



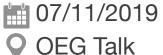


How to Develop Mapping Rules for Knowledge Graph Creation

Ana Iglesias-Molina & David Chaves-Fraga







- Most common methods to generate RDF:
 - OpenRefine
 - Ad-hoc solutions (scripts)
- Reproducibility?
- Maintainability?
- Big Data? Volume, Variety, Velocity

- Most common methods to generate RDF:
 - OpenRefine
 - Ad-hoc solutions (scripts)
- Reproducibility?
- Maintainability?
- Big Data? Volume, Variety, Velocity



Declarative Mappings

Table of Contents

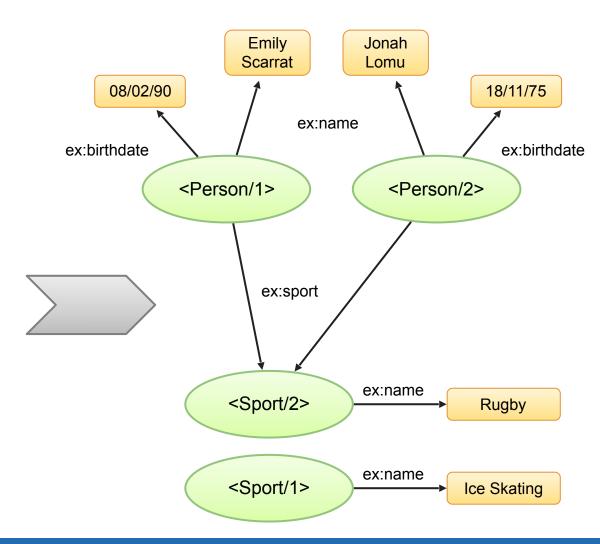
- Introduction
- History
- Structure
- User-friendly options
 - YARRRML
 - Domain Specific Languages
 - Spreadsheets as mappings

Source Data

Knowledge Graph

| People | | | | |
|--------|------------------|-----------|---------|--|
| ID | Name | Birthdate | SportID | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |

| Sports | | | |
|----------|----------------|--|--|
| ID Sport | | | |
| 1 | Ice Skating | | |
| 2 | Rugby | | |

