

# Advancing Digital Workflows in Materials Science



## The Role of PMDco in Data Integration and Semantic Representation



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Bundesanstalt für Materialforschung und -prüfung (BAM)

The platform for the digitalization of materials

A joint project by:



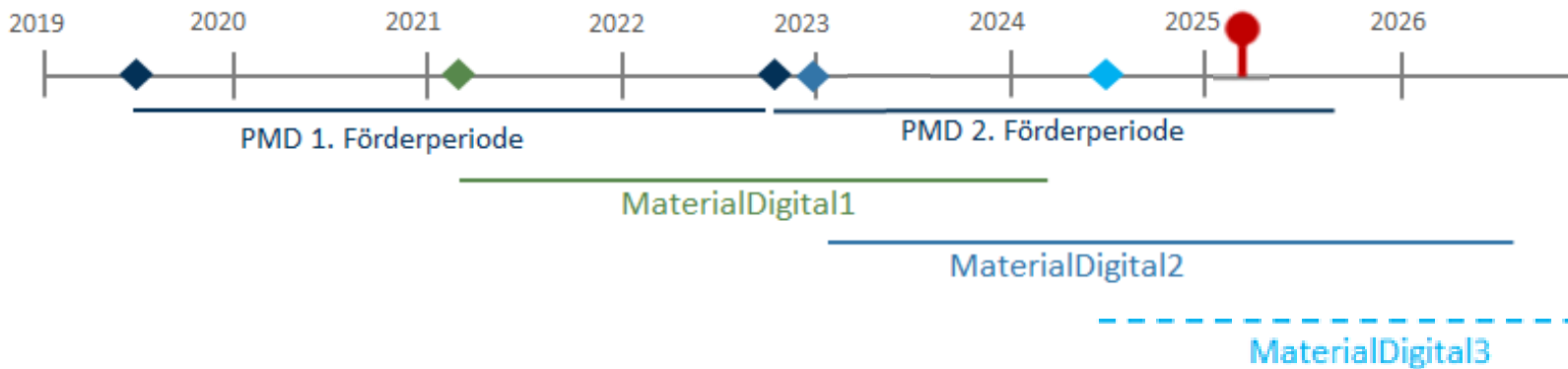
MAX-PLANCK-INSTITUT  
FÜR NACHHALTIGE MATERIALIEN GMBH



PM Core Team + Partner Projects

Partner Projects

- MaterialDigital1: 13 Projects (53 different institutes)
- MaterialDigital2: 10 Projects
- MaterialDigital3: 8 Projects



New Project Call: [Material Neutral](#)

- understand and reuse data across **different contexts and applications** → **shared vocabulary** and meaning for concepts
- standardized formats** allowing seamless data exchange
- Facilitating integration of **heterogeneous data sources** without requiring rigid schemas

## T-Box (*Terminological Box*)

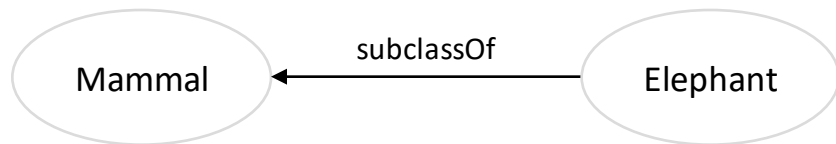


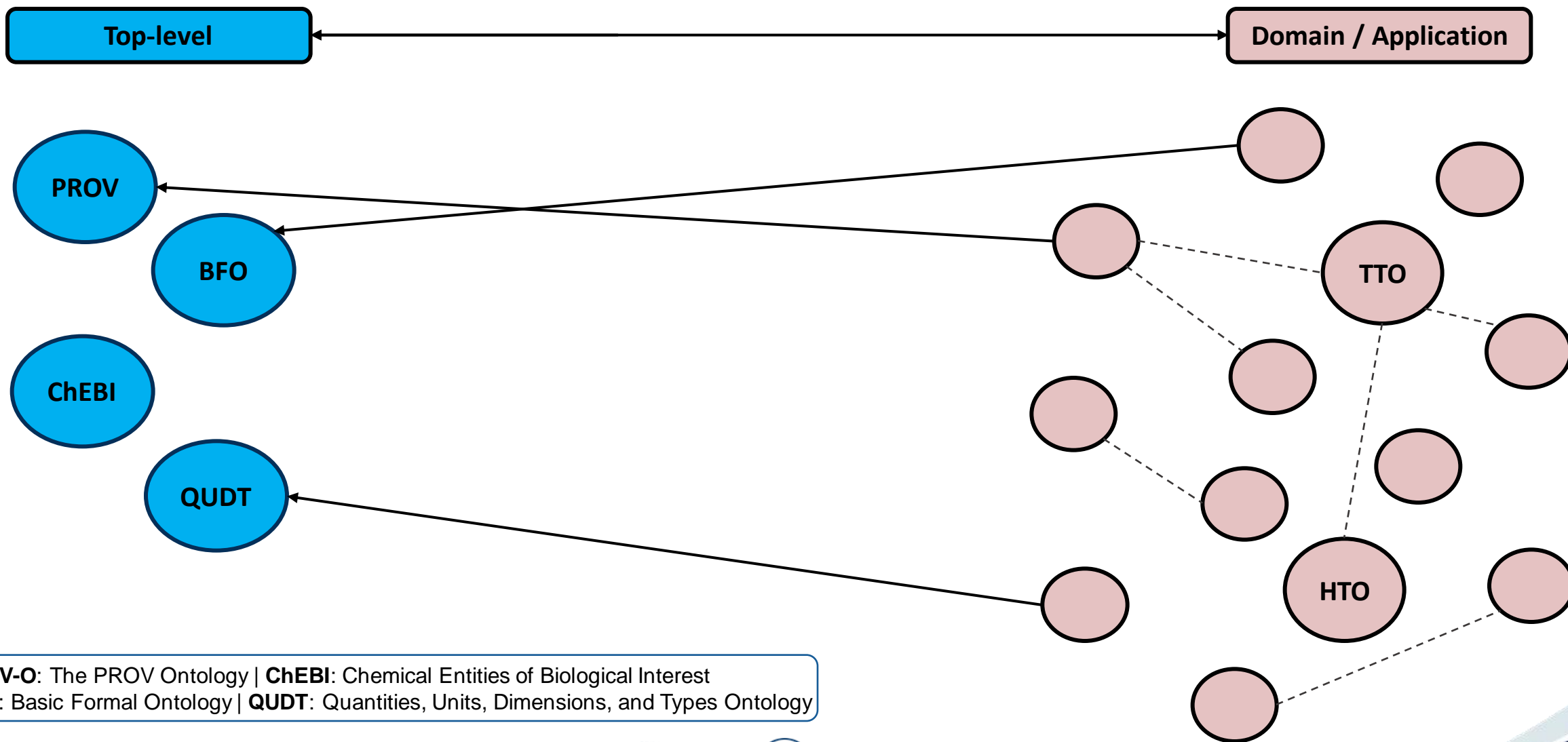
- Knowledge about the **concepts of the domain** or field regarded
- Defines which **classes** of objects exist and their **properties**
- Does not change frequently

