



SINTEF

A Semantic Approach to Battery Digital Twins

Dr. Simon Clark, SINTEF AS

Semantic Materials Workshop, 2025-11-10



Teknologi for et bedre samfunn

Overview

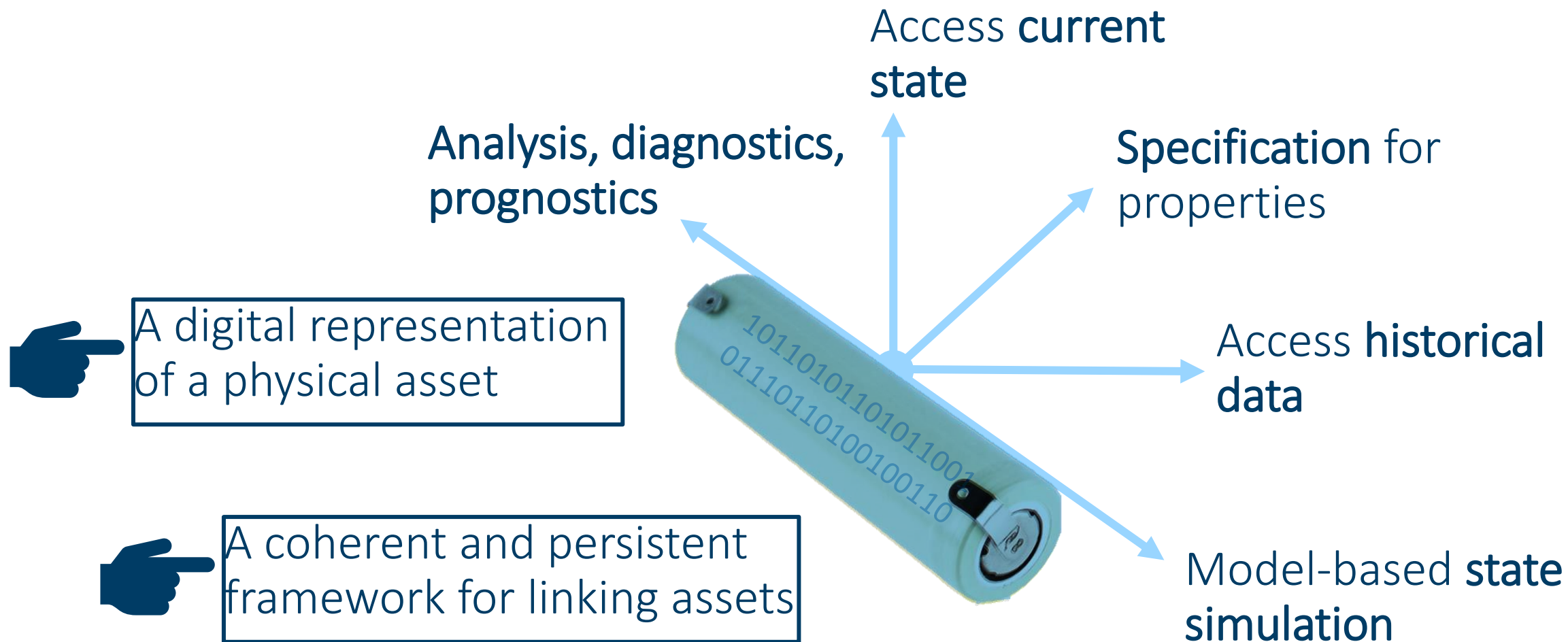
1. What is a **digital twin**?
2. Why is a **semantic approach** needed?
3. How can a semantic digital twin be **implemented**?
4. What are the **challenges**?
5. What is the **outlook**?

What is a digital twin?



SINTEF

What is a Battery Digital Twin?



