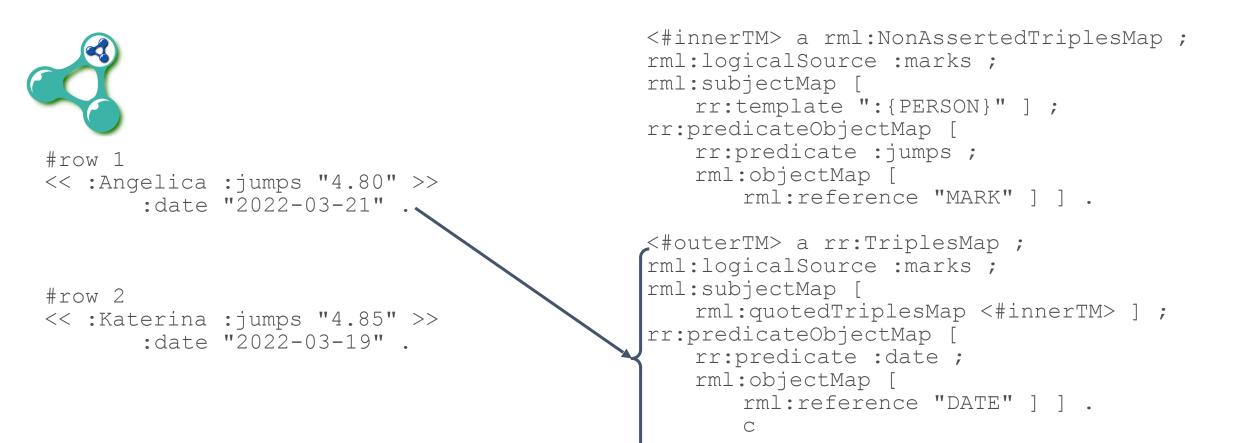






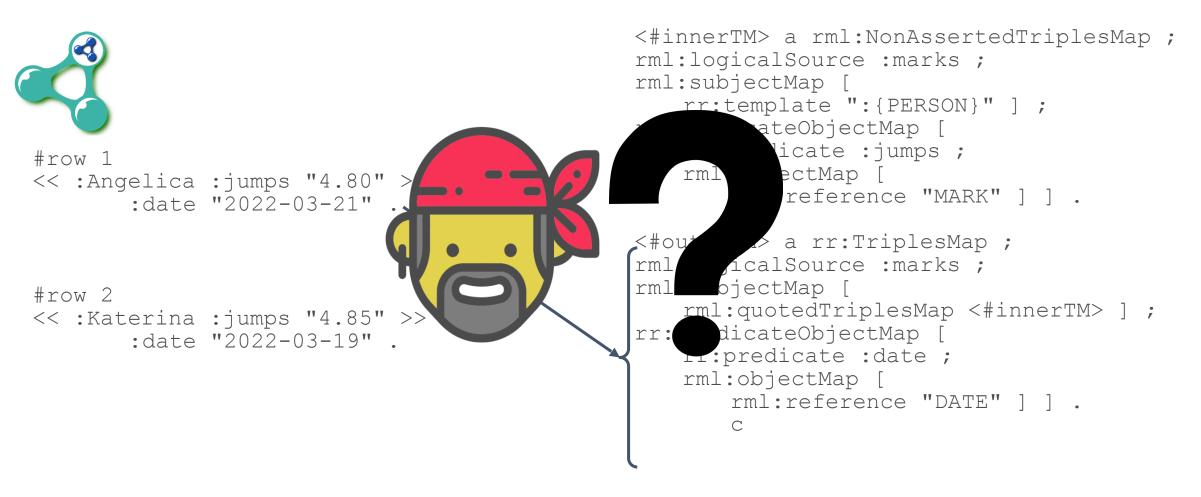
















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<#innerTM> a rml:NonAssertedTriplesMap ;
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<#outerTM> a rr:TriplesMap ;
rml:logicalSource :marks ;
rml:subjectMap [
   rml:quotedTriplesMap <#innerTM> ] ;
rr:predicateObjectMap
   rr:predicate :date ;
   rml:objectMap [
       rml:reference "DATE" ] ] .
```