## A-Box (*Assertional Box*)

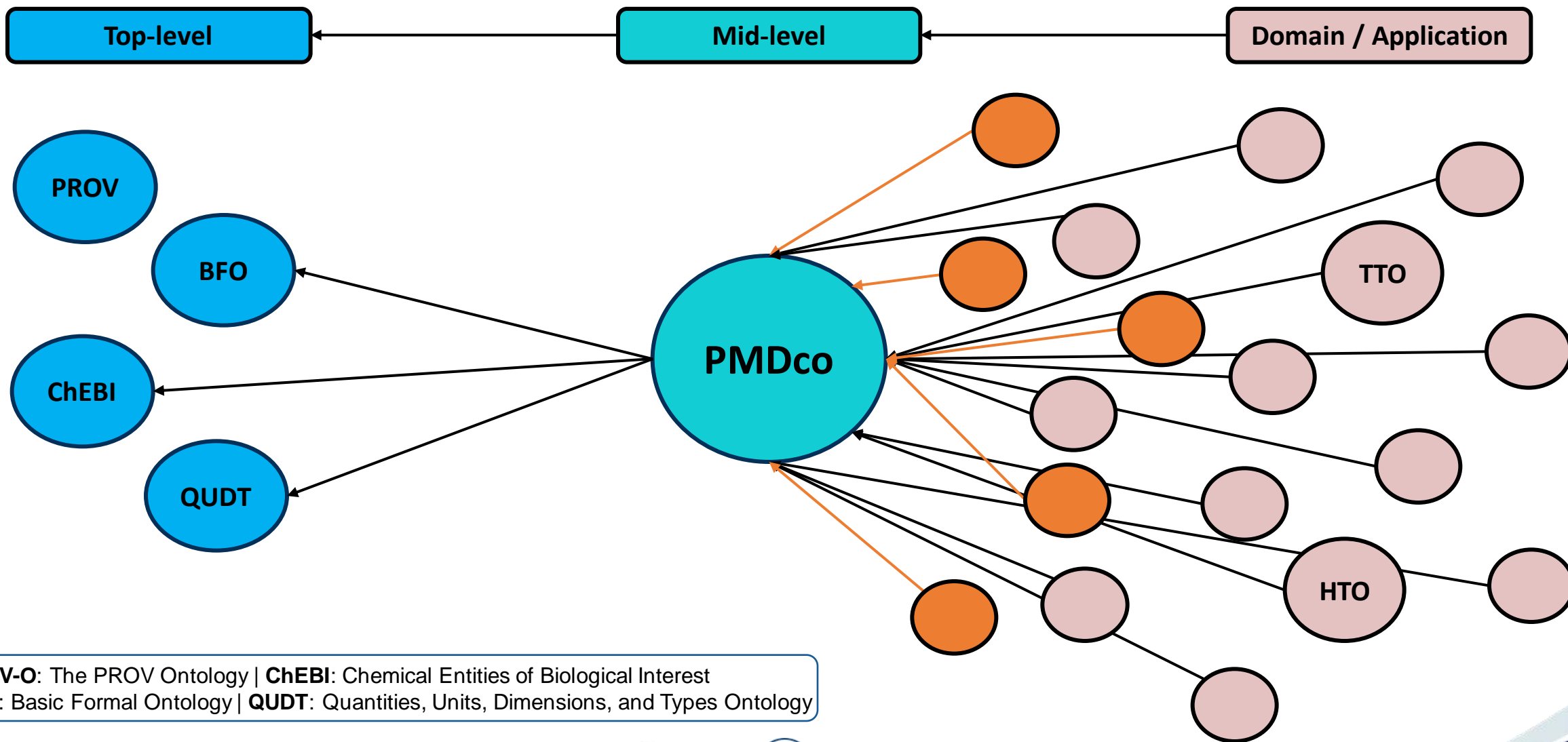


- Knowledge about **specific instances** of a domain
- Facts about individuals and relationships
- Represents the state of the modeled world → **data**
- Subject to frequent or constant changes





**PROV-O:** The PROV Ontology | **ChEBI:** Chemical Entities of Biological Interest  
**BFO:** Basic Formal Ontology | **QUDT:** Quantities, Units, Dimensions, and Types Ontology



# Establish a Semantic Framework for MSE with PMD Core Ontology (PMDco)

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**PMD Core Ontology: Achieving semantic interoperability in materials science**

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ARTICLE INFO

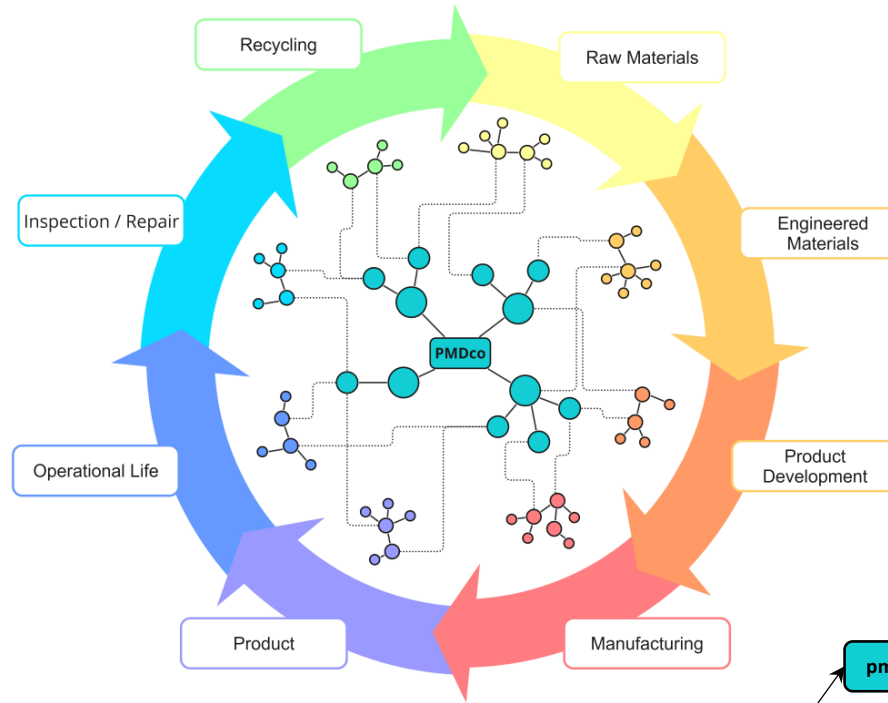
Dataset link <https://github.com/materialdigital/core-ontology>