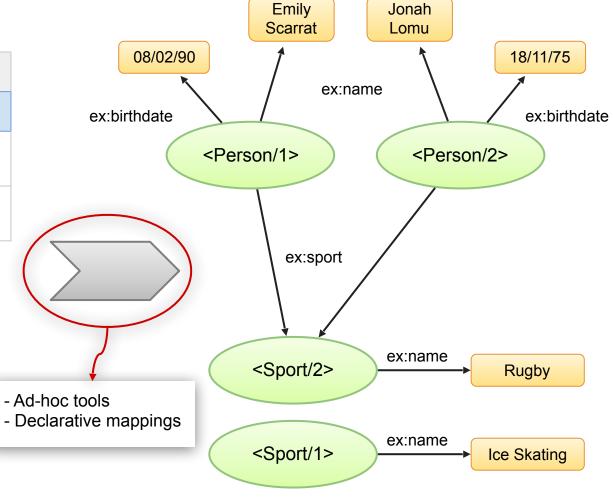


Source Data

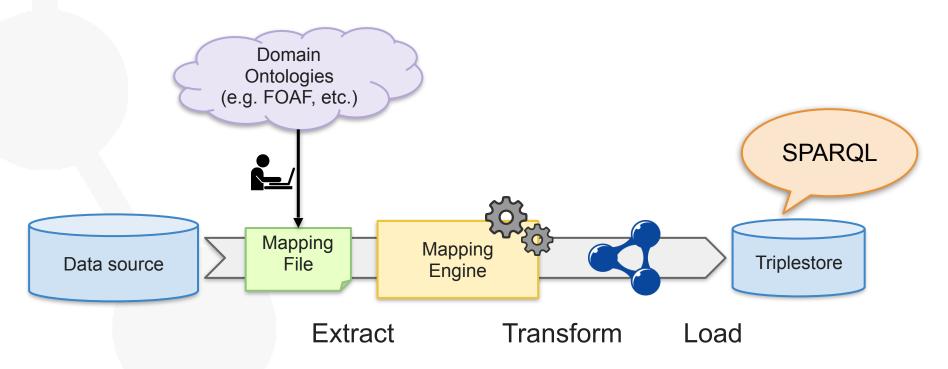
Knowledge Graph

| People | | | |
|--------|------------------|-----------|---------|
| ID | Name | Birthdate | SportID |
| 1 | Emily Scarrat | 19900208 | 2 |
| 2 | Jonah Lomu | 19751118 | 2 |

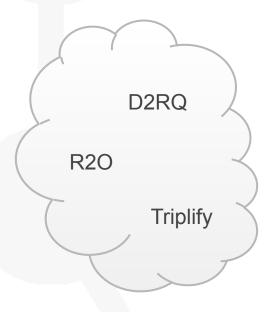
| Sports | | | |
|----------|----------------|--|--|
| ID Sport | | | |
| 1 | Ice Skating | | |
| 2 | Rugby | | |



- Input
 - Data sources
 - Target ontologies
 - Mappings between the database and target ontologies
- Output
 - RDF graph