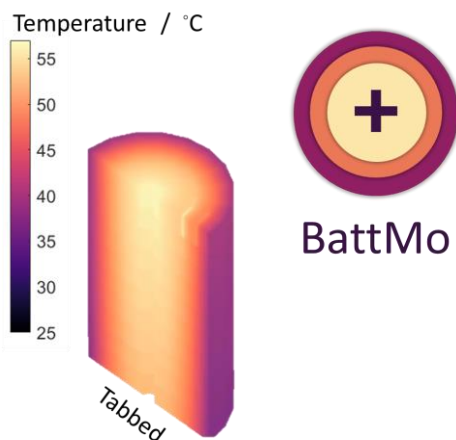


SINTEF

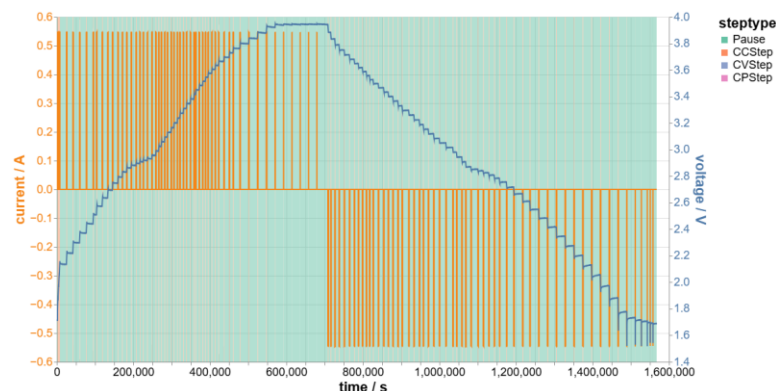
What is a Battery Digital Twin?

The pieces necessary to implement a battery digital twin exist, and they work great on their own, but they do not work well together.

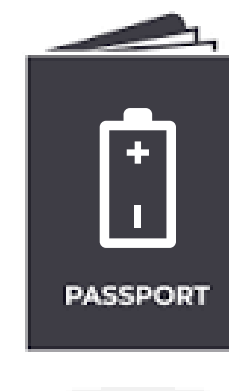
open-source
models



data management &
analysis



digital product
passport



Varying API specifications, JSON I/O schemas, plain text documentation

Why is a semantic approach needed?



SINTEF

Why is a semantic approach needed?

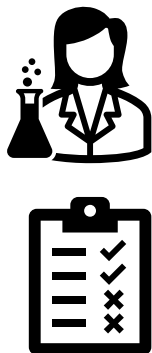
Battery design, manufacturing, and operation is an “everything problem” and we need to **link knowledge across many domains** to solve it.

Raw
Materials



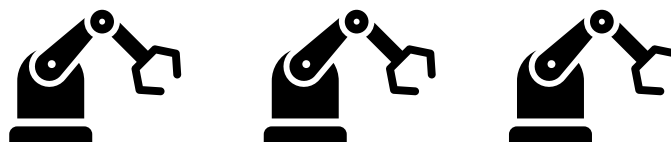
Specs

Quality
Checks



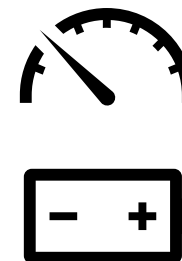
Lab
Reports

Manufacturing Steps



Equipment Settings &
In-Line Measurements

Testing



Electrical
Data

Integration



BMS Data

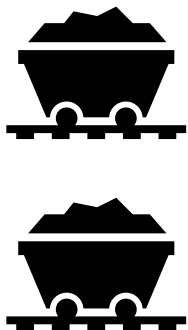


SINTEF

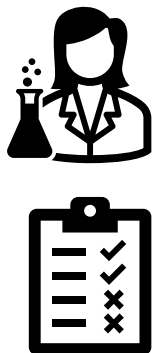
Why is a semantic approach needed?

Battery design, manufacturing, and operation is an “everything problem” and we need to **link knowledge across many domains** to solve it.

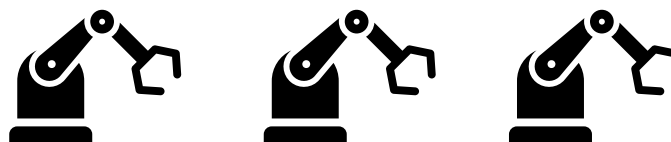
Raw
Materials



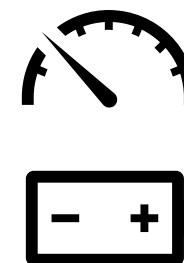
Quality
Checks



Manufacturing Steps



Testing



Integration



A semantic approach is necessary to support data interoperability, knowledge management, and provide a foundation for AI activities

How can a semantic digital twin be implemented?



SINTEF

Implementation: EMMO Battery Domain Ontology

The **EMMO Battery Domain Ontology** offers an extensive collection of concepts describing **battery knowledge**, building on existing resources like **IEC** and **IUPAC** recommendations.

