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## Breakout Session II: Hands on Data Annotation using Ontologies

Creating a prototype knowledge graph from NMR spectroscopy research data

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# Creating knowledge graphs from research data

## the preconditions - research data formats



- research data is stored in multiple file formats
  - domain specific formats
    - vendor specific or open file formats

Format	Data type	Maintainer	Parent Format	Specification
mzML	Mass spectrometry	HUPO/ PSI	XML	open
NMReDATA	NMR	NMReDATA Initiative	SDF	open
JCAMP-DX	multiple	IUPAC	ASCII, Text	open

# Creating knowledge graphs from research data

## the preconditions - metadata schemata



- there are different metadata schemata
  - e.g. DataCite's schema, schema.org, Dublin Core Terms and repository specific schemata
    - often not domain specific / fine grained enough
    - if domain specific usually repository specific

```
typeClass: "compound"
▼ value:
  ▼ 0:
    ▶ topicClassValue: {...}
    ▶ topicClassVocab: {...}
    ▶ topicClassVocabURI:
      typeName: "topicClassVocabURI"
      multiple: false
      typeClass: "primitive"
    value: "https://pubchem.ncbi.nlm.nih.gov/compound/5280805"
```

```
▼ tag:
  id: 574047
  taggable_type: "Molecule"
  taggable_id: 3366
  ▶ taggable_data:
    ▶ chemotion:
      doi: "10.14272/QXXCRBSWGPRILJ-UHFFFAOYSA-N.1"
      chemotion_first: "2022-01-10T14:48:05.327+01:00"
      last_published_at: "2022-01-10T14:48:13.202+01:00"
    pubchem_cid: 162394348
```



# Creating knowledge graphs from research data

## the preconditions - domain specific metadata



- it is hard to query & aggregate data from different sources
  - need to know provider specific metadata schemata
  - or, have a true domain specific standard schema
    - like IUPAC FAIRspec finding aid ?