```
<#innerTM> a rml:NonAssertedTriplesMap ;
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   rml:quotedTriplesMap <#innerTM> ] ;
rr:predicateObjectMap
   rr:predicate :date ;
   rml:objectMap [
       rml:reference "DATE" | | .
```

```
mappings:
 innerTM:
  source:
       - [marks.csv]
  subject: ":{PERSON}"
 pom:
       - [:jumps, $(MARK)]
 outerTM:
  source:
         [marks.csv]
  subject:
       quotedNonAsserted:
innerTM
 pom:
   - [:date, $(DATE)]
```



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  subject:
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innerTM
 pom:
   - [:date, $(DATE)]
```



```
<< :Angelica :jumps "4.80" >> :date "2022-03-21" . << :Katerina :jumps "4.85" >> :date "2022-03-19" .
```

```
mappings:
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         [marks.csv]
  subject: ":{PERSON}"
  pom:
       [:jumps, $(MARK)]
 outerTM:
  source:
       - [marks.csv]
  subject:
       quotedNonAsserted: innerTM
  pom:
   - [:date, $(DATE), xsd:$(DATATYPE)]
   - [:name, $(PERSON), $(COUNTRY)~lang]
   - predicates: :jumps
    objects:
      - function: join(mapping=innerTM, equal(child=$(ID), parent=$(ID))
```

Additional extensions:

- Dynamic datatypes
- Dynamic language
- Inline joins (reducing verbosity)

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Additional extensions:

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Built-in function implemented by all RML engines

7.14 Query formulation vs reference formulation 7.15 Examples 8. **Targets** 8.1 Keys 8.2 Type 8.3 Access 8.4 Serialization 8.5 Compression 8.6 Examples Mappings 9. 9.1 Data sources 9.2 Targets 9.3 Subjects Predicates and objects 9.4 9.5 Datatypes 9.6 Languages 9.7 Referring to other mappings 9.8 Graphs 9.8.1 All triples 9.8.2 All triples with a specific predicate and object 10. **Functions** Conditions 11. 12. **RDF-Star** 12.1 Keys 12.2 Examples 13. **External references** 14. **Shortcuts** 14.1 Keys

12. RDF-Star

An YARRRML-star mapping defines a mapping from any data in a structured source format to RDF-star. It enables the generation of quoted triples in the position of subject and/or object. Quoted triples can be created by referencing the mapping identifier using the quoted keyword. It is also possible to create non-asserted quoted triples using the quotedNonAsserted keyword.

12.1 Keys

quoted

Quoted mapping.

Required profiles: RMLStar.

Datatype: Mapping reference.

quotedNonAsserted

Non-asserted quoted mapping. Required profiles: RMLStar. Datatype: Mapping reference.

12.2 Examples

YARRRML RML

```
mappings:
    person:
    subject: http://example.org/person/$(Name)
    predicateobjects:
        - predicates: ex:confirms
        objects:
            - quoted: student
    student:
        subject: http://example.org/student/$(Student)
        predicateobjects:
            - [a, ex:Student]
```



YATTER: Your open source engine for YARRRML-star

Easy to read outputs (following Turtle RDF syntax with BN)

Translation from YARRRML-star to R2RML/RML/RML-star and viceversa

Continuous integration/development of test-cases

Code coverage of ~85% of with the test-cases

PyPi module (easy to install)

Follows Open Science good practices (GitHub + Zenodo)



```
1 !pip install yatter
2 import yatter
2 import yaml
3
4 # Translate the input mapping into [R2]RML
5 rml_content = yatter.translate(yaml.safe_load(open("my_mapping.yml")))
6 # Run your favourite RML Engine with the output
```