- Supports descriptions of **battery materials, components, cells, systems, processes, models, and datasets**
- **Re-uses and extends** other **EMMO domains** including **chemical-substance, characterisation, and electrochemistry**
- Adheres to **EMMO community guidelines** and **W3C best practices**
- Designed with **Semantic Web integration** in mind



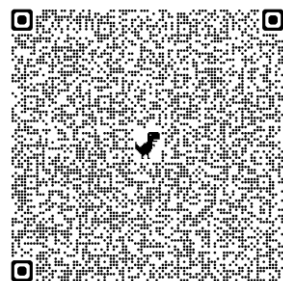


SINTEF

Implementation: Battery Metadata

```
{
  "@context": "https://w3id.org/emmo/domain/battery/context",
  "@type": "Battery",
  "hasPositiveElectrode": {
    "@type": "Electrode",
    "hasActiveMaterial": {
      "@type": "LithiumIronPhosphate"
    }
  },
  "hasProperty": [
    {
      "@type": "NominalVoltage",
      "hasNumericalPart": {
        "@type": "RealData",
        "hasNumberValue": 3.6
      },
      "hasMeasurementUnit": "emmo:Volt"
    }
  ]
}
```

[JSON-LD Playground](#)



- **Ontology** contains everything necessary to provide a **holistic description of batteries and their properties**.
- **Terms** contain mappings to other prominent sources, e.g. Wikidata, DBpedia, PubChem, etc.



SINTEF

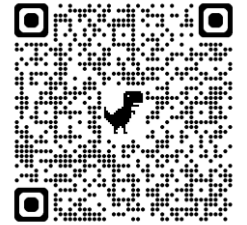
Implementation: Battery Metadata

```
{  
  "@context": "https://w3id.org/emmo/domain/battery/context",  
  "@type": "CR2032"  
}
```

[JSON-LD Playground](#)



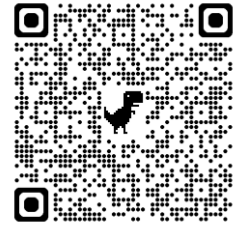
- **Ontology** contains everything necessary to provide a **holistic description of batteries** and **their properties**.
- **Terms** contain mappings to other prominent sources, e.g. Wikidata, DBpedia, PubChem, etc.
- **Pre-built classes** for common battery types under **IEC standards**.



Implementation: Timeseries Data

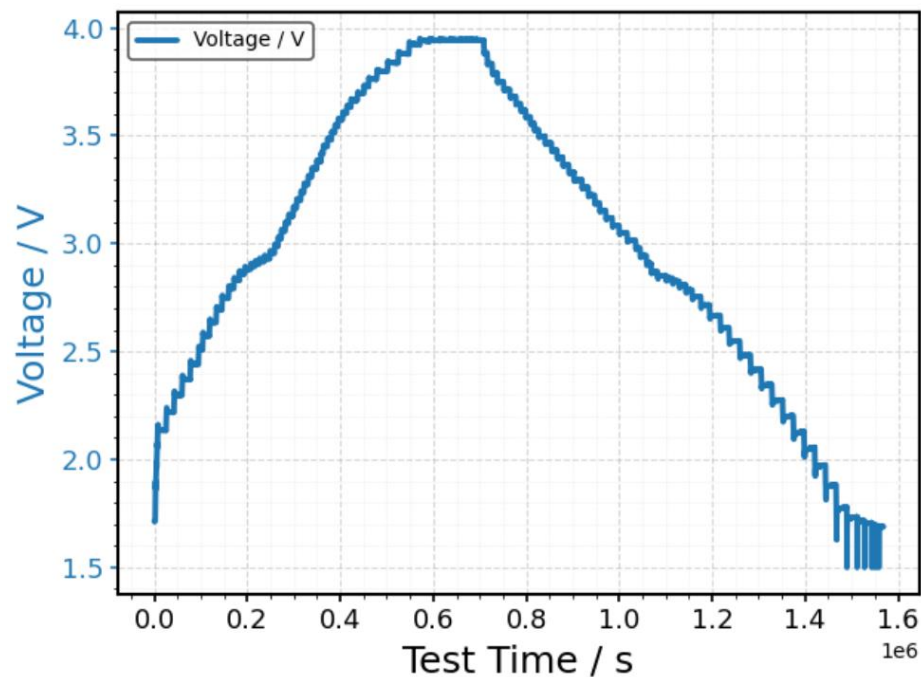
Establishing interoperability of test data among different equipment providers is a stubborn and persistent challenge.