# Creating knowledge graphs from research data

## the preconditions - suitable ontologies already exist

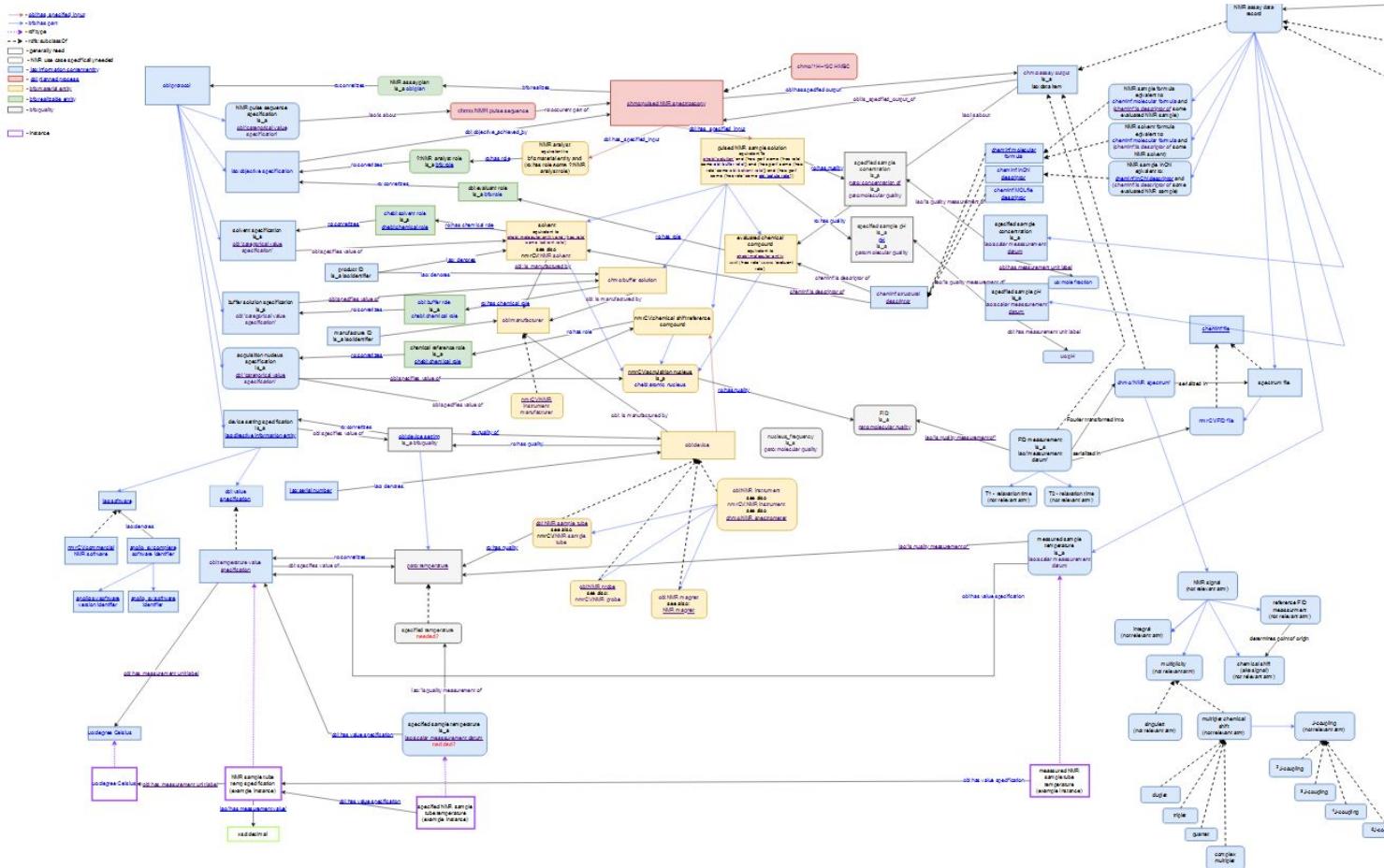


- knowledge graphs could be an alternative
  - make federated queries with SPARQL
  - only need to know about the used ontology terms
    - many of which are already commonly used
  - fosters interdisciplinary work
- proof of concept
  - make knowledge graphs from existing datasets
  - make federated queries on them with SPARQL



# Creating knowledge graphs from research data

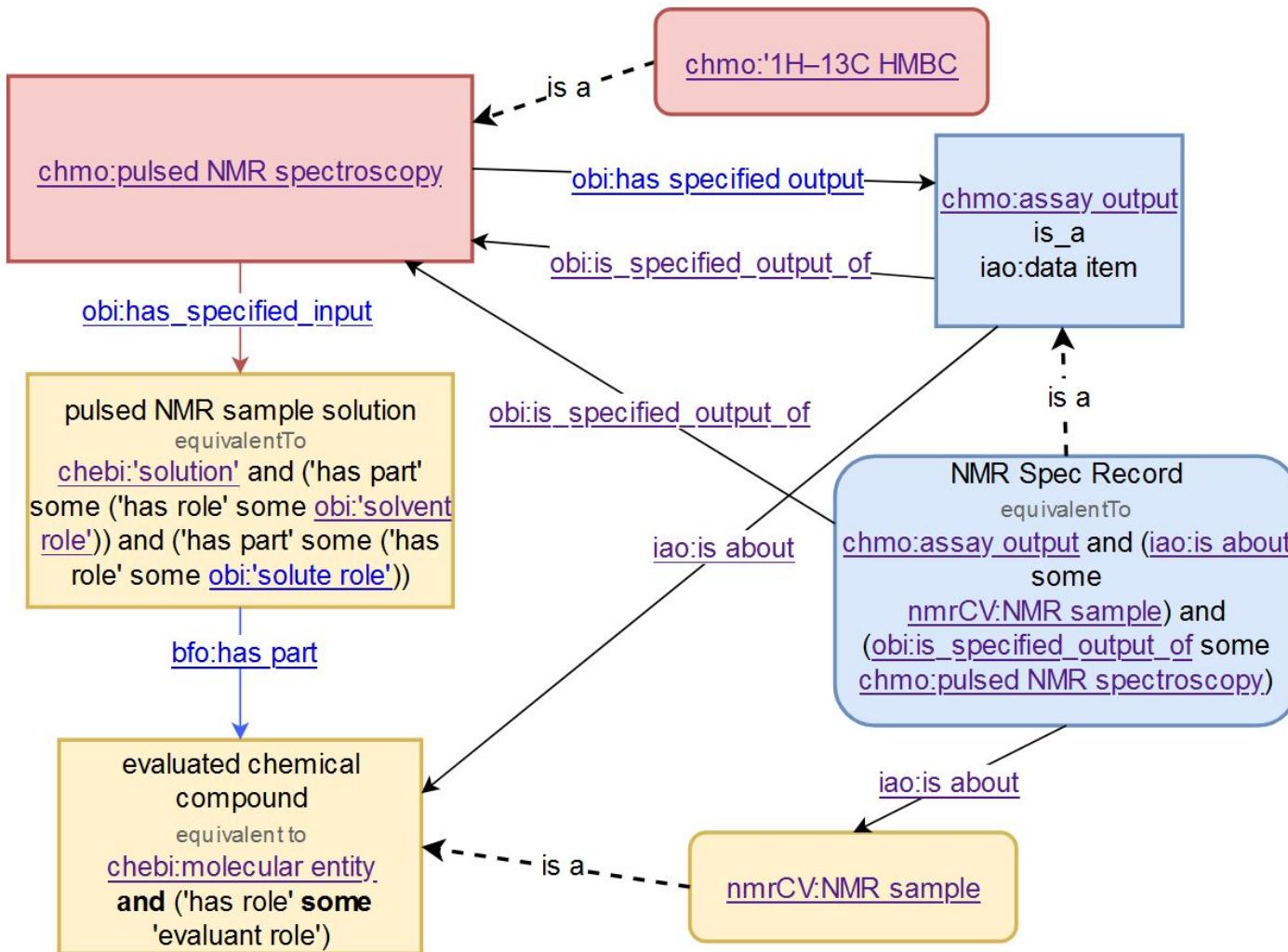
## Step 1: define a terminology box (TBox)