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Comparison w.r.t. other **RML translators** (XX2RML)
ShExML translator Vs Stardog Vs
XRM translator Vs YARRRML-parser



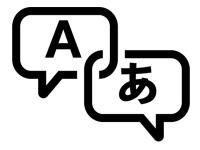


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Validation through **test-cases**Manually development of >50 test-cases for YARRRML

YARRRML[-star] ↔ [R2]RML-[star]







#!&) Q2

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YARRRML[-star] ↔ [R2]RML-[star]



Two real use cases where YARRRML-star + YATTER are used



Feature/Serialization	ShExML	SMS2	XRM	YARRRML-star
Subject Term	BN, IRI	BN, IRI, *T	IRI	BN, IRI, *T
Subject Generation	C, D (11)	C, D, (11)	C, D, (11)	C, D (01)
Predicate Term	BN, IRI	IRI	IRI	IRI
Predicate Generation	C (11)	C, D (11)	C (11)	C, D (1N)
Object Term	IRI, L	BN, IRI, L, *T	IRI, L	BN, IRI, L, *T
Object Generation	C, D (11)	C, D (1N)	C, D (11)	C, D (1N)
Datatypes	C, D (01)	C (01)	C (01)	C, D (01)
Language tag	C, D (01)	C, D (01)	C (01)	C, D (01)
Named graphs	C (01)	C (11)	C, D (0N)	C, D (0N)
Data source description	Input	Input	Input	Input, output
Data source linking	Yes	No	No	Yes
Nested hierarchies	Yes	No	No	No
Functions	Yes	Yes	No	Yes
Conditions	Yes	No	No	Yes

Feature/Serialization	ShExML	SMS2	XRM	YARRRML-star
Subject Term	BN, IRI	BN, IRI, *T	IRI	BN, IRI, *T
Subject Generation	C, D (11)	C, D, (11)	C, D, (11)	C, D (01)
Predicate Term	BN, IRI	IRI	IRI	IRI
Predicate Generation	C (11)	C, D (11)	C (11)	C. D (1N)
Object Term	IRI, L	BN, IRI, L, *T	IRI, L	BN, IRI, L, *T
Object Generation	C, D (11)	C, D (1N)	C, D (11)	C, D (1N)
Datatypes	C, D (01)	C (01)	C (01)	C, D (01)
Language tag	C, D (01)	C, D (01)	C (01)	C, D (01)
Named graphs	C (01)	C (11)	C, D (0N)	C, D (0N)
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Nested hierarchies	Yes	No	No	No
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Object Term	IRI, L	BN, IRI, L, *T	IRI, L	BN, IRI, L, *T
Object Generation	C, D (11)	C, D (1N)	C, D (11)	C, D (1N)
Datatypes	C, D (01)	C (01)	C (01)	C, D (01)
Language tag	C, D (01)	C, D (01)	C (01)	C, D (01)
Named graphs	C (01)	C (11)	C, D (0N)	C, D (0N)
Data source description	Input	Input	Input	Input, output
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Object Term	IRI, L	BN, IRI, L, *T	IRI, L	BN, IRI, L, *T
Object Generation	C, D (11)	C, D (1N)	C, D (11)	C, D (1N)
Datatypes	C, D (01)	C (01)	C (01)	C, D (01)
Language tag	C, D (01)	C, D (01)	C (01)	C, D (01)
Named graphs	C (01)	C (11)	C, D (0N)	C, D (0N)
Data source description	Input	Input	Input	Input, output
Data source linking	Yes	No	No	Yes
Nested hierarchies	Yes	No	No	No
Functions	Yes	Yes	No	Yes
Conditions	Yes	No	No	Yes