Keywords: Ontology, Materials science and engineering, Knowledge representation, Reproducibility, Semantic interoperability, Semantic data integration

ABSTRACT

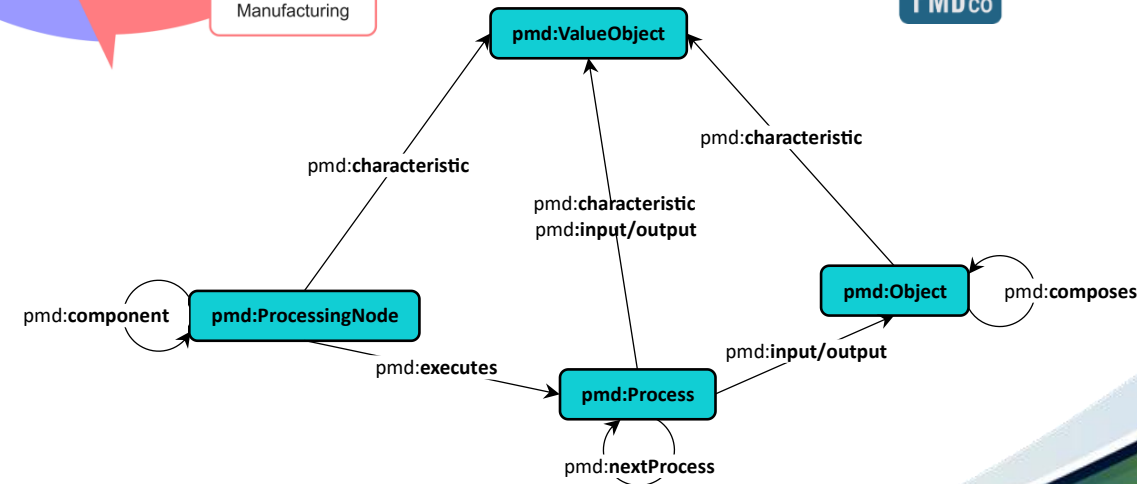
<https://doi.org/10.1016/j.matdes.2023.112603>

Knowledge representation in the Materials Science and Engineering (MSE) domain is a vast and multi-faceted challenge: Overlap, ambiguity, and inconsistency in terminology are common. Invariant (consistent) and variant (context-specific) knowledge are difficult to align cross-domain. Generic top-level semantic terminology often is too abstract, while MSE domain terminology often is too specific. In this paper, an approach how to maintain a comprehensive MSE-centric terminology composing a mid-level ontology—the Platform MaterialDigital Core Ontology (PMDco)—via MSE community-based curation procedures is presented. The illustrated findings show how the PMDco bridges semantic gaps between high-level, MSE-specific, and other science domain semantics. Additionally, it demonstrates how the PMDco lowers development and integration thresholds. Moreover, the research highlights how to fuel it with real-world data sources ranging from manually conducted experiments and simulations with continuously automated industrial applications.