- finding the right terms to describe NMR spectroscopy
- reusing as many terms as possible for interoperability
- we found most in:
  - CHMO
  - nmrCV
  - CHEBI
  - CHEMINF
  - OBI
  - IAO

# Creating knowledge graphs from research data

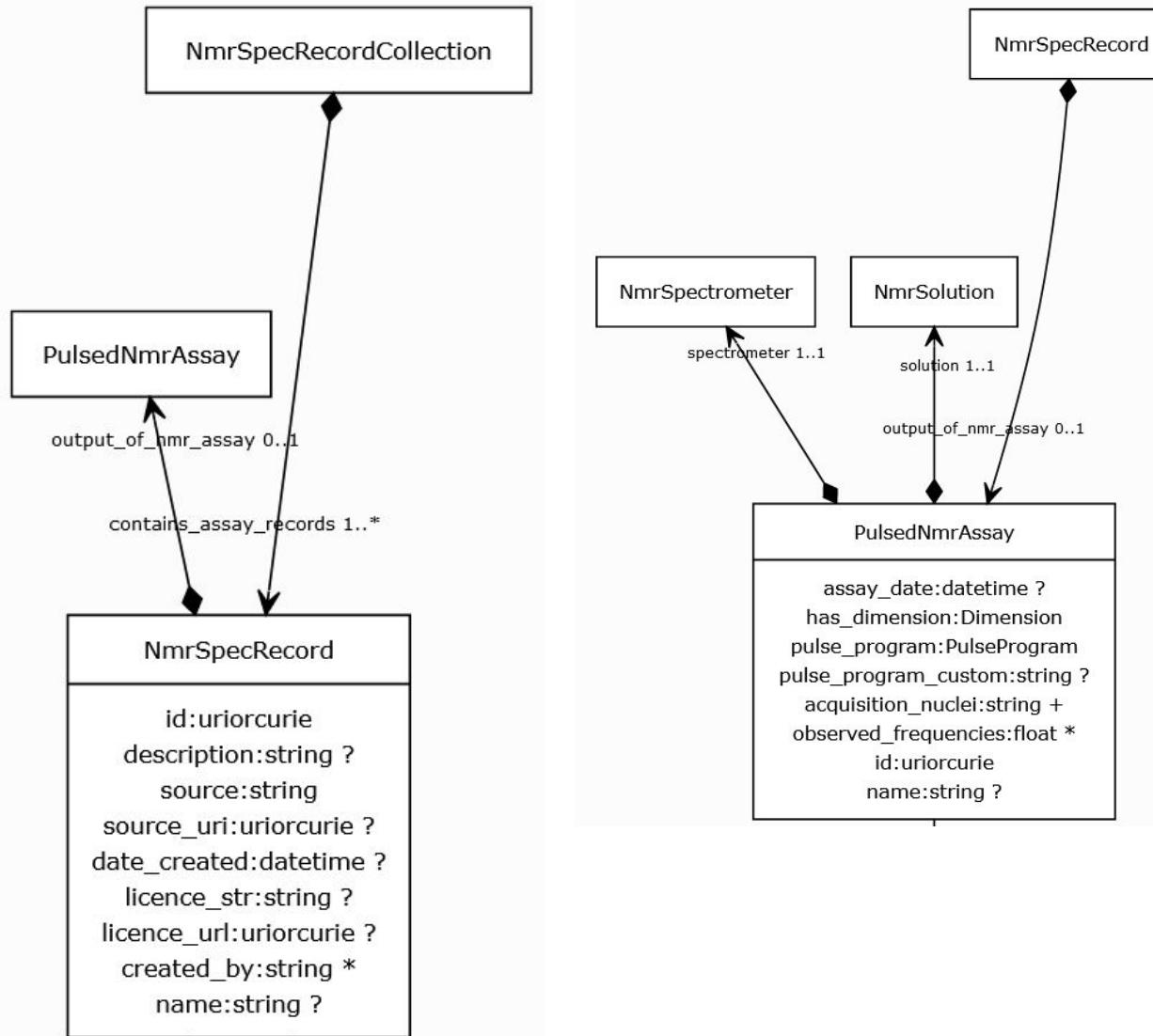
## Step 1: define a terminology box (TBox)