- Many **battery testing equipment** manufacturers **serialize data using a variety of formats and content**.
- **Proprietary binary files**, csv, txt, xlsx – tables containing columns with very **similar but distinct headers and meanings**.
- **Battery2030+ CSA** is partnering with **DigiBatt** and the **Linux Foundation** to create a **semantic standard for timeseries battery data**
- **Recommended terms and units** formalized in an **application ontology**, used to create **CSVW table schema**, and supported with a **python package**.



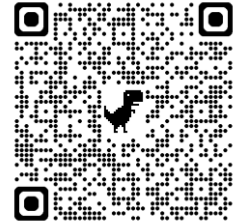
Implementation: Timeseries Data

```
df = bdf.read("https://zenodo.org/records/17289383/files/SINTEF__NaCR32140-  
MP10-04__2025-08-25__GITT_0p05C_25degC__BioLogic.mpt")  
bdf.plot(df)
```



| | Test Time / s | Voltage / V | Current / A | Ambient Temperature / degC | Cycle Count / 1 |
|---|---------------|-------------|-------------|----------------------------|-----------------|
| 0 | 0.0 | 1.71423 | 0.0 | 23.509834 | 0.0 |
| 1 | 10.0 | 1.714152 | 0.0 | 23.162155 | 0.0 |
| 2 | 20.000001 | 1.714152 | 0.0 | 23.383406 | 0.0 |
| 3 | 30.000001 | 1.71423 | 0.0 | 23.328093 | 0.0 |
| 4 | 40.000002 | 1.714191 | 0.0 | 23.375504 | 0.0 |

<https://w3id.org/battery-data-alliance/ontology/battery-data-format/schema>



Implementation: Timeseries Data

← Rich Results Test

Code input

```
1 <!doctype html>
2 <html lang="en">
3   <head>
4     <meta charset="utf-8" />
5     <title>Digatron INR21700 HPPC</title>
6     <script type="application/ld+json">
7   {
8     "@context": [
9       "https://schema.org/",
10      "http://www.w3.org/ns/csvw"
11    ],
12    "@graph": [
13      {
14        "@type": "Dataset",
15        "name": "Digatron INR21700 HPPC",
16        "description": "HPPC characterization of an INR21700 cell at 25°C on a
Digatron cycler.",
17        "creator": [
18          {
19            "@type": "Person",
20            "name": "Example Creator",
21            "sameAs": "https://orcid.org/0000-0002-0000-0010",
22            "givenName": "Example",
23            "familyName": "Creator",
24            "affiliation": {
25              "@type": "Organization",
26              "name": "Your Lab"
27            }
28          }
29        ]
30      }
31    ]
32  }
33  </script>
34  </head>
35  </html>
```

Test results > Datasets

SHARE

✓ 1 valid item detected

Valid items are eligible for Google Search's rich results. [Learn more](#)