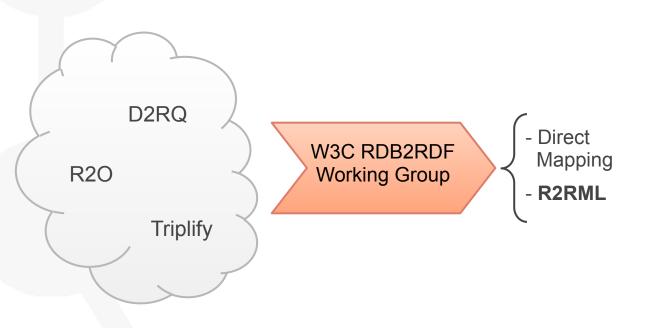


History



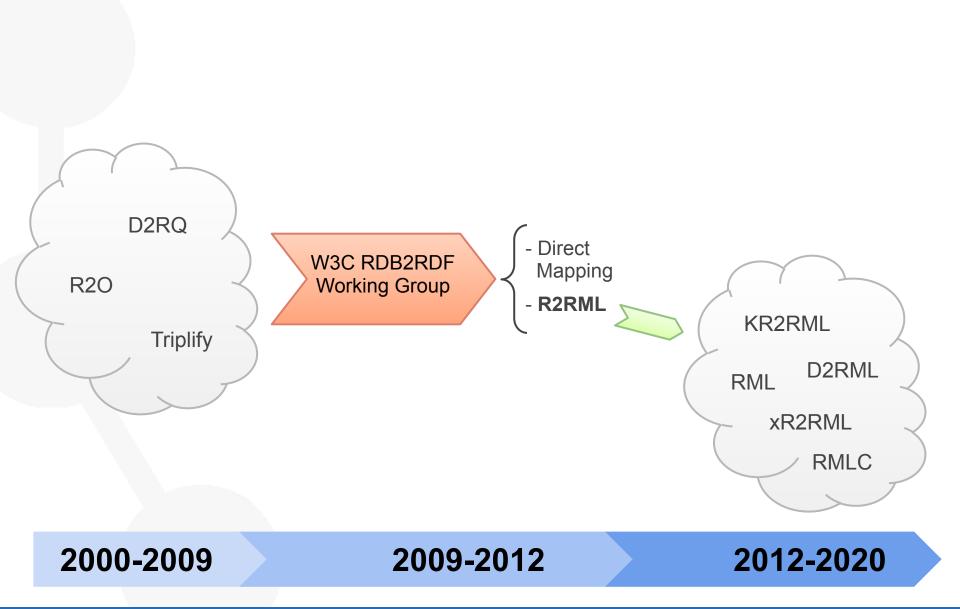
2000-2009

History



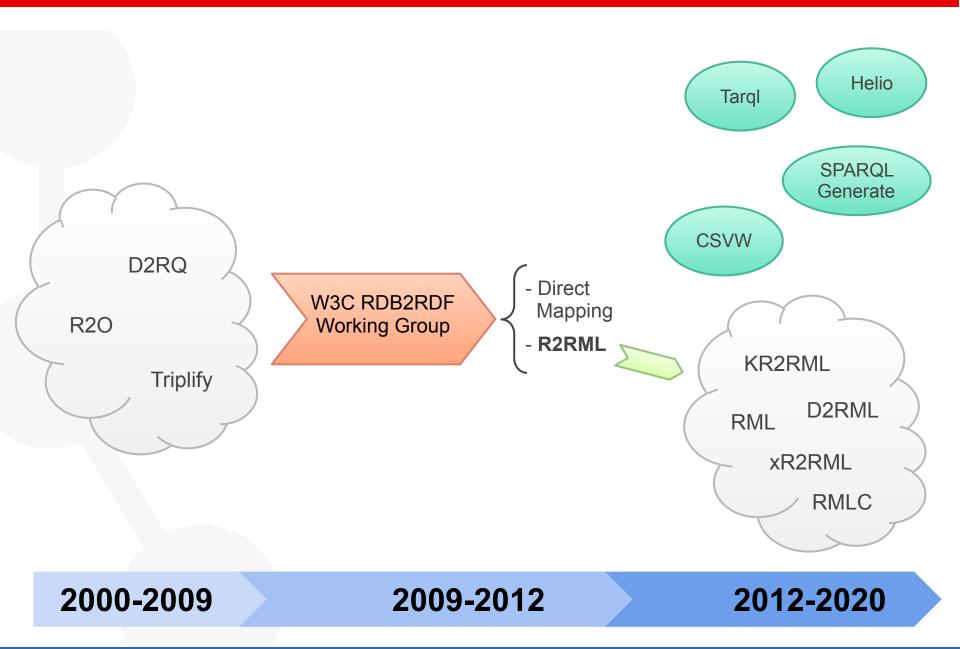
2000-2009

2009-2012



6

History



- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 mil.logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 m.subjectiviap į
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

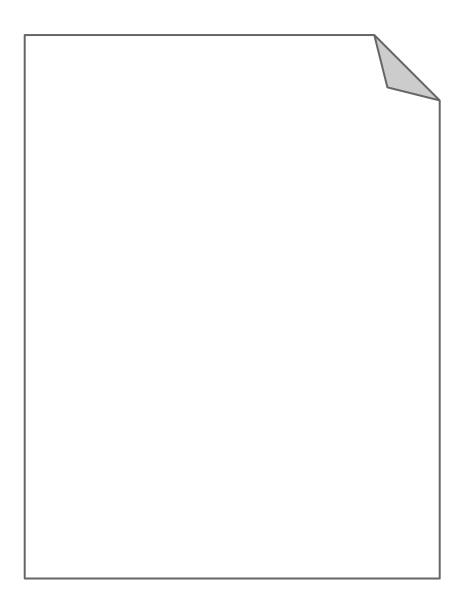
```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:name ];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

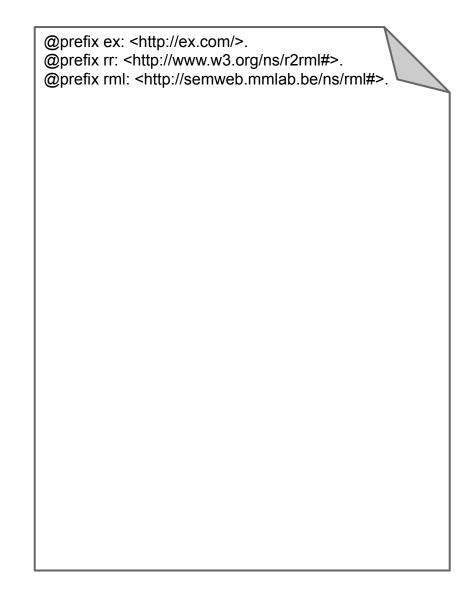
- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

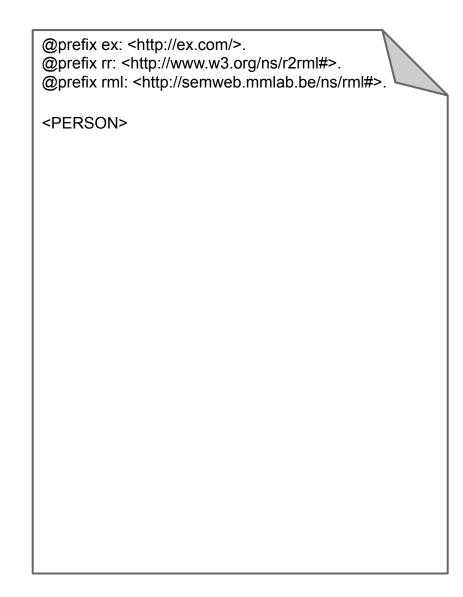
```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