- need to define new entities
  - in existing ontologies
  - one of our later TODOs
  - involves discussion with domain experts
  - semantically more precise

# Creating knowledge graphs from research data

## Step 2: define the shape of the knowledge graph



- <https://stroemphi.github.io/NMRspec/>
- using <https://linkml.io> framework
- prototypical → not complete
- focus on pulsed NMR spectroscopy
  - only links to broader assay context



# Creating knowledge graphs from research data

## Step 2: define the shape of the knowledge graph



```
NMRspec.yaml
40 - semweb_context
41 imports:
42 - linkml:types
43 - ./Provenance
44 emit_prefixes:
45   nmrSPARQL
46 #####
47 classes:
48 # Mixins
49 ChemicalDescriptor: ...
50 NamedThing: ...
51
52 # processes
53 PulsedNmrAssay:
54   mixins:
55     - NamedThing
56   class_uri: chmo:0000613
57   slot_usage:
58     id:
59       ifabsent: uri(nmrSPARQL:Assay)
60   attributes:
61     assay_date: ...
62     solution: ...
63     spectrometer:
64       slot_uri: obi:0000293
65       inlined: true
66       required: true
67     domain: PulsedNmrAssay
68     range: NmrSpectrometer
69   has_dimension:
70     required: true
71     ifabsent: string(1D)
72     range: Dimension
73   pulse_program:
74     description: The pulse program of a
75       PulsedNmrAssay is a required property and
76       must be conform to one of the values
77       defined in the PulseProgram enum class.
```