VIEW TESTED PAGE

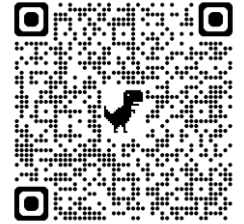
PREVIEW RESULTS

Details

Detected items

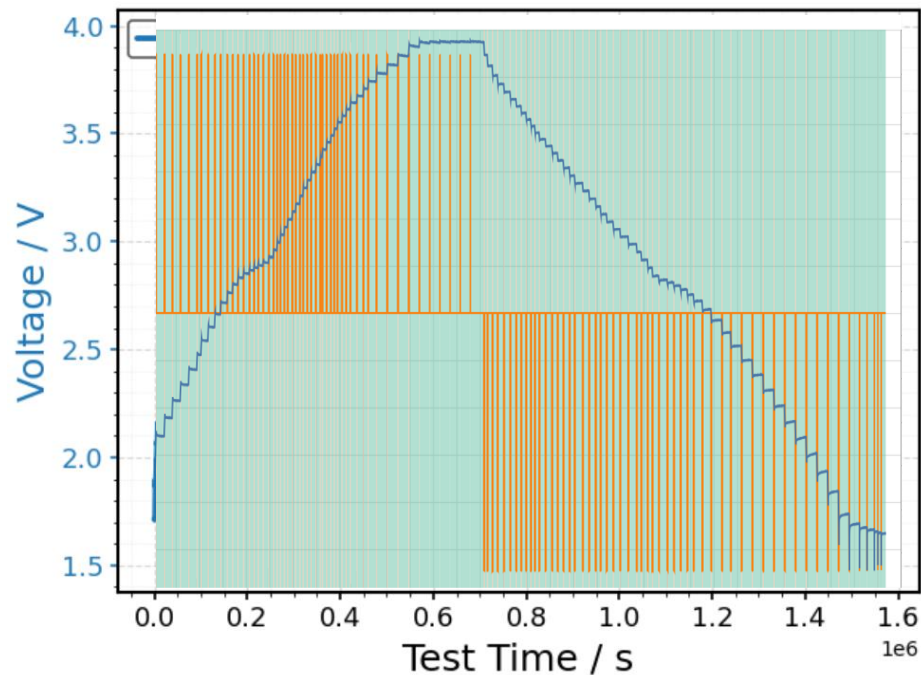
✓ Digatron INR21700 HPPC

| | |
|-------------|-------------------------------------------------------------------------|
| type | Dataset |
| name | Digatron INR21700 HPPC |
| description | HPPC characterization of an INR21700 cell at 25°C on a Digatron cycler. |
| creator | |



Implementation: Timeseries Data

```
df = bdf.read("https://zenodo.org/records/17289383/files/SINTEF__NaCR32140-  
MP10-04__2025-08-25__GITT_0p05C_25degC__BioLogic.mpt")  
bdf.plot(df)
```



| | Test Time / s | Voltage / V | Current / A | Ambient Temperature / degC | Cycle Count / 1 |
|---|---------------|-------------|-------------|----------------------------|-----------------|
| 0 | 0.0 | 1.71423 | 0.0 | 23.509834 | 0.0 |
| 1 | 10.0 | 1.714152 | 0.0 | 23.162155 | 0.0 |
| 2 | 20.000001 | 1.714152 | 0.0 | 23.383406 | 0.0 |
| 3 | 30.000001 | 1.71423 | 0.0 | 23.328093 | 0.0 |
| 4 | 40.000002 | 1.714191 | 0.0 | 23.375504 | 0.0 |

<https://w3id.org/battery-data-alliance/ontology/battery-data-format/schema>



Implementation: Model Parameters

There are a variety of **open-source battery simulation** packages available, but **sharing parameters across platforms and partners creates semantic challenges.**

- **Battery Parameter Exchange (BPX)** is an activity at the Faraday Institution to create a **standardized exchange format for Li-ion battery model parameters.**
- Formalized in an **application ontology** to provide **semantic interoperability** of parameter sets between **open-source simulation tools** PyBaMM, BattMo, cideMOD, etc.
- Also integrated into **commercial software** like **AVL Cruise M, ANSYS Fluent, and GT-AutoLion**

What are the challenges?