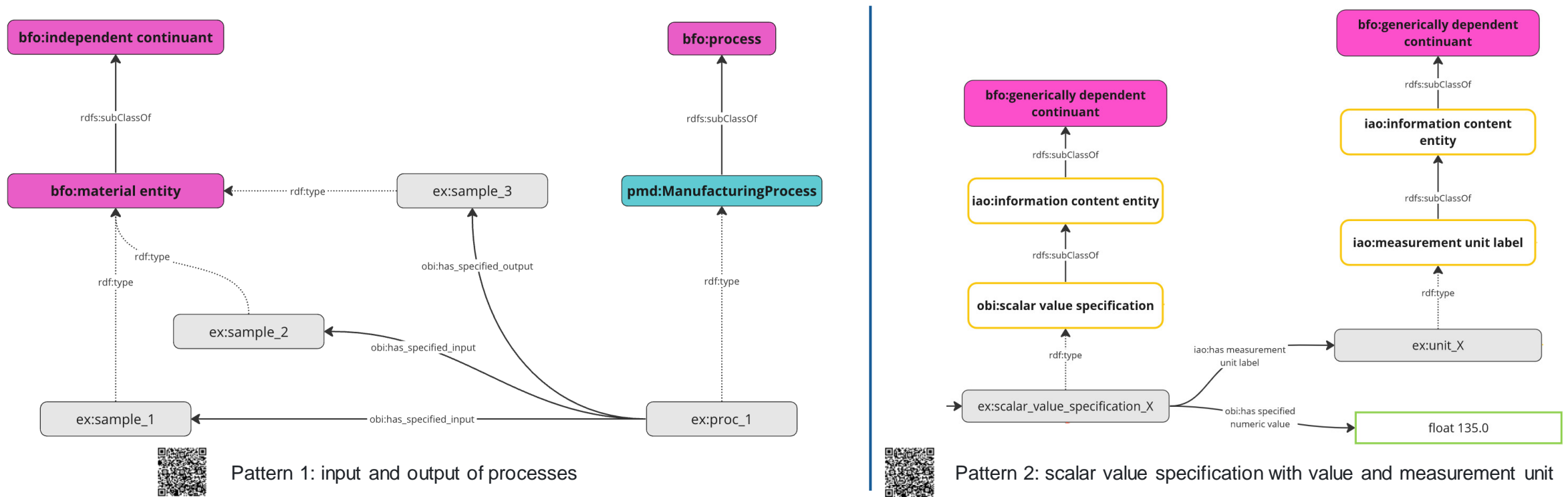


PMDco

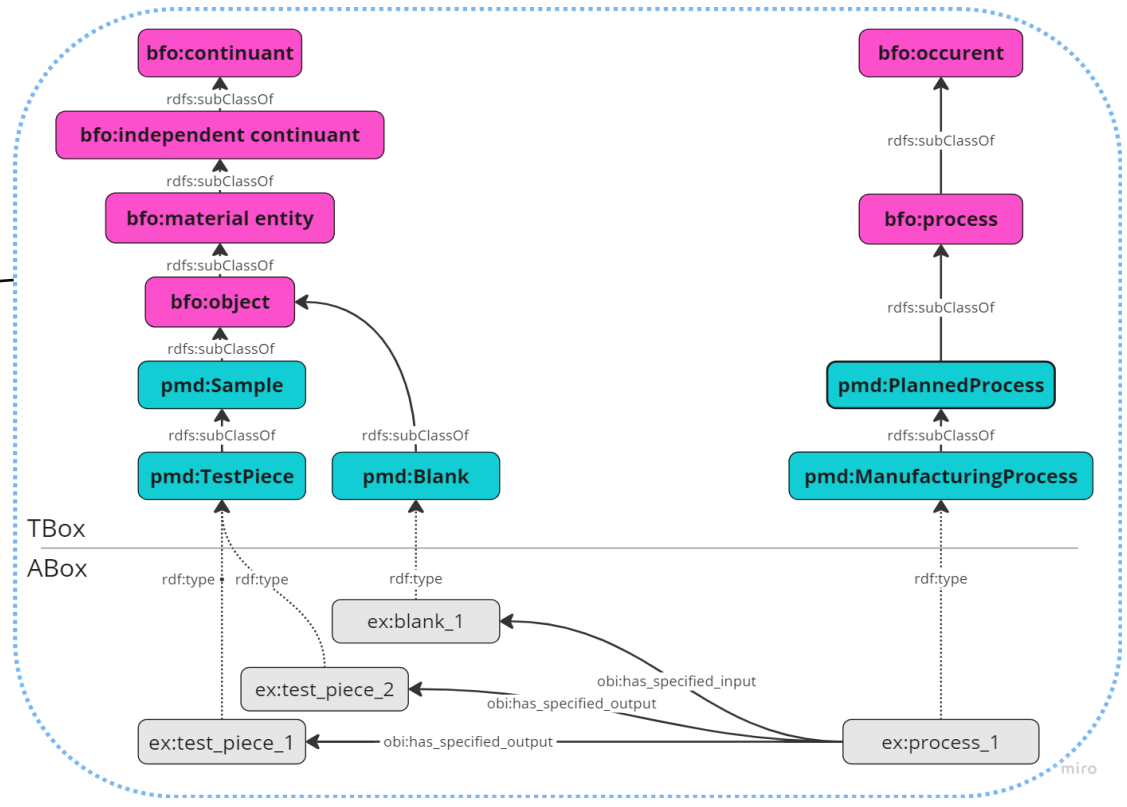
- Make materials and processes data interoperable
- Support FAIR principles and foster reproducibility
- Facilitate traceability of (meta)data throughout value chains
- Bridge semantic gaps in MSE and establish a shared vocabulary



- **Consistency & Reusability:** standardized structures creating uniformity – integrate, extend, and reuse
- **Enhanced Querying & Reasoning:** improve automated reasoning, data linking, and querying efficiency



(multi)colored: T-Box concepts / classes | grey: A-Box instances



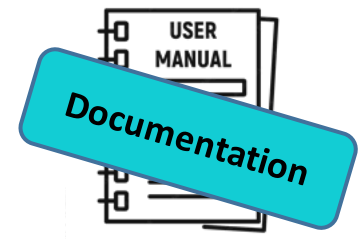
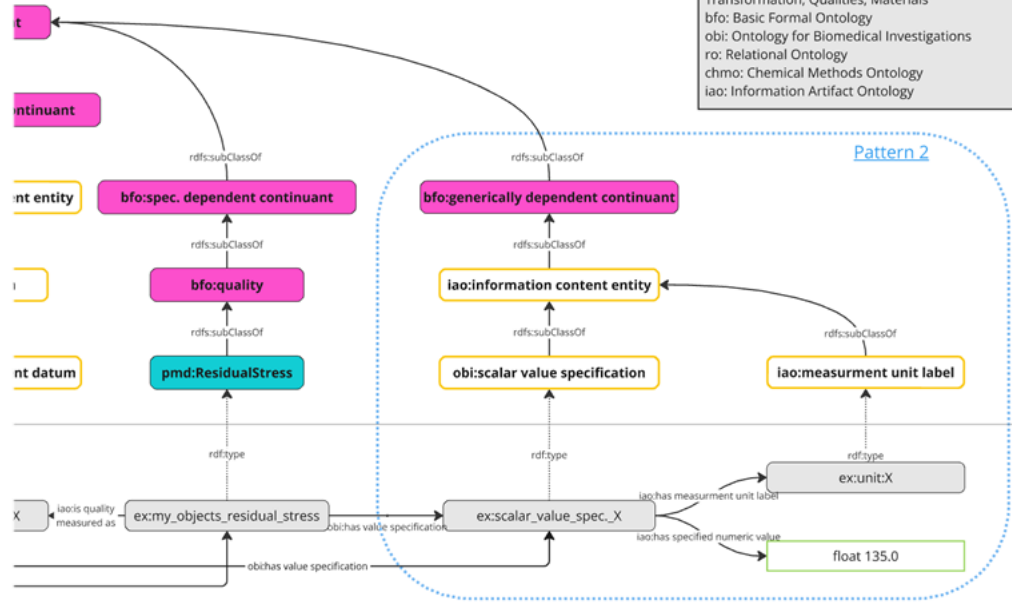
## Guide with essential ontology design patterns

- GitHub repository: Hosts patterns and functional semantic shapes
- SPARQL queries: Shape-specific queries provided



# Systematic and Uniform (Re)Usage via Semantic Graph Patterns

pmd: PMD Modules Material Characterization, Data Transformation, Qualities, Materials  
 bfo: Basic Formal Ontology, Materials  
 obi: Ontology for Biomedical Investigations  
 ro: Relational Ontology  
 chmo: Chemical Methods Ontology  
 iao: Information Artifact Ontology