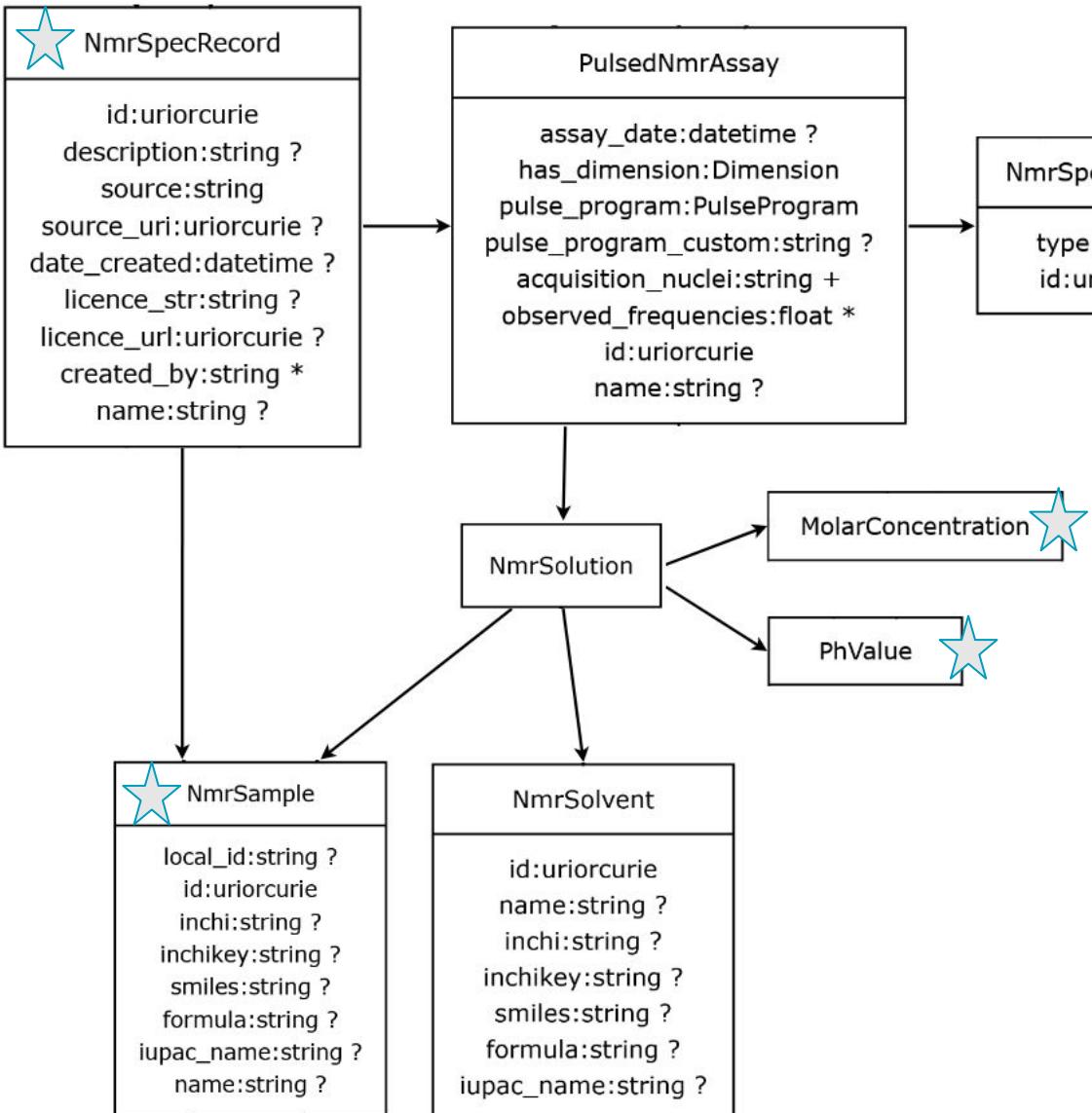
The screenshot shows a development environment with three main panes:

- Code Editor:** Displays the `NMRspec.yaml` file with annotations at the bottom explaining the `pulse_program` property.
- File Explorer:** Shows the project structure under `NMR-schema`, including files like `dict2yaml.py`, `NMRspec.py`, and `jd.py`.
- Documentation:** A screenshot of a documentation page for the `NMRspec` model. It includes:
  - A header note: "# This model is to be used to semantically NMR spectroscopy research data."
  - A sidebar with links: Home, Index (selected), Classes, Mixins, Slots, Enums, Subsets, Types, Credits.
  - The **Classes** section listing various classes like `MOLfile`, `Manufacturer`, `MolarConcentration`, etc.
  - The **Index** section with a search bar and a list of terms like `hema`, `collection`, `assay`, `provenance`, `dimension`, `pulseprogram`, `assaydate`, `solution`, `spectrometer`, `acquisitionnucl`, `hasdimension`, `pulseprogram`, `id`, `assaydate`, `pulseprogramcustom`, `observedfrequencies`, and `name`.

Two large blue arrows point from the code editor towards the documentation pane, indicating the flow from the schema definition to the generated API and documentation.

# Creating knowledge graphs from research data

## Step 3: parsing values from JCAMP-DX



- JCAMP-DX datasets as source for NMR
  - around for long and open
  - Python parser already exists
  - unfortunately many dialects :(
  - contains only limited metadata
    - ★ must come from other sources
    - assumed to be auto-generated in ELNs
- still hard to get many .wdx files
  - we used Harvard Dataverse, Chemotion, OSDB