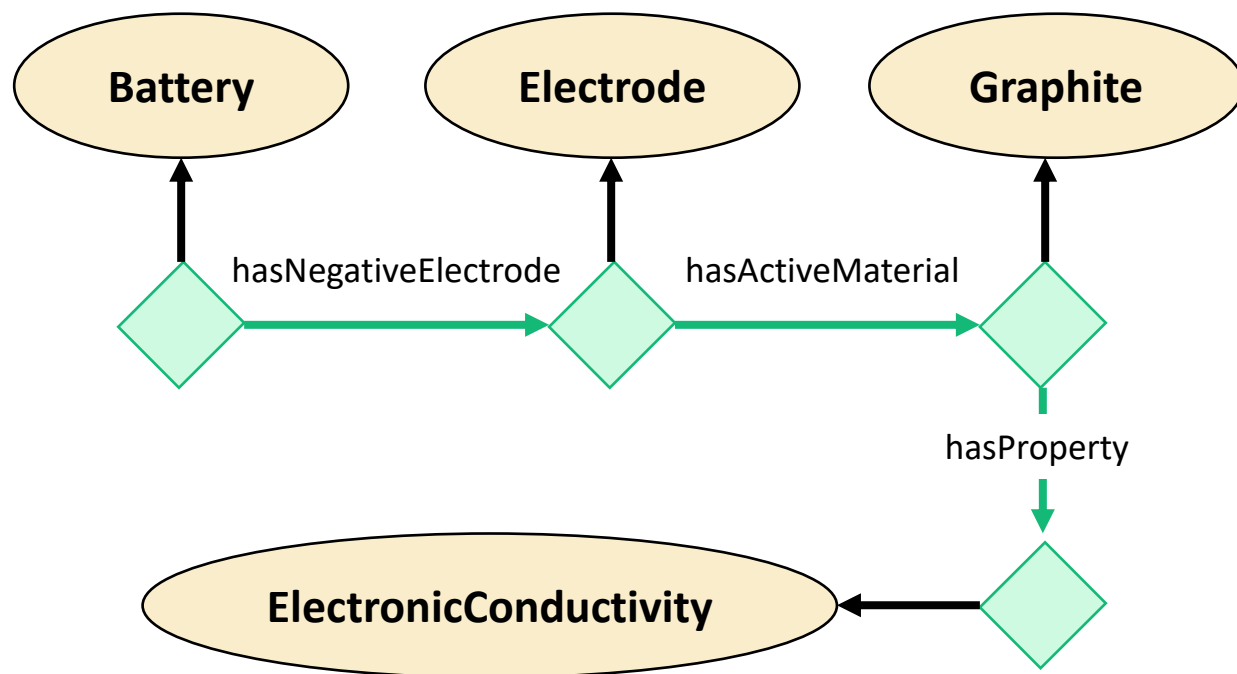


SINTEF

Challenge: Model Parameter Extraction

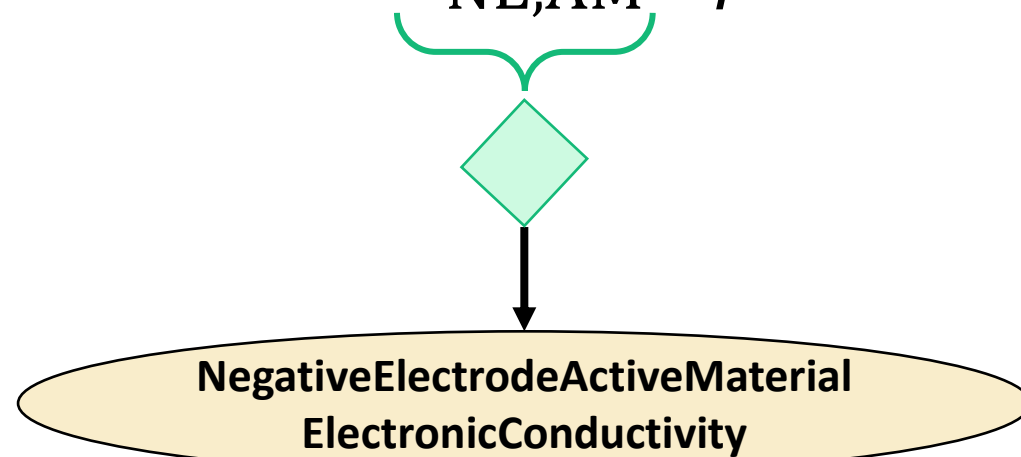
A **battery** is often described as a **holistic arrangement**, creating a **hierarchy of parts with properties**. But **simulation software** is designed around **parameters with very specific meaning and usually flattened**.

In the passport metadata



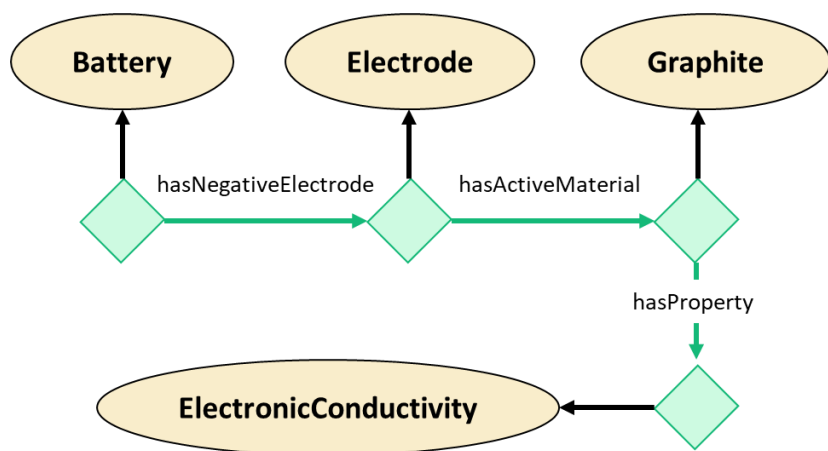
In the model

$$i = -\underbrace{\sigma_{\text{NE,AM}}}_{\text{NegativeElectrodeActiveMaterial}} \nabla \phi$$