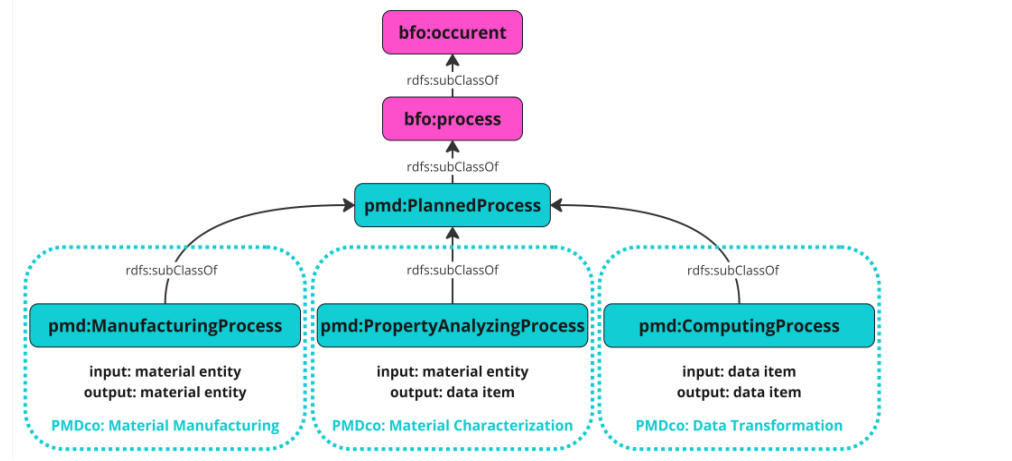
Files

- develop-3.0.0
- documentation
- modules
- patterns
  - README.md
  - pattern1.md
  - pattern1.png
  - pattern2.md
  - pattern2.png
  - pattern3.md
  - pattern3.png
  - pattern5.md
  - pattern5.png
  - pattern6.md
  - pattern6.png
- shapes
- ghignore
- README.md
- catalog-v001.xml
- pmd-core.ttl

```

Pattern 2: scalar value specification with value and unit

Purpose
Description
Visualization
Shapes and example data
            
```



## Bi-weekly public sessions

Fridays, 1-2 pm

## Audience

- Ontology practitioners & MSE domain experts
- Interested parties

## Key activities

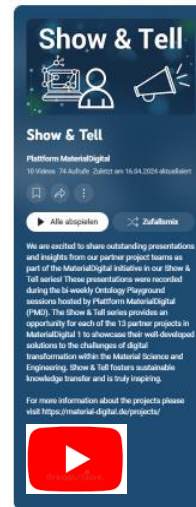
- Knowledge transfer
- Experience exchange
- Modeling challenges – User insights
- Collaborative PMDco enhancement

## MS Teams Meeting

- Easy Access
- No Obligation



Ontology Playground Information List



1	Show & Tell	KupferDigital_Miriam Eisenbart, Thomas Hanke & Gordian Dzwis Show & Tell	Platform MaterialDigital - 30. Auflage - vor 4 Monaten
2	Show & Tell	SmaDi_Mena Leemhuis & Özgür Özcep Show & Tell	Platform MaterialDigital - 13. Auflage - vor 5 Monaten
3	Show & Tell	LeBeDigital_Melissa Telong & Stephan Pirakawetz	Platform MaterialDigital - 72. Auflage - vor 5 Monaten
4	Show & Tell	DigiBatMat_Vincent Nebel & Marcel Mutz Show & Tell 2023.10.13	Platform MaterialDigital - 61. Auflage - vor 7 Monaten
5	Show & Tell	DiProMag_Basil Eil & Moritz Blum Show & Tell 2023.12.08	Platform MaterialDigital - 10. Auflage - vor 8 Monaten
6	Show & Tell	DIGITRUBBER_Lars Vogt & Akhlesh Vyas Show & Tell 2023.11.24	Platform MaterialDigital - 25. Auflage - vor 8 Monaten
7	Show & Tell	SensioTwin_Ursula Pflüger Show & Tell 2023.11.10	Platform MaterialDigital - 43. Auflage - vor 8 Monaten
8	Show & Tell	GlasDigital_Ya-Fan Chen Show & Tell 2023.10.27	Platform MaterialDigital - 42. Auflage - vor 9 Monaten
9	Show & Tell	iBain_Akhill Thomas Show & Tell 2023.09.29	Platform MaterialDigital - 38. Auflage - vor 10 Monaten



B. Bayerlein, PMD General Assembly @ BAM, 09/18/2024, Berlin, Germany

Digital  
Discovery



Leibniz-Institut für  
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## Natural Language Processing-Driven Microscopy Ontology Development<sup>†</sup>

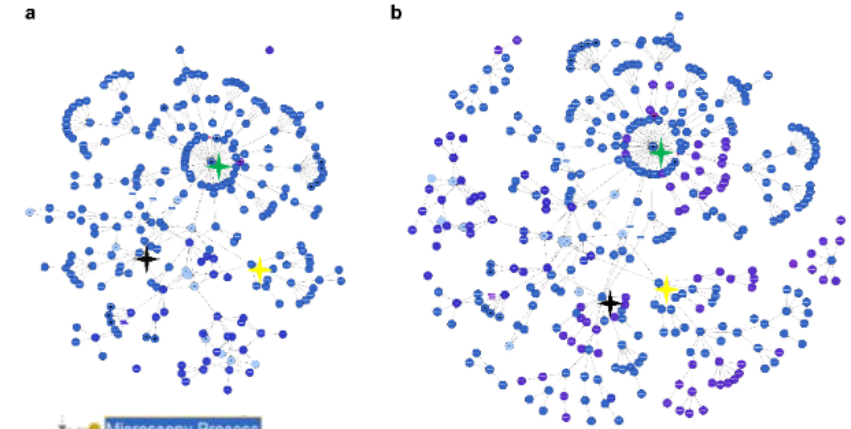
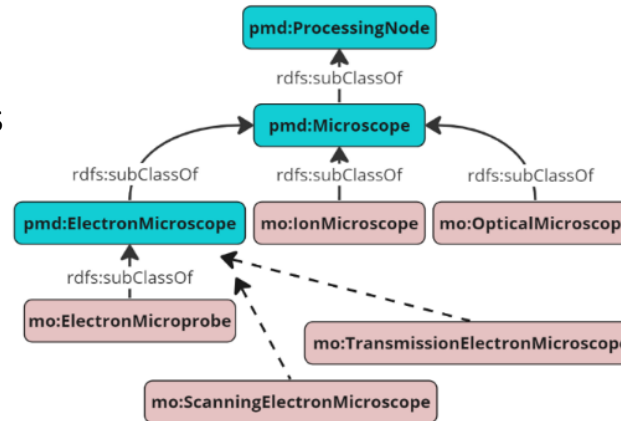
Bernd Bayerlein<sup>a,c</sup>, Markus Schilling<sup>a</sup>, Maurice Curran<sup>b</sup>, Carelyn E. Campbell<sup>c</sup>, Alden A. Dima<sup>a</sup>, Henk Birkholz<sup>d</sup>, and June W. Lau<sup>c</sup>