# Creating knowledge graphs from research data

## Step 3: parsing values from JCAMP-DX



The terminal window shows a file tree with four JDX files and a dataset\_info.yaml file. The dataset\_info.yaml file contains the following YAML code:

```
dataset_info.yaml
Typ: YAML-Datei

Limonene_7020ug200uL_CDCI3_13CNMR_400MHz_JDX.jdx
Typ: JDX-Datei

Limonene_7020ug200uL_CDCI3_COSY_400MHz_JDX.jdx
Typ: JDX-Datei

Limonene_7020ug200uL_CDCI3_HMBC_400MHz_JDX.jdx
Typ: JDX-Datei

dataset_info.yaml
x
9 licence_url: https://creativecommons.org/share-your-work/public-domain/cc0
10 date_created: "2019-10-28"
11 description: "NMR data of D-limonene in DMSOd6. The dataset contains 1D 1H 13C as well as 2D COSY, HSQC, HMBC, all acquired at 400 MHz (Jeol 400 MHz spectrometer with SuperCOOL Probe) (2019-10-07). Related Publication Can Invalid Bioactives Undermine Natural Product-Based Drug Discovery? J. Med. Chem. doi: 10.1021/acs.jmedchem.5b01009 https://doi.org/10.1021/acs.jmedchem.5b01009. Related Material Indofine 5989-27-5 Lot #025082s 7.02 mg 3mm Tube Cambridge Isotope DML-10-10X1 lot #10E-645 Solvent volume 200 μL."
12 id: doi:10.7910/DVN/2UEA9M
13 name: D-Limonene 400 MHz in DMSOd6 NMR data
14 created_by:
15 - "Kim, Seon Beom (University of Illinois at Chicago) - ORCID: 0000-0001-8015-1404"
16 - "Simmler, Charlotte (University of Illinois at Chicago) - ORCID: 0000-0002-6923-2630"
17 - "Bisson, Jonathan (University of Illinois at Chicago) - ORCID: 0000-0003-1640-9989"
18 - "Pauli, Guido (University of Illinois at Chicago) - ORCID: 0000-0003-1022-4326"
19 #####
20 # sample metadata #
21 #####
22 #####
23 assays_sample:
24 # you MUST provide at least one of the following metadata on the assayed sample
25 name: D-Limonene
26 id: pubchemCID:440917
27 formula: C10H16
28 iupac_name: (4R)-1-methyl-4-prop-1-en-2-ylcyclohexene
29 inchi: InChI=1S/C10H16/c1-8(2)10-6-4-9(3)5-7-10/h4,10H,1,5-7H2,2-3H3/t10-/m0/s1
30 inchikey: XMGQYMWDDOXHM-JTQLQIEISA-N
31 smiles: CC1=CCC(CC1)C(=C)C
32 mol_file:
33 id: doi:10.7910/DVN/2UEA9M/JOCQYF
34 name: D-Limonene.mol
35 #####
36 # records in dataset #
37 #####
38 #####
39 contains_assay_records:
40 # you MUST provide at least an URI as the id of each assay record (.jdx) in this dataset. If the records do not have an URI, you must use "nmrSPARQL:" as prefix and the filename (e.g. "id: nmrSPARQL:filename1.jdx")
41 - id: nmrSPARQL:Limonene_7020ug200uL_CDCI3_13CNMR_400MHz_JDX.jdx
42 source: Limonene_7020ug200uL_CDCI3_13CNMR_400MHz_JDX.jdx
```

- dataset\_info.yaml with metadata not in JDX files
  - dataset provenance (source, creators, PID, ...)
  - metadata of the assayed sample (InChI, InChIKey, SMILES, ...)
- dict2yaml.py
  - parse JDX files in batch
  - create one NMR record collection as YAML
    - each JDX is one NMRSpecRecord
- yaml2rdf.bat
  - convert the YAML to TTL

# Creating knowledge graphs from research data

## Step 4: load the knowledge graphs into a triple store



- NMR research metadata expressed in triple statements

```
<https://doi.org/10.7910/DVN/F34GVS/KZ0QZU/1HNMR_jdx> a ns1:NmrSpecRecord ;  
ns2:OBI_0000312 <https://doi.org/10.7910/DVN/F34GVS/KZ0QZU/1HNMR_jdx/Assay> ;  
dc:source "1HNMR_jdx.jdx" .  
  
<https://doi.org/10.7910/DVN/F34GVS/KZ0QZU/1HNMR_jdx/Assay> a ns2:CHMO_0000613 ;  
ns2:OBI_0000293 <https://doi.org/10.7910/DVN/F34GVS/KZ0QZU/1HNMR_jdx/Solution>,  
<https://doi.org/10.7910/DVN/F34GVS/KZ0QZU/1HNMR_jdx/Spectrometer> ;  
ns1:acquisition_nuclei "1H" ;  
ns1:has_dimension "1D" ;  
ns1:observed_frequencies "399.78219837825"^^xsd:float ;  
ns1:pulse_program "NMR" .
```

# SPARQL Queries



Show me only  $^1\text{H}$  NMR Spectra with a resolution higher 400 MHz

PREFIX rdf: <<http://www.w3.org/1999/02/22-rdf-syntax-ns#>>

PREFIX OBO: <<http://purl.obolibrary.org/obo/>>

PREFIX NMR: <<https://raw.githubusercontent.com/StroemPhi/NMRspec/main/model/schema/>>

SELECT ?dataset ?frequency

WHERE {

?dataset NMR:pulse\_program "NMR".