- Prefixes
- Triple Map
 - Source
 - Subject
 - Predicate-Object
 - Reference Object

```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="mailto://semweb.mmlab.be/ns/rml#>">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person:
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap | rr:constant ex:sport |;
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```







| people.csv | | | | |
|------------|------------------|-----------|---------|--|
| ID | Name | Birthdate | SportID | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |

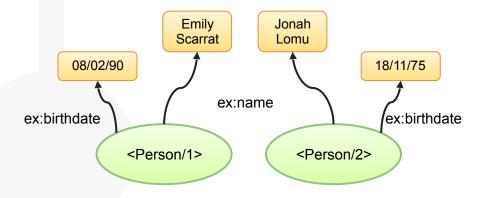
```
@prefix ex: <http://ex.com/>.
@prefix rr: <http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="http://semweb.mmlab.be/ns/rml#>">.
<PERSON>
rml:logicalSource [
  rml:source "/home/user/data/people.csv";
  rml:referenceFormulation ql:CSV;
```

| people.csv | | | | |
|------------|------------------|----------|---|--|
| ID | SportID | | | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |



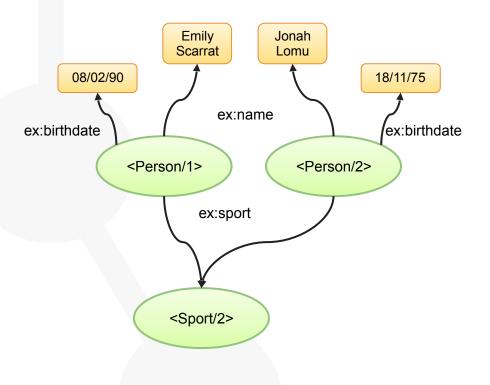
```
@prefix ex: <http://ex.com/>.
@prefix rr: <http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="http://semweb.mmlab.be/ns/rml#">.ml</a>.
<PERSON>
rml:logicalSource [
  rml:source "/home/user/data/people.csv";
  rml:referenceFormulation ql:CSV;
rr:subjectMap [
  rr:class ex:Person;
  rr:template "http://ex.com/Person/{ID}";
```

| people.csv | | | | |
|------------|------------------|-----------|---------|--|
| ID | Name | Birthdate | SportID | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |



```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="http://semweb.mmlab.be/ns/rml#">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
   rr:class ex:Person;
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
```

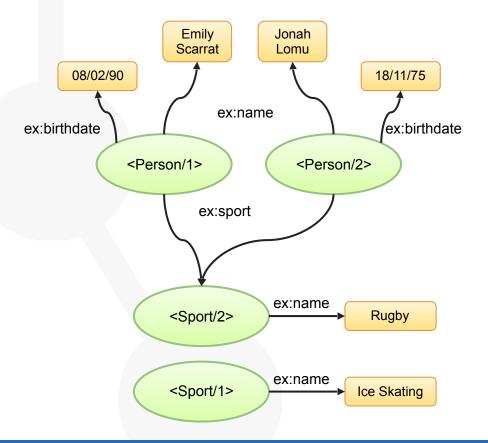
| people.csv | | | | |
|------------|------------------|-----------|---------|--|
| ID | Name | Birthdate | SportID | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |



```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="http://semweb.mmlab.be/ns/rml#">.
<PERSON>
 rml:logicalSource [
   rml:source "/home/user/data/people.csv";
   rml:referenceFormulation ql:CSV;
 rr:subjectMap [
  rr:class ex:Person;
   rr:template "http://ex.com/Person/{ID}";
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:name];
   rr:objectMap [rml:reference "Name"];
 rr:predicateObjectMap [
   rr:predicateMap [rr:constant ex:birthdate];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

| people.csv | | | | |
|------------|------------------|-----------|---------|--|
| ID | Name | Birthdate | SportID | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |

| sports.csv | | | |
|------------|-------------|--|--|
| ID Sport | | | |
| 1 | Ice Skating | | |
| 2 Rugby | | | |



```
@prefix ex: <http://ex.com/>.
@prefix rr: <a href="http://www.w3.org/ns/r2rml#">http://www.w3.org/ns/r2rml#>.
@prefix rml: <a href="http://semweb.mmlab.be/ns/rml#">.
<P
    <SPORT>
      rml:logicalSource [
        rml:source "/home/user/data/sports.csv";
        rml:referenceFormulation ql:CSV;
      rr:subjectMap [
        rr:class ex:Sport;
        rr:template "http://ex.com/Sport/{ID}";
      rr:predicateObjectMap [
        rr:predicateMap [rr:constant ex:name];
        rr:objectMap [rml:reference "sport"];
     ];
   rr:objectMap [rml:reference "Birthdate"];
 rr:predicateObjectMap [
   rr:predicateMap [ rr:constant ex:sport ];
   rr:objectMap [rr:parentTriplesMap <SPORT>;
    rr:joinCondition [ rr:child "sportID"; rr:parent "ID"; ];
```

- Input
 - RDB
 - Target ontologies
 - Mappings between the RDB and target ontologies
- Output
 - RDF graph
 - SPARQL result-set (query translation techniques)
- Engines: https://www.w3.org/TR/rdb2rdf-implementations/

https://www.w3.org/TR/r2rml/

- Input
 - Data sources in any format
 - Target ontologies
 - Mappings between the data sources and target ontologies in RML
- Output
 - RDF graph
- Engines: http://rml.io/implementation-report/

| R2F | RML | RML | |
|-------------------------------------|-----------------|--|--------------------------|
| Logical Table (relational database) | rr:logicalTable | Logical Source (CSV, XML, JSON,HTML,) | rml:logicalSource |
| Table Name | rr:tableName | URI (pointing to the source) | rml:source |
| column | rr:column | reference | rml:reference |
| (SQL) | rr:SQLQuery | Reference Formulation | rml:referenceFormulation |
| per row iteration | | defined iterator | rml:iterator |

Info: http://rml.io/

Examples: https://bit.ly/36Be8r7

User-friendly - YARRRML

YARRML

http://rml.io/yarrrml/matey/

| People | | | | |
|-----------------------|---------------|----------|---|--|
| ID Name Birthdate Spo | | | | |
| 1 | Emily Scarrat | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |

| Sports | | | | |
|----------|----------------|--|--|--|
| ID Sport | | | | |
| 1 | Ice Skating | | | |
| 2 | Rugby | | | |

