# Informatics Infrastructure for Data-Driven Materials Research at NIST

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Shared Metadata and Data Formats for Big-Data Driven Materials Science Erwin-Schrödinger-Zentrum, Berlin Monday July 8, 2019



### NIST Disclaimer

Certain commercial equipment, instruments, materials, or software are identified in this talk to foster understanding. Such identification does not imply recommendation or endorsement by NIST, nor does it imply that the materials, equipment, or software identified are necessarily the best available for the purpose.

## Acknowledgments

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- Others: Kathy Sharpless, Nicholas Ritchie, Gerhard Goldbeck, Larry Lannom, Giridhar Manepali

Research Data Alliance, Project FREYA



### Office of Data and Informatics

#### Standard Reference Data

- Distribution
- Sales
- Infrastructure
- Usage analysis and impact
- Improve web sites and user interfaces
- Provide APIs

#### Research Data

- Improve data management practices
- Data management planning tools
- Laboratory automation
- Electronic Lab
   Notebooks
- NIST open data repository
- NIST data portal

#### Data Science

- Informatics and analytics resource
- Big data
- HPC and Cloud computing

#### Community

- National Data Services Consortium
- Research Data Alliance
- Other US federal agencies (NIH, DOE, NSF)
- CENDI
- National Metrology Institutes (NMIs)
- BIPM (Paris)
- CODATA, WDS



Robert Hanisch

Director, Office of Data and Informatics



## Research Data Management at NIST

### Discover



- Standard Reference Data
- Materials Data Repository
- Materials Data Facility
- Persistent identifiers (DOIs, handles)
- Materials Resource Registry (data, code)
- International Metrology Resource Registry
- NIST Enterprise Data Inventory
- data.gov
- NIST Public Data Repository and Search Portal



Access

### Interoperate

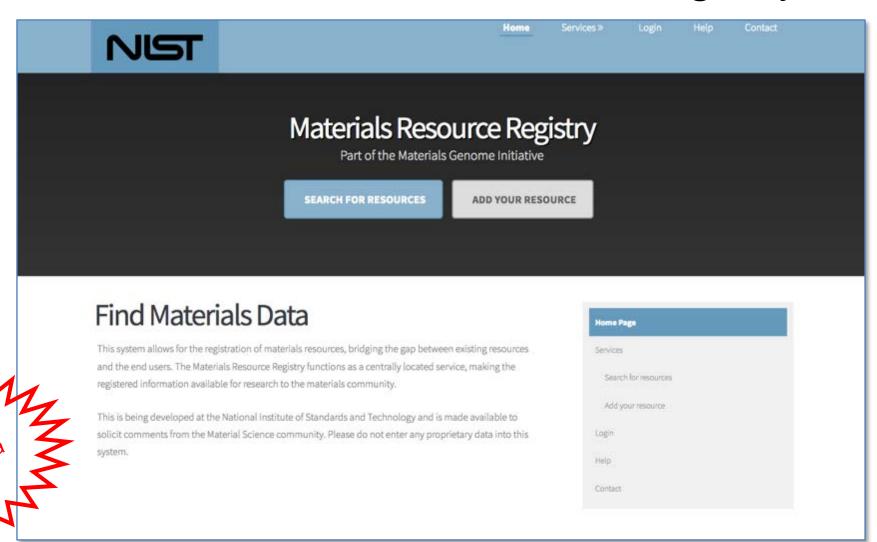
- Materials Data Curator
- Data type registry
- Schema repository
- Lab info management systems