?dataset NMR:acquisition\_nuclei "1H".

?dataset NMR:observed\_frequencies ?frequency

FILTER( ?frequency >= 400)

}

query add data edit info

### SPARQL Query

To try out some SPARQL queries against the selected dataset, enter your query here.

Example Queries Selection of triples Selection of classes

Prefixes [rdf](#) [rdfs](#) [owl](#) [xsd](#)

Content Type (SELECT) [JSON](#) Content Type (GRAPH) [Turtle](#)

```
4 PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>
5 PREFIX OBO: <http://purl.obolibrary.org/obo/>
6 PREFIX NMR: <https://raw.githubusercontent.com/StroemPhi/NMRspec/main/model/schema/>
7
8 SELECT ?dataset ?frequency
9 WHERE {
10 ?dataset NMR:pulse_program "NMR".
11 ?dataset NMR:acquisition_nuclei "1H".
12 ?dataset NMR:observed_frequencies ?frequency
13 FILTER( ?frequency >= 400)
14 }
15
16
17
```

Table Response 6 results in 0.039 seconds Simple view Ellipse Filter query results Page size: 50

dataset	frequency
1 < <a href="https://doi.org/10.7910/DVN/KUEDTG/Linalool_10000ug200uL_CDCI3_1HNMR_900MHz_JDX/Assay">https://doi.org/10.7910/DVN/KUEDTG/Linalool_10000ug200uL_CDCI3_1HNMR_900MHz_JDX/Assay</a> >	"900.077600296"^^< <a href="http://www.w3.org/2001/XMLSchema#float">http://www.w3.org/2001/XMLSchema#float</a> >
2 < <a href="https://doi.org/10.7910/DVN/M8QR20/VEIWX8/Lupeol_LUPE01_q1H/Assay">https://doi.org/10.7910/DVN/M8QR20/VEIWX8/Lupeol_LUPE01_q1H/Assay</a> >	"900.077600296"^^< <a href="http://www.w3.org/2001/XMLSchema#float">http://www.w3.org/2001/XMLSchema#float</a> >
3 < <a href="https://doi.org/10.7910/DVN/SAC0TQ/SNCCAF/Tetrandrine_3090ug200uL_DMSOd6_1HNMR_600MHz_JDX/Assay">https://doi.org/10.7910/DVN/SAC0TQ/SNCCAF/Tetrandrine_3090ug200uL_DMSOd6_1HNMR_600MHz_JDX/Assay</a> >	"600.1536009"^^< <a href="http://www.w3.org/2001/XMLSchema#float">http://www.w3.org/2001/XMLSchema#float</a> >
4 < <a href="https://doi.org/10.14272/QXXCRBSWGRILJ-UHFFFAOYSA-N/CHMO0000595/Assay">https://doi.org/10.14272/QXXCRBSWGRILJ-UHFFFAOYSA-N/CHMO0000595/Assay</a> >	"400.13160052"^^< <a href="http://www.w3.org/2001/XMLSchema#float">http://www.w3.org/2001/XMLSchema#float</a> >
5 < <a href="https://doi.org/10.14272/QXXCRBSWGRILJ-UHFFFAOYSA-N/CHMO0000593/Assay">https://doi.org/10.14272/QXXCRBSWGRILJ-UHFFFAOYSA-N/CHMO0000593/Assay</a> >	"400.132470802"^^< <a href="http://www.w3.org/2001/XMLSchema#float">http://www.w3.org/2001/XMLSchema#float</a> >

# Federated SPARQL Queries



## Federated query across Research Data Triplestore and Wikidata based on PubChemId

PREFIX wdt: <http://www.wikidata.org/prop/direct/>

PREFIX rdfs: <http://www.w3.org/2000/01/rdf-schema#>

PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>

PREFIX NMR: <https://raw.githubusercontent.com/StroemPhi/NMRspec/main/model/schema>

SELECT ?NMRSample ?pubchemId ?item WHERE {

?NMRSample rdf:type NMR:NmrSample.

BIND(REPLACE(str(?NMRSample),

"https://pubchem.ncbi.nlm.nih.gov/compound/", "")

AS ?pubchemId).

SERVICE <<https://query.wikidata.org/bigdata/namespace/wdq/sparql>>

{

?item wdt:P662 ?pubchemId.