Received Date  
Accepted Date

DOI:00.0000/xxxxxxxx

This manuscript describes the accelerated development of an ontology for microscopy in materials science and engineering, leveraging natural language processing (NLP) techniques. Drawing from a comprehensive corpus comprising over 14k contributions to the Microscopy and Microanalysis conference series, we employed two neural network-based algorithms for NLP. The goal was to semi-automatically create the Microscopy Ontology (MO) that encapsulates and interconnects the terminology most frequently used by the community. The MO, characterized by its interlinked entities and relationships, is designed to enhance the quality of user query results within NexusLIMS. This enhancement is facilitated through the concurrent querying of related terms and the seamless integration of logical connections.

- NLP-approach based on huge text corpus of Microscopy & Microanalysis Conference Proceedings
- Extracted key terms used by community categorized according to PMDco structure
- Results in Microscopy Ontology with ~150 new classes and ~60 abbreviations



**RESEARCH ARTICLE**

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ENGINEERING  
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## Seamless Science: Lifting Experimental Mechanical Testing Lab Data to an Interoperable Semantic Representation

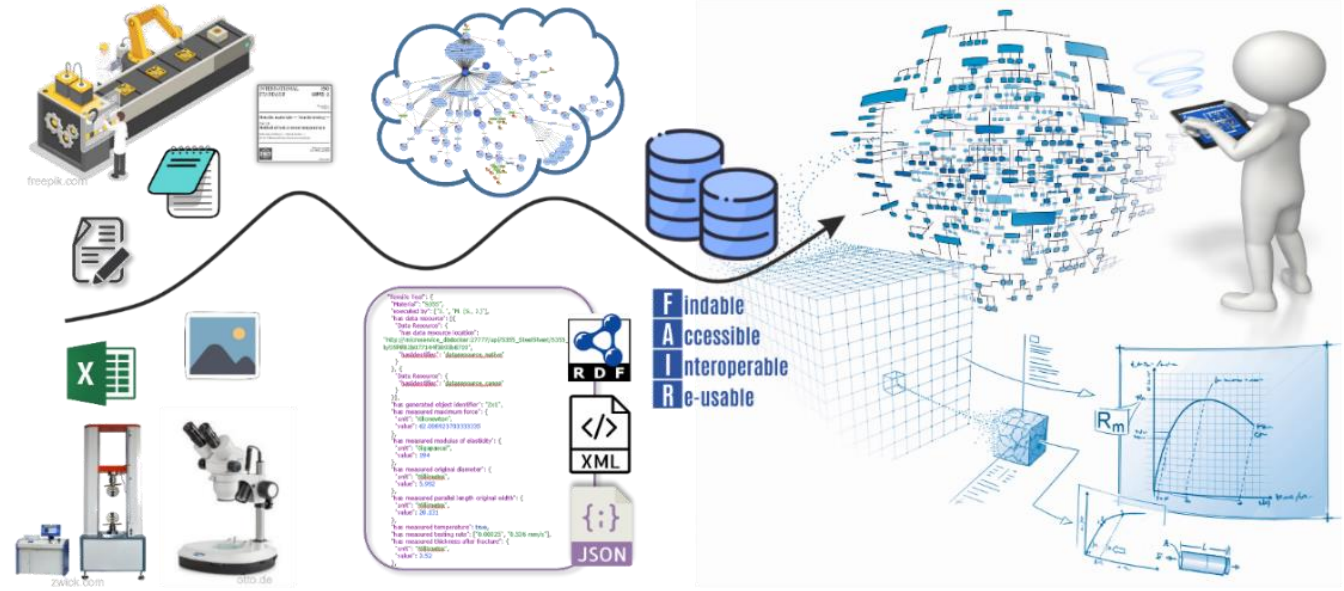
Markus Schilling,\* Sebastian Bruns, Bernd Bayerlein, Jehona Kryeziu, Jörg Schaarschmidt, Jörg Waitelonis, Pedro Dolabella Portella, and Karsten Durst

The scientific landscape is undergoing rapid transformations with the advent of the digital age which revolutionizes research methodologies. In materials science and engineering, an adoption of modern data management techniques is desirable to maximize the efficiency and accessibility of research efforts. Traditional practices in testing laboratories are usually inadequate for efficient data acquisition and utilization as they lead to local storage and difficulty in publication and correlation with other results. Electronic laboratory notebooks (ELNs) are promising prospects in this respect. Semantic concepts and ontologies enhance interoperability by standardizing experimental data representation. An in-laboratory pipeline seamlessly integrating an ELN with transformation scripts to convert experimental into interoperable data in a machine-actionable format is created in this study as a proof of concept. Tensile test results and the corresponding tensile test ontology are used exemplary. Linking ELN data to semantic concepts enriches the stored information while improving interpretability and reusability. Involving undergraduate students builds a bridge between theory and practice during their training and promotes their digital skills. This study underscores the potential of ELNs and knowledge representations as beneficial means toward improved data management practices that enhance collaborative research and education while ensuring compatibility with evolving standards and technologies.

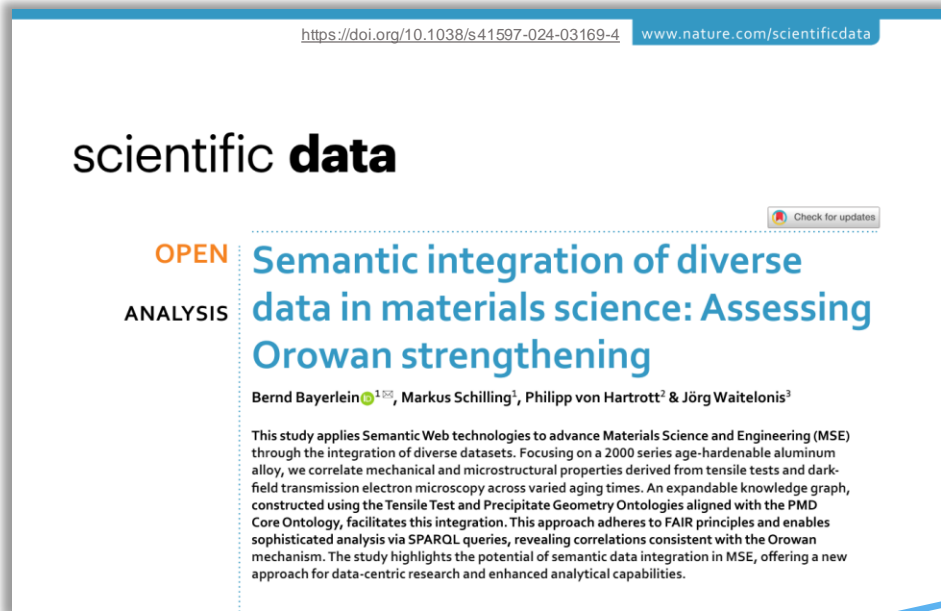
### 1. Introduction

The advent of the digital age has precipitated an unprecedented wave of innovation which led to transformative changes in scientific research across various disciplines and industries.<sup>[1–3]</sup> The prospect of developments of cutting-edge technologies enabled by data-driven methodologies and advanced computational tools resulted in a paradigm shift in the way data, information, and knowledge are created, understood, and analyzed.<sup>[4–6]</sup> This paradigm shift is highly pronounced in the field of materials science and engineering (MSE) in which the integration of digital technologies is about to revolutionize the research landscape. In this new era, characterized by the fusion of material sciences with computational prowess, the multifaceted implications of digitalization on the development and understanding of materials have to be explored and used. The convergence of computational tools, machine learning algorithms, and high-performance computing unlocks novel avenues for investigating materials. Traditional experimental

approaches are however still invaluable but complemented and extended by virtual experimentation and simulations. This integration not only expedites the design and discovery of materials with tailored properties but also provides an intricate



- Used by students during internship at TU Darmstadt
- Data acquisition pipeline supported by ontological framework
- Script-based automatic RDF transformation
- Growing graph over years with varying parameters



**PMD Core Ontology**  
MSE mid-level

**TTO**  
application ontology

**PGO**  
application ontology

**Zenodo**  
open data repository

**Tensile Test Data**  
mechanical properties

**DF-TEM Image Data**  
structural properties

**Jupyter Notebook**  
web app for computing

**RDF Graphs Creation**  
for TTO and PGO

**Data Instantiation**  
adding triples to graphs

**Graphs Serialization**  
for TTO and PGO

**Triple Store**  
feed and query for data

Ontology and RDF Data Management

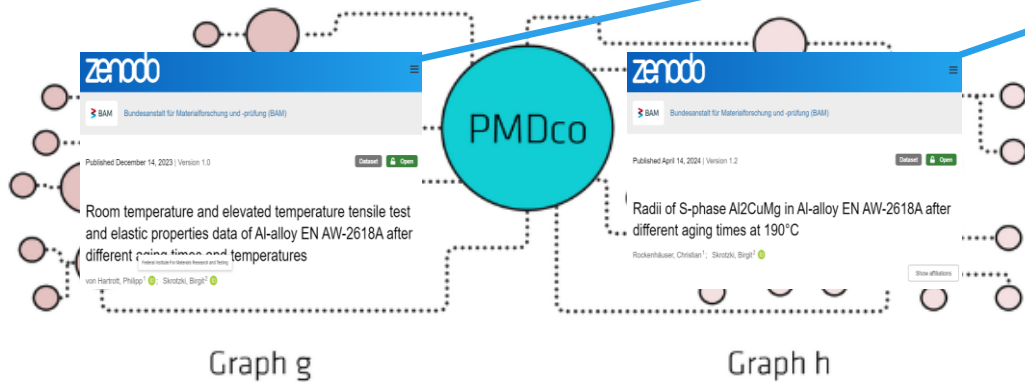
- uses **rdflib** (RDF handling)
- uses **owlready2** (ontology processing)
- uses **SPARQLWrapper** (query execution)

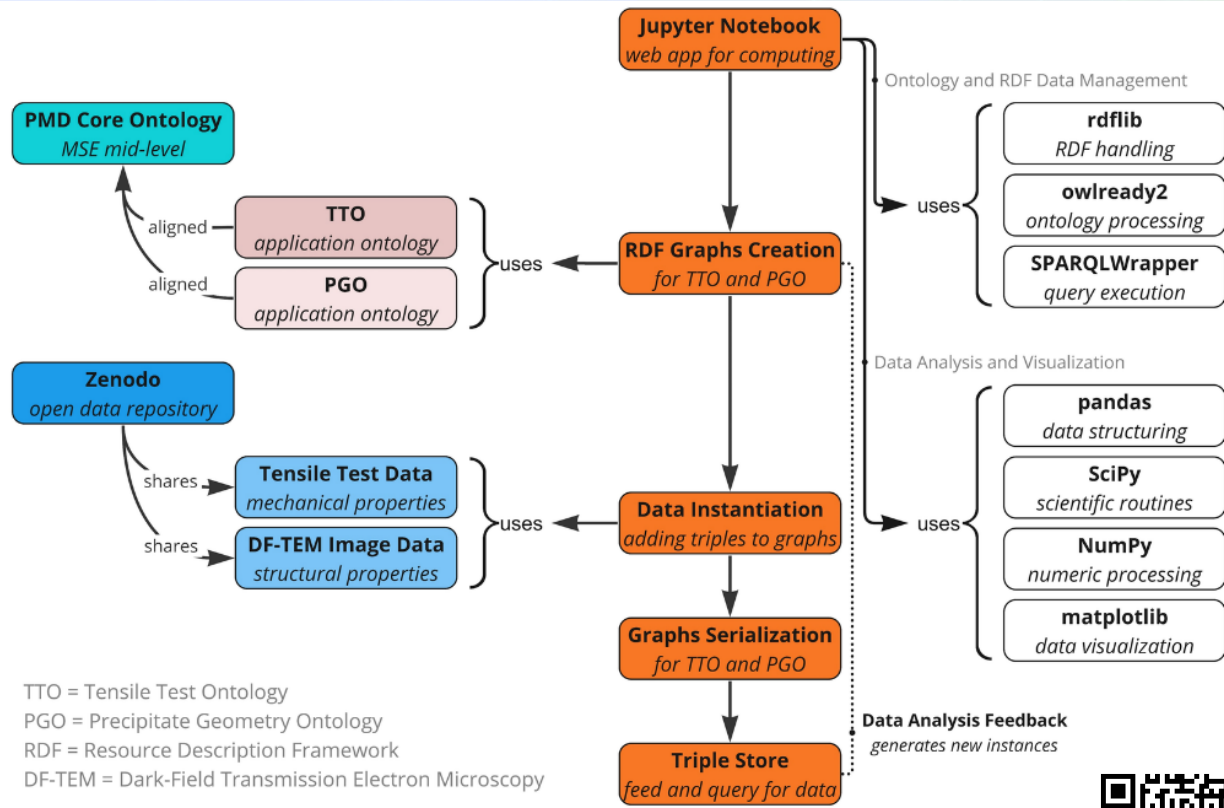
Data Analysis and Visualization

- uses **pandas** (data structuring)
- uses **SciPy** (scientific routines)
- uses **NumPy** (numeric processing)
- uses **matplotlib** (data visualization)

Data Analysis Feedback  
generates new instances

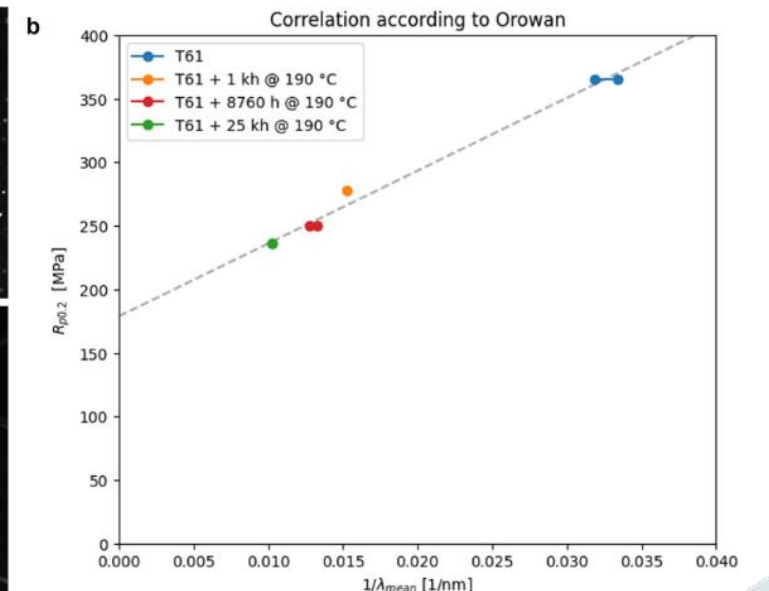
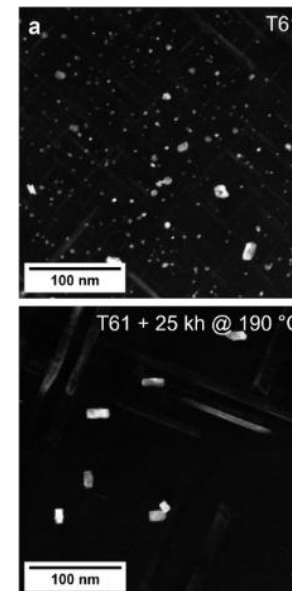
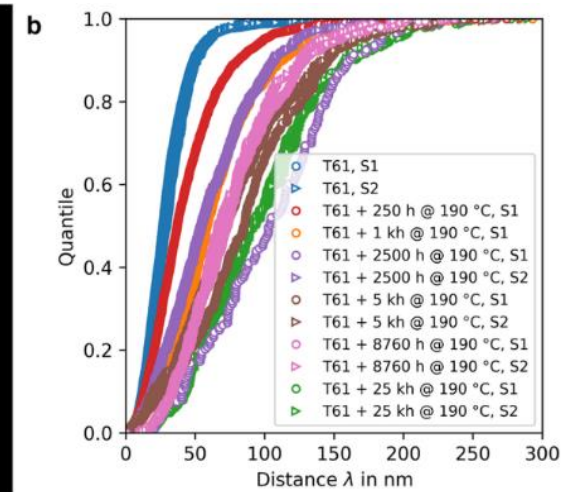
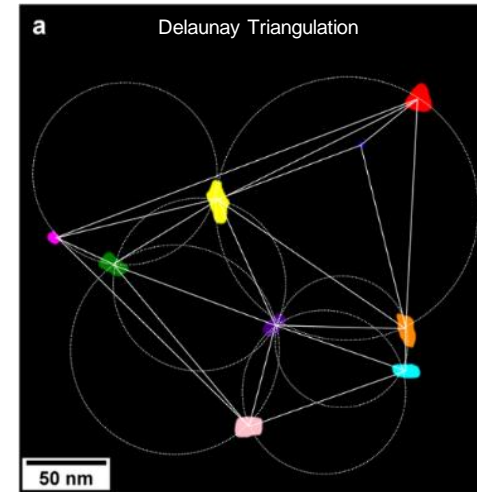
TTO = Tensile Test Ontology  
PGO = Precipitate Geometry Ontology  
RDF = Resource Description Framework  
DF-TEM = Dark-Field Transmission Electron Microscopy





TTO = Tensile Test Ontology  
 PGO = Precipitate Geometry Ontology  
 RDF = Resource Description Framework  
 DF-TEM = Dark-Field Transmission Electron Microscopy

- Semantic data integration from diverse data sources
- Demonstrate knowledge graph operations
- Proof of concept for semantic interoperability
- Prototypical representation of MSE knowledge in RDF/OWL



## PMD Project Team



Leibniz-Institut für  
Werkstofforientierte  
Technologien



## Contact and join us!

[info@material-digital.de](mailto:info@material-digital.de)



PMD Core Ontology (PMDco)