Target user: Scientist with technical background in data management

Advantage: easy to read and to create; translated to RML

```
prefixes:
 ex: "http://ex.com/"
mappings:
 PERSON:
  sources:
   - [/home/user/data/people.csv~CSV]
  s: http://ex.com/Person/$(ID)
  po:
   - [a, ex:Person]
   - [ex:name, $(Name)]
   - [ex:birthdate, $(Birthdate)]
   - p: ex:sport
     U.
      - mapping: SPORT
       condition:
        function: equal
        parameters:
          - [str1, $(SportID)]
          - [str2, $(ID)]
 SPORT:
  sources:
   - [/home/user/data/people.csv~CSV]
  s: http://ex.com/Sport/$(ID)
  po:
   - [a, ex:Sport]
   - [ex:name, $(Sport)]
```

Domain Specific Language (DSL)

https://zazuko.com/blog/rdf-and-dsl-a-perfect-match/

| People | | | | |
|--------|----------------------|-----------|---------|--|
| ID | Name | Birthdate | SportID | |
| 1 | Emily Scarra t | 19900208 | 2 | |
| 2 | Jonah Lomu | 19751118 | 2 | |

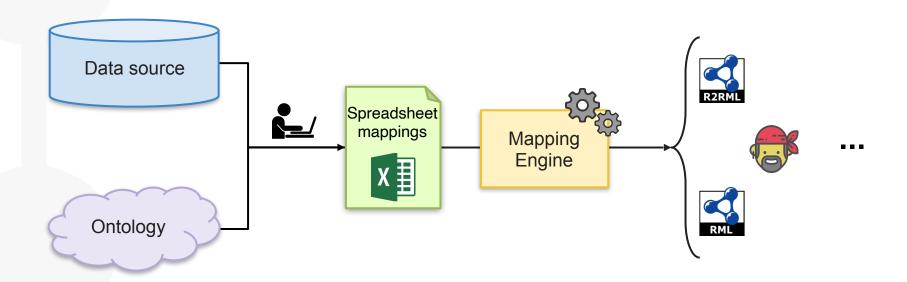
| Sports | | |
|--------|----------------|--|
| ID | Sport | |
| 1 | lce Skating | |
| 2 | Rugby | |

Target user: knowledge engineering with programming skills

Advantage: always generates syntactically valid mappings

```
map PERSON from People {
  subject template http://ex.com/Person/{0} with ID;
 types ex.Person;
 properties
   ex.name from Name
   ex.birthdate from Birthdate
   ex.sport link SPORT with SportID
map SPORT from Sports {
 subject template http://ex.com/Sport/{0} with ID;
 types ex.Sport;
  properties
   ex.name from Sport
```

Spreadsheets as mappings

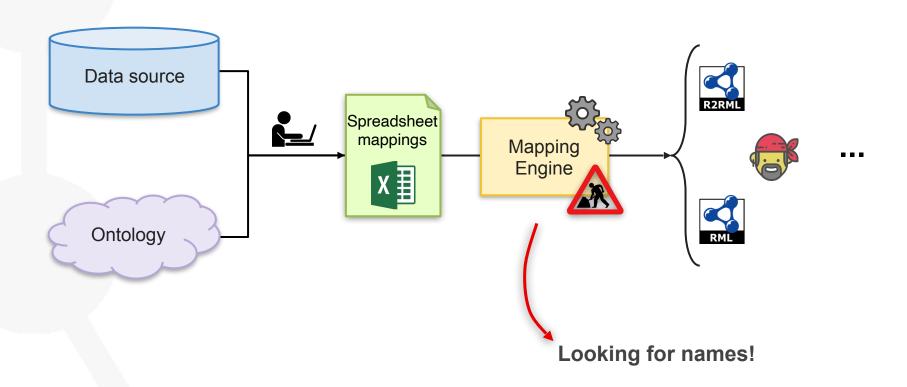




Ana Iglesias-Molina, David Chaves-Fraga, Freddy Priyatna, Óscar Corcho. "Towards the Definition of a Language-Independent Mapping Template for Knowledge Graph Creation". Third International Workshop on Capturing Scientific Knowledge (Sciknow 2019) co-located with the 10th International Conference on Knowledge Capture, 2019

https://github.com/oeg-upm/Excel-mapping-translator https://github.com/w0xter/ABM2ALL

Spreadsheets as mappings





Ana Iglesias-Molina, David Chaves-Fraga, Freddy Priyatna, Óscar Corcho. "Towards the Definition of a Language-Independent Mapping Template for Knowledge Graph Creation". Third International Workshop on Capturing Scientific Knowledge (Sciknow 2019) co-located with the 10th International Conference on Knowledge Capture, 2019

https://github.com/oeg-upm/Excel-mapping-translator https://github.com/w0xter/ABM2ALL

User-friendly - Spreadsheets

| Prefix sheet | | | |
|--------------|----------------|--|--|
| Prefix | URI | | |
| ex | http://ex.com/ | | |

| Subject sheet | | | |
|---------------|-----------|---------------------------|--|
| ID Class | | URI | |
| PERSON | ex:Person | http://ex.com/Person/{ID} | |
| SPORT | ex:Sport | http://ex.com/Sport/{ID} | |

| Source sheet | | | |
|--------------|---------|-----------------|--|
| ID | Feature | Value | |
| PERSON | source | data/people.csv | |
| PERSON | format | CSV | |
| SPORT | source | data/sports.csv | |
| SPORT | format | CSV | |

| Predicate-Object sheet | | | | | | |
|------------------------|-------------|----------|-------------|----------|-----------|--------|
| Predicate | Object | DataType | ReferenceID | InnerRef | OurterRef | ID |
| ex:name | {name} | string | | | | PERSON |
| ex:birthdate | {birthdate} | date | | | | PERSON |
| ex:sport | | | SPORT | SportID | ID | PERSON |
| ex:name | {sport} | string | | | | SPORT |

User-friendly - Spreadsheets

- Following idea of mapping translation*
- Structured in sheets
- Objective: language-independent
- Target user: Non mapping experts
- Advantages: Improves rule visualization, enables using functions of spreadsheets



Oscar Corcho, Freddy Priyatna, and David Chaves-Fraga. 2019. Towards a New Generation of Ontology Based Data Access. *Semantic Web Journal* (2019).

Mapping translation:

- From independent rules to specific language (ISWC 2020)
- Web application to create mappings (ISWC 2020 Demo)

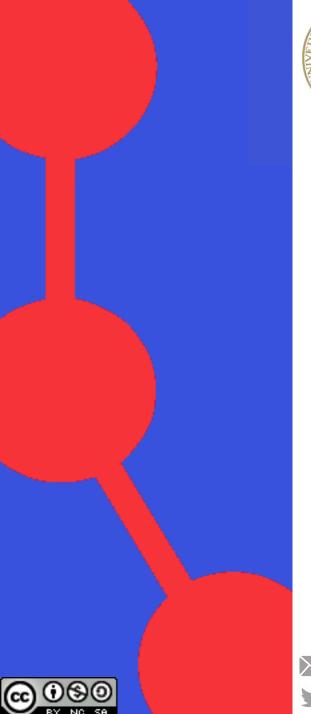
- Engines:

- Web applications of morph tools (Demos)
- Morph-CSV: efficient management tabular data exploiting mapping rules (ESWC 2020 and ISWC 2020)

OTHER IDEAS?

Help us decide:

- 1. SpreadPing (Spreadsheet mapPing)
- 2. MapSheet
- 3. Sheet2Map
- 4. S2M (Sheet to Mapping)
- 5. morph-translation
- 6. ABM2ALL (ABstract Mapping to ALL)
- 7. SpreadMap
- 8. Mapeator
- 9. Map-ATOMATIC
- 10.More ideas?







How to Develop Mapping Rules for Knowledge Graph Creation

Ana Iglesias-Molina & David Chaves-Fraga