}

}

The screenshot shows a SPARQL query interface with the following details:

- Query Tab:** The user is in the "query" tab.
- SPARQL Query:** The query is pasted into the main text area.
- Example Queries:** Buttons for "Selection of triples" and "Selection of classes".
- Prefixes:** Buttons for "rdf", "rdfs", "owl", and "xsd".
- Content Type (SELECT):** Set to "JSON".
- Content Type (GRAPH):** Set to "Content Type (GRAPH)".
- Results:** A table showing 9 results in 2.932 seconds. The columns are "NMRSample", "pubchemId", and "item".

NMRSample	pubchemId	item
1 <https://pubchem.ncbi.nlm.nih.gov/compound/2758>	2758	<http://www.wikidata.org/entity/Q161572>
2 <https://pubchem.ncbi.nlm.nih.gov/compound/1548943>	1548943	<http://www.wikidata.org/entity/Q273169>
3 <https://pubchem.ncbi.nlm.nih.gov/compound/5280805>	5280805	<http://www.wikidata.org/entity/Q407857>
4 <https://pubchem.ncbi.nlm.nih.gov/compound/64945>	64945	<http://www.wikidata.org/entity/Q416260>
5 <https://pubchem.ncbi.nlm.nih.gov/compound/222284>	222284	<http://www.wikidata.org/entity/Q121802>

# Federated SPARQL Queries



Find matching entries in further data repository: Like finding a corresponding Mass Spectra in MassBank

PREFIX wdt: <http://www.wikidata.org/prop/direct/>

PREFIX rdfs: <http://www.w3.org/2000/01/rdf-schema#>

PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>

PREFIX NMR: <https://raw.githubusercontent.com/StroemPhi/NMRSpec/main/1

SELECT ?NMRSample ?pubchemId ?item WHERE {

?NMRSample rdf:type NMR:NmrSample.

BIND(REPLACE( str(?NMRSample),

"https://pubchem.ncbi.nlm.nih.gov/compound/", "")

AS ?pubchemId).

SERVICE <<https://query.wikidata.org/bigdata/namespace/wdq/sparql>>

{

?item wdt:P662 ?pubchemId.

?item wdt:P6689 ?massbank.

}

query add data edit info

### SPARQL Query

To try out some SPARQL queries against the selected dataset, enter your query here.

Example Queries

Selection of triples Selection of classes

Prefixes

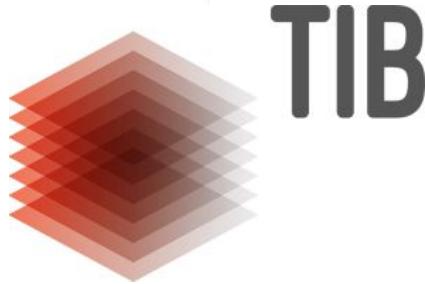
rdf rdfs owl xsd

Content Type (SELECT) JSON Content Type (GRAPH)

```
1 PREFIX wdt: <http://www.wikidata.org/prop/direct/>
2 PREFIX rdfs: <http://www.w3.org/2000/01/rdf-schema#>
3 PREFIX owl: <http://www.w3.org/2002/07/owl#>
4 PREFIX rdf: <http://www.w3.org/1999/02/22-rdf-syntax-ns#>
5 PREFIX OBO: <http://purl.obolibrary.org/obo/>
6 PREFIX NMR: <https://raw.githubusercontent.com/StroemPhi/NMRSpec/main/model/schema/>
7 SELECT ?NMRSample ?massbank WHERE {
8 ?NMRSample rdf:type NMR:NmrSample.
9 BIND(REPLACE( str(?NMRSample), "https://pubchem.ncbi.nlm.nih.gov/compound/", "") AS ?pubchemId).
10 SERVICE <https://query.wikidata.org/bigdata/namespace/wdq/sparql> {
11 ?item wdt:P662 ?pubchemId.
12 ?item wdt:P6689 ?massbank.
13 }
14 }
```

Table Response 54 results in 3.451 seconds

NMRSample	massbank
1 <https://pubchem.ncbi.nlm.nih.gov/compound/1548943>	PR100259
2 <https://pubchem.ncbi.nlm.nih.gov/compound/1548943>	PR100683
3 <https://pubchem.ncbi.nlm.nih.gov/compound/1548943>	TY000093
4 <https://pubchem.ncbi.nlm.nih.gov/compound/1548943>	TY000245
5 <https://pubchem.ncbi.nlm.nih.gov/compound/1548943>	WA001601



# Thank you