Solution: Equivalence-Based Inference

Using **equivalence statements** in the ontology, we can use the **reasoner** to infer **relationships** between **cell metadata** and **model parameters** to **accelerate and automate their extraction**.



Description: NegativeElectrodeActiveMaterialElectronicConductivity

Equivalent To +

- ElectronicConductivity and (inverse (hasProperty) some (ChemicalSubstance and (inverse (hasActiveMaterial) some NegativeElectrode)))

SubClass Of +

- ElectronicConductivity

⌵ electronic_conductivity — https://w3id.org/emmo/domain/electrochemistry#electrochemistry_24aba6e2_176d_42d0_a86d_f8abb7d492c

Annotations Usage

Annotations: electronic_conductivity

Annotations +

- skos:prefLabel [language: en] electronic_conductivity

Description: electronic_conductivity

Types +

- ElectronicConductivity
- NegativeElectrodeActiveMaterialElectronicConductivity

File

Edit

Selection

View

...

←

→

domain-battery

EXPLORER

parameters (8).json

example_linked_data_battery_cell_metadata.ipynb

battery.jsonld U

json-ld-demo.json X

DOMAIN-BATTERY

> .github

> .venv

> context

> docs

> _static

> assets

> data

> img

> jsonld

> examples

> example_linked...

> example_linked...

> example_load_...

> example_perso...

> pages

> scripts

> .gitignore

> conf.py

> index.rst

> Makefile

C: > Users > simonc > Downloads > json-ld-demo.json > {} @graph

1 {

2 "@context": "https://w3id.org/emmo/domain/battery/context",

3 "@graph": {

4 "@id": "urn:url:demo",

5 "@type": "BatteryCell",

6 "schema:isBasedOn": [

7 {

8 "@id": "https://doi.org/10.1149/1945-7111/ab9050"

9 }

10],

11 "hasProperty": [

12 {

13 "rdfs:label": "number_parallel_electrode_pairs_within_cell",

14 "@type": "NumberOfEntities",

15 "hasNumericalPart": {

16 "@type": "Real",

17 "hasNumericalValue": 1

18 },

19 "hasMeasurementUnit": {

20 "hasSymbolValue": "1".

PROBLEMS

OUTPUT

DEBUG CONSOLE

PORTS

JUPYTER

▼ TERMINAL

ery>

▼ JUPYTER VARIABLES

| Name | Type |
|------|------|
|------|------|

<<

dev*

0 0

Julia env: v1.11

Ln 4, Col 31

Spaces: 4

UTF-8

LF

{ } JSON

CODEGPT

What is the outlook?



SINTEF

What is the outlook

- The battery domain is diverse and complex – spanning a broad base of domain knowledge
- Semantic technology has allowed us to start to bridge the gaps and create a coherent and persistent description of battery resources
- The individual components have been addressed
- We are working to bring this together into an open-source orchestration layer to allow for agents to make complex decisions using information from across the battery domain.



Thank You

SINTEF:

- Eibar Flores
- Sridevi Krishnamurthi
- Jesper Friis
- Francesca L. Blekken
- Casper W. Andersen

DTU:

- Tejs Vegge
- Ivano E. Castelli

EMPA:

- Corsin Battaglia
- Nukorn Plainpan

KIT:

- Christian Punckt

Fraunhofer ISC:

- Simon Stier
- Lukas Gold



BIG-MAP



digibatt



**Funded by
the European Union**



Funded by the European Union. Views and opinions expressed are however those of the author(s) only and do not necessarily reflect those of the European Union or CINEA. Neither the European Union nor the granting authority can be held responsible for them.

Teknologi for et bedre samfunn



SINTEF

Teknologi for et bedre samfunn