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Object Term	IRI, L	BN, IRI, L, *T	IRI, L	BN, IRI, L, *T
Object Generation	C, D (11)	C, D (1N)	C, D (11)	C, D (1N)
Datatypes	C, D (01)	C (01)	C (01)	C, D (01)
Language tag	C, D (01)	C, D (01)	C (01)	C, D (01)
Named graphs	C (01)	C (11)	C, D (0N)	C, D (0N)
Data source description	Input	Input	Input	Input, output
Data source linking	Yes	No	No	Yes
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Functions	Yes	Yes	No	Yes
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Feature/Serialization	ShExML	SMS2	XRM	YARRRML-star
Subject Term	BN, IRI	BN, IRI, *T	IRI	BN, IRI, *T
Subject Generation			1)	C, D (01)
Predicate Term		IRI		
Predicate Generation	YARRRIVIL	-star is able to de	scribe	C. D (1N)
Object Term		BN, IRI, L, *T		
Object Generation	1) recursive to	C, D (1N)		
Datatypes	2) dynamic la	C, D (01)		
Language tag	3) input source	C, D (01)		
Named graphs	4) functions a	C, D (0N)		
Data source description	. ,	Input, output		
Data source linking		Yes		
Nested hierarchies	Yes	No		
Functions	Yes	Yes		
Conditions	Yes	No	No	Yes

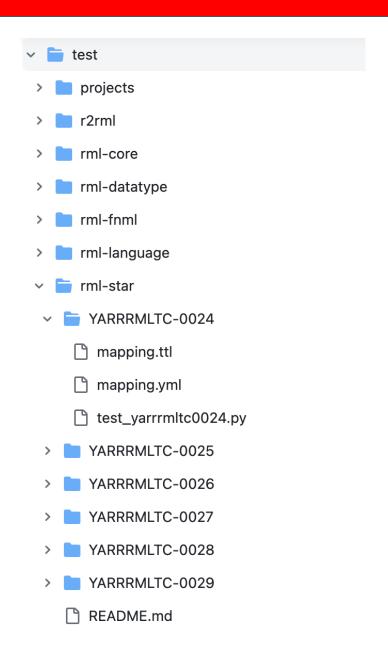
	YARRRML- parser	ShExML	XRM	Stardog	YATTER
Availability	Open source	Open source	Commercial	Commercial	Open source
Programming language	Javascript	Java	Java	Java	Python
Input Data sources	RDB, NoSQL DB, tabular, hierarchical	RDB, tabular, hierarchical, RDF	RDB, tabular, Hierarchical (XML)	RDB, tabular, hierarchical (JSON), GraphQL	RDB, NoSQL DB, tabular, hierarchical
Input Serialization	YARRRML, RML, R2RML	ShExML syntax	XRM syntax	R2RML, SMS, SMS2	YARRRML, RML- star,R2RML
Output Serialization	RML, R2RML, YARRRML	RML, RDF (KG)	RML, R2RML, CARML, CSVW	RDF (KG)	YARRRML, RML- star,R2RML
RDF-star	No	No	No	Yes	Yes
Dyn. Datatype	No	Yes	No	No	Yes
Dyn. Language	No	Yes	No	No	Yes

	YARRRML- parser	ShExML	XRM	Stardog	YATTER
Availability	Open source	Open source	Commercial	Commercial	Open source
Programming language	Javascript	Java	Java	Java	Python
Input Data sources	RDB, NoSQL DB, tabular, hierarchical	RDB, tabular, hierarchical, RDF	RDB, tabular, Hierarchical (XML)	RDB, tabular, hierarchical (JSON), GraphQL	RDB, NoSQL DB, tabular, hierarchical
Input Serialization	YARRRML, RML, R2RML	ShExML syntax	XRM syntax	R2RML, SMS, SMS2	YARRRML, RML- star,R2RML
Output Serialization	RML, R2RML, YARRRML	RML, RDF (KG)	RML, R2RML, CARML, CSVW	RDF (KG)	YARRRML, RML- star,R2RML
RDF-star	No	No	No	Yes	Yes
Dyn. Datatype	No	Yes	No	No	Yes
Dyn. Language	No	Yes	No	No	Yes