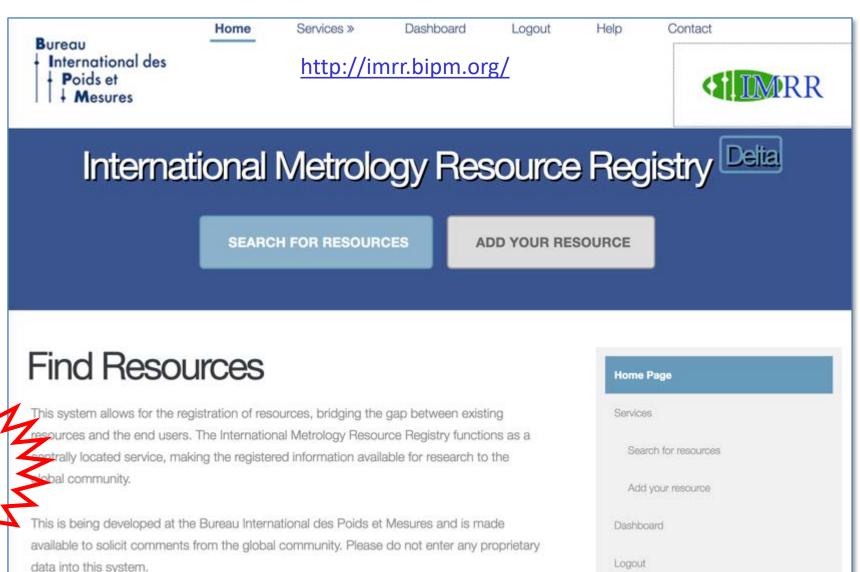
## NIST Materials Resource Registry

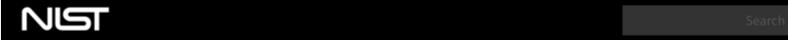


https://materials.registry.nist.gov/



## International Metrology Resource Registry





#### PHYSICAL MEASUREMENT LABORATORY

About PML \* Atomic Spectra Database

Divisions +

Products/Services + f 8+ y

News/Multimedia

Programs/Projects Version 5

Facilities + Version History & Citation Information | Disclaimer

**GROUND STATES &** 

**Email Newsletter**Welcome to the NIST Atomic Spectra Database, NIST Standard Reference Database #78. The spectroscopic data may be selected and displayed according to wavelengths or energy levels by choosing one of the following options:

Spectral lines and associated energy levels displayed in wavelength order with all selected spectra intermixed or in multiplet order. Transition probabilities for the lines are also displayed where available.

**■ NIST MENU** 

Energy levels of a particular atom or ion displayed in order of energy above the ground state.

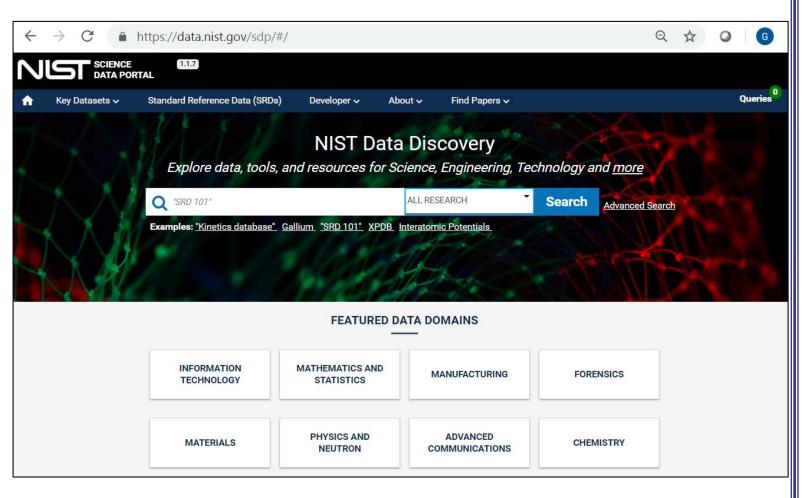
IONIZATION ENERGIES Ground states and ionization energies of atoms and atomic ions.



## Discover NIST Data at data.nist.gov

Web portal Discovery Tool for NIST public data

- Search All NIST inventory of public datasets
- Access to the NIST
   Public Data Repository
- Navigation to Data
   Publications, Custom
   Repositories

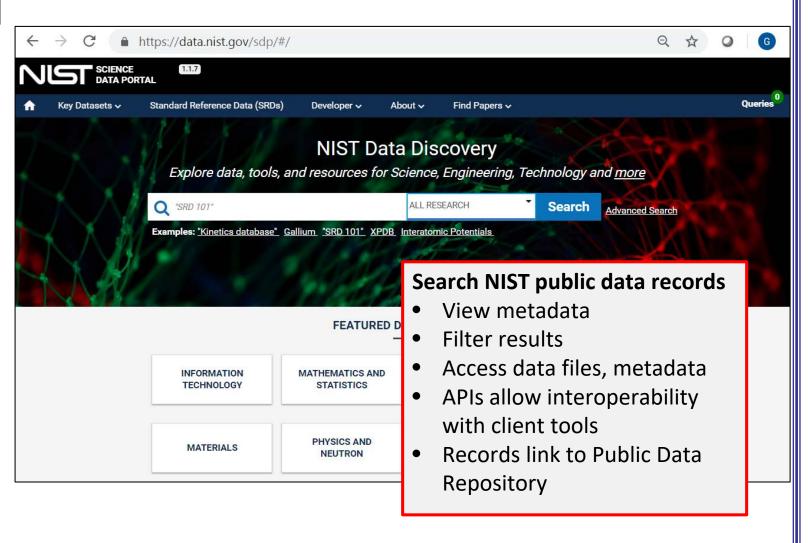




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### Enterprise Data Inventory

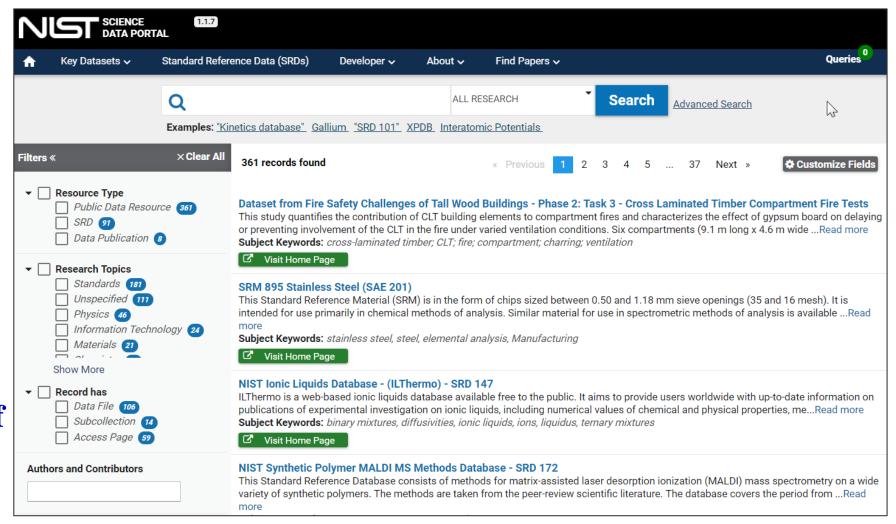
Enhanced for Discoverability

Faceted Filters for Research Topic

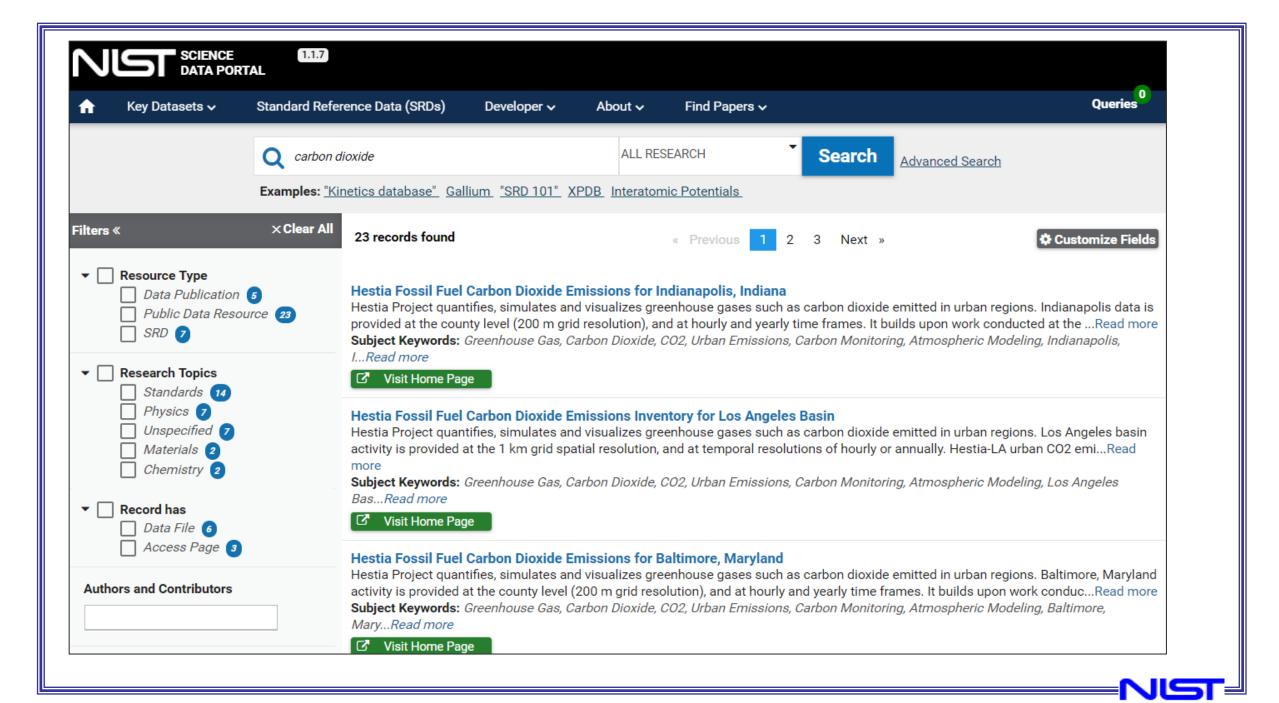
Based on the NIST Taxonomy

New Data Publications via MIDAS

• "Management of Institutional Data Assets"









#### Metadata and Vocabulary Standards for NIST Data

This page provides pointers to the various metadata and vocabulary standards used to serve and manage NIST data as part of NIST's open data initiative (Open Access to Research).

#### **Table of Contents**

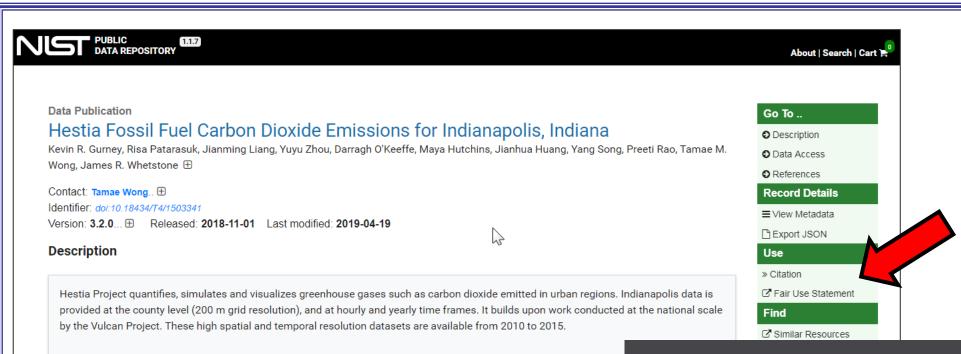
- NIST Extensible Resource Data Model (NERDm)
- Project Open Data (POD)

#### NIST Extensible Resource Data Model (NERDm)

The NIST Extensible Resource Data Model (NERDm) refers to the <u>JSON-LD</u>-formatted metadata schema used by the NIST Public Data Repository (PDR) and Science Data Portal internally to describe data resources available from NIST. It is defined using <u>JSON Schema</u>.

#### Resources

- A Reader's Guide to NERDm Metadata
- JSON Schema definition files:
  - NERDm Core (latest): nerdm-schema-0.2.json (v0.1)
  - Extension: Publications (latest): nerdm-schema-0.2.json (v0.1)
- JSON-LD context files:
  - nerdm-schema-context.jsonld



**Subject Keywords:** Greenhouse Gas, Carbon Dioxide, CO2, Urban Emissions, Carbon Monitoring, Atmospheric Modeling, Indianapolis, I Bottom-up Inventory

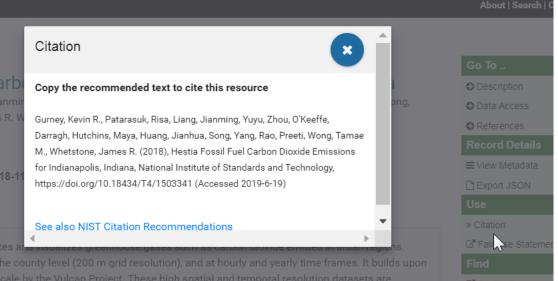
#### Data Access

These data are public.



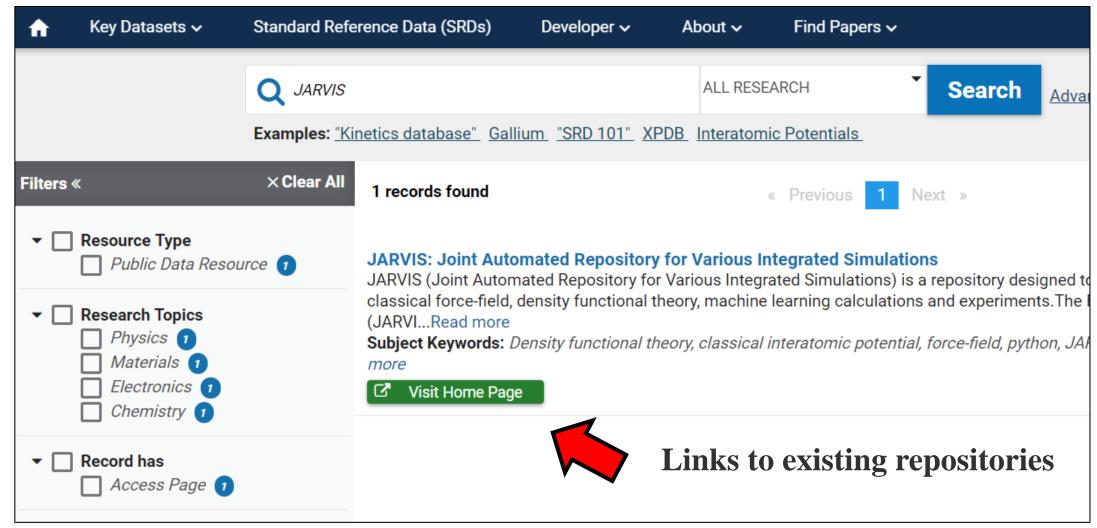
Click on the file/row in the table below to view more details.

| O Name   |                      | ⇔ Size   |
|--|----------------------|----------|
| 200m.lndy.v3_2.total.annual.local.2010.nc        | application/x-netcdf | 215.1 kB |
| 200m.lndy.v3_2.total.annual.local.2010.nc.sha256 | text/plain           | 64 Bytes |
| 200m Indv v3 2 total annual local 2011 nc        | application/x-netcdf | 215 1 kB |





## Example Search: "JARVIS"





Public Data Resource

#### JARVIS: Joint Automated Repository for Various Integrated Simulations

Contact: Kamal Choudhary.. ⊞ Identifier: doi:10.18434/M3HQ1W Last modified: 2017-10-18

#### Description

JARVIS (Joint Automated Repository for Various Integrated Simulations) is a repository designed to automate materials discovery using classical force-field, density functional theory, machin calculations and experiments. The Force-field section of JARVIS (JARVIS-FF) consists of thousands of automated LAMMPS based force-field calculations on DFT geometries. Some of the process included in JARVIS-FF are energetics, elastic constants, surface energies, defect formations energies and phonon frequencies of materials. The Density functional theory section of JARVIS (JARVIS-DFT) consists of thousands of VASP based calculations for 3D-bulk, single layer (2D), nanowire (1D) and molecular (0D) systems. Most of the calculations are carried out with optB88vDW function of JARVIS-DFT includes materials data such as: energetics, diffraction pattern, radial distribution function, band-structure, density of states, carrier effective mass, temperature and carrier concentration ependent thermoelectric properties, elastic constants and gamma-point phonons. The Machine-learning section of JARVIS (JARVIS-ML) consists of machine learning prediction tools, trained on JAF DFT data. Some of the ML-predictions focus on energetics, heat of formation, GGA/METAGGA bandgaps, bulk and shear modulus.

Research Topics: Physics: Condensed matter, Materials: Modeling and computational material science, Electronics: Thin-film electronics: Optoelectronics, Chemistry: Molecular characterization, istry: Theoretical chemistry and modeling, Chemistry: Chemical thermodynamics and chemical properties, Electronics: Semiconductors, Materials: Materials characterization, Physics: Optical physics

Subject Keywords: Density functional theory, classical interatomic potential, force-field, python, JARVIS, MGI, MDCS, RESTAPI, automation

#### **Data Access**

♠ These data are public. For more information, please visit the home page.
Data is available via the following locations:

✓ JARVIS for DFT

☑ JARVIS for Force-fields

#### References

This data is referenced in :

- https://www.nature.com/articles/sdata2016125
- https://www.nature.com/articles/s41598-017-05402-0



### Customized Links to existing repositories



Links to Scholarly Publications auto-generated



Description

Data Access

References

Record De

■ View Metad

Export JSC

Use

✓ Visit Home Page

» Citation

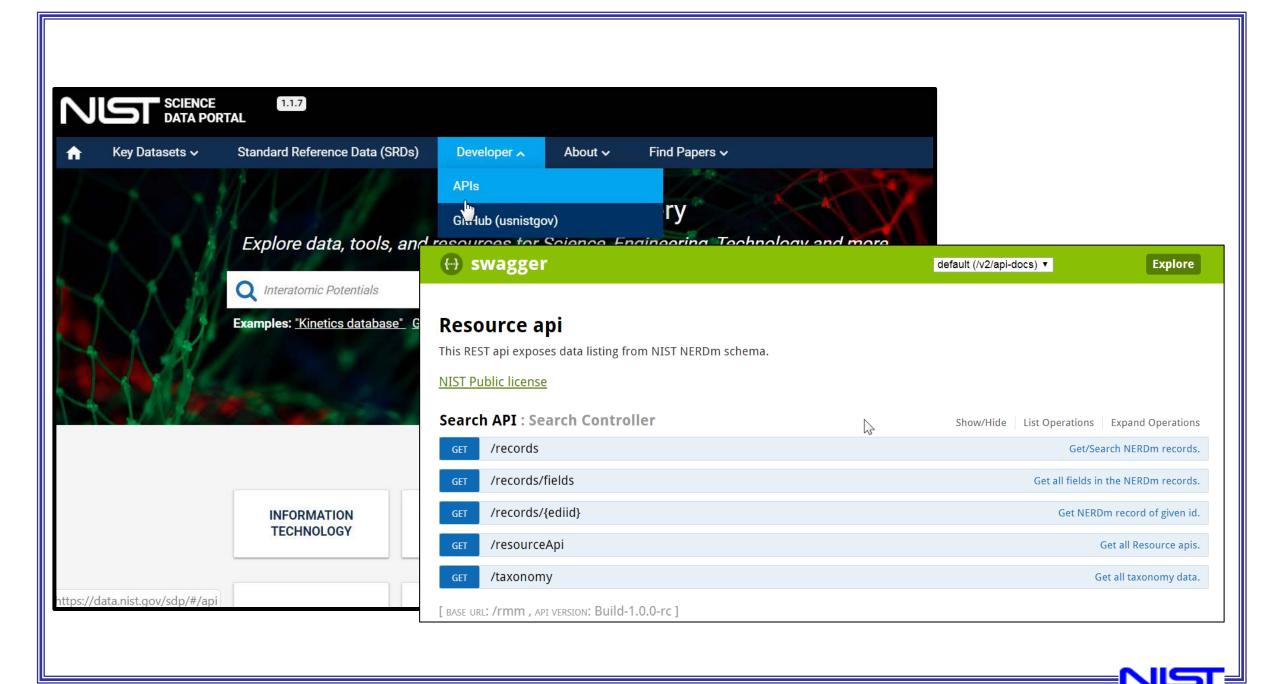
☑ Fair Use St

Find

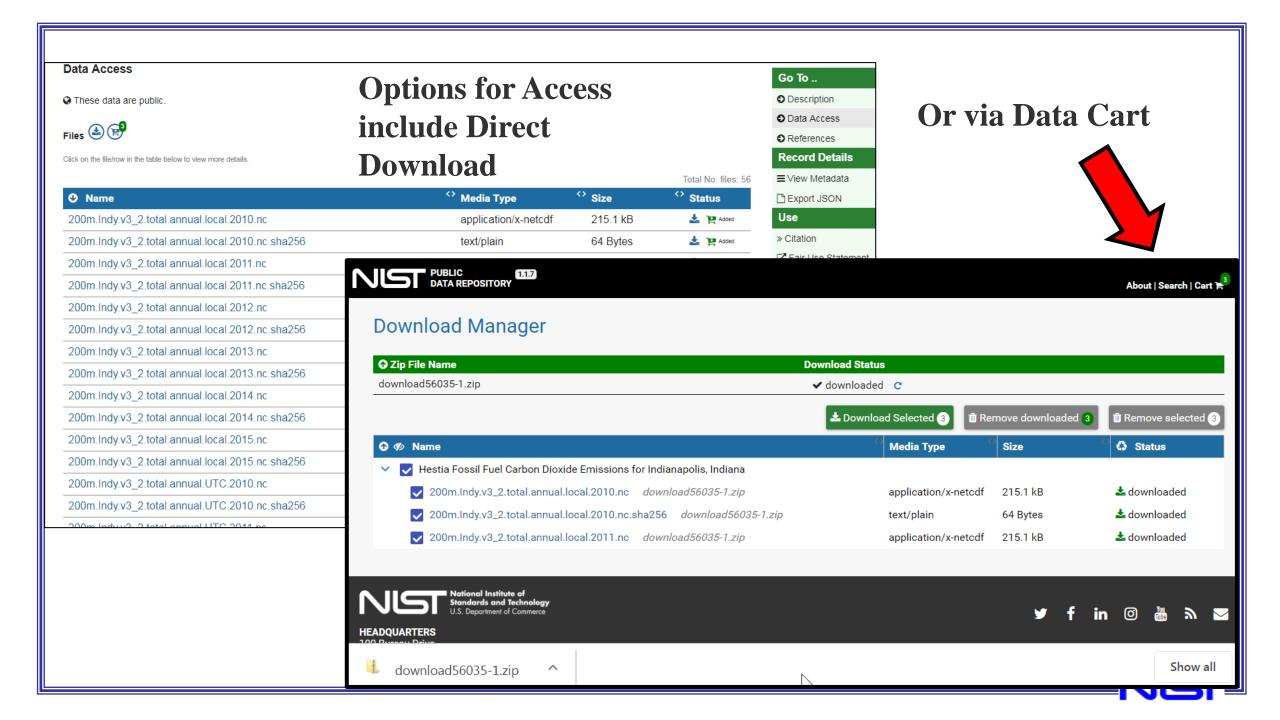
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☑ Resources



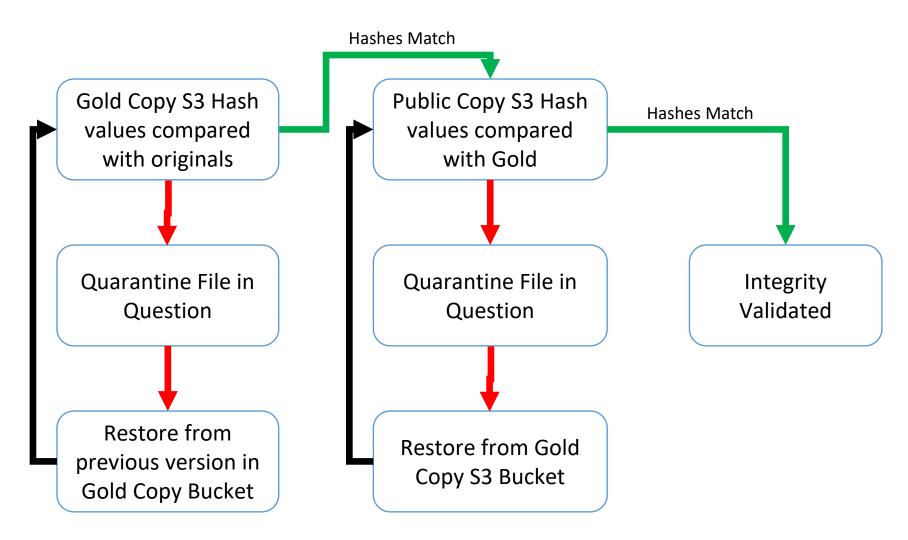






### NIST Public Data Access Policy SRD data.gov value Reference Data public investment data Resource Data and richness **Published Results** Impact **Publishable Results** storage, **Derived Data** sharing, and collaboration **Working Data**