	YARRRML- parser	ShExML	XRM	Stardog	YATTER
Availability	Open source	Open source	Commercial	Commercial	Open source
Programming language	Javascript	Java	Java	Java	Python
Input Data sources	RDB, NoSQL DB, tabular, hierarchical	RDB, tabular, hierarchical, RDF	RDB, tabular, Hierarchical (XML)	RDB, tabular, hierarchical (JSON), GraphQL	RDB, NoSQL DB, tabular, hierarchica
Input Serialization	YARRRML, RML, R2RML	ShExML syntax	XRM syntax	R2RML, SMS, SMS2	YARRRML, RML- star,R2RML
Output Serialization	RML, R2RML, YARRRML	RML, RDF (KG)	RML, R2RML, CARML, CSVW	RDF (KG)	YARRRML, RML- star,R2RML
RDF-star	No	No	No	Yes	Yes
Dyn. Datatype	No	Yes	No	No	Yes
Dyn. Language	No	Yes	No	No	Yes

More than 50 test-cases for YARRML-star

- Extend R2RML and RML official test-cases
- assess the conformance of any YARRRML engine
- Cover all current specs:
 - R2RML, RML-core, RML-functions, RML-star, RML-language, RML-datatype and RML-IO
- Cover language keys/shortcuts/etc
- Test correctness and prettiness generated output



Features	YARRRML parser	ShExML	XRM Translator	Stardog	YATTER
[R2]RML-core	18/23	18/18	11/11	13/13	23/23
RML-star	N/A	N/A	N/A	2/2	6/6
RML-language	3/3	3/3	1/1	3/3	3/3
RML-datatype	N/A	0/2	N/A	N/A	2/2
RML-IO	6/6	N/A	N/A	N/A	6/6
RML-functions	0/10	0/4	N/A	6/6	10/10
Total w.r.t. its serialization	64% (27/42)	77% (21/27)	100% (12/12)	100% (24/24)	100% (50/50)
Total w.r.t. all features	54% (27/50)	42% (21/50)	24% (12/50)	48% (24/50)	100% (50/50)

YATTER passes all test-cases

Stardog and XRM pass all supported features by their serialization YARRML-parser and ShExML provide >60% of the language coverage

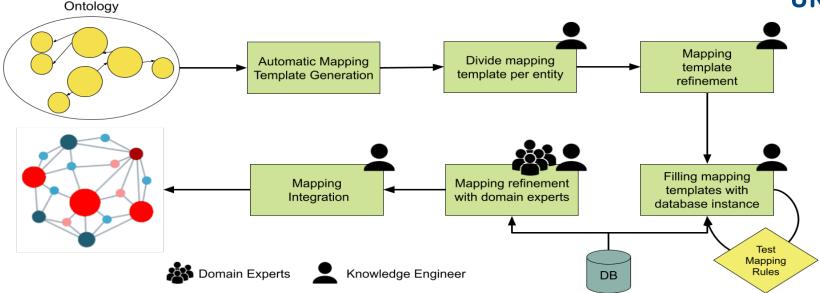
The EU Data Space on Public Procurement



- Homogenize the access to all public procurement data across Europe
- First semantic data architecture of this magnitude in the world
- Calculate standard transparency indicators for each member state
- Proof of concept with YARRRML-Star, YATTER and RMLMapper

Constructing RDF graphs for Research-Performing Organizations





Conclusions:

- Extending YARRRML for a new generation of KG Construction systems
- Supporting Knowledge Engineers with a new translator
- Ensuring the sustainability of YARRRML with test-cases
- Comparing YARRRML+YATTER w.r.t. other similar solutions

Future Work:

- Support the transition from "old" (YARR)RML to the "new" RML
- User evaluation with human-friendly serializations
- Fully coverage of the YARRAML specification with test-cases











Human-Friendly RDF Graph Construction: Which one do you chose?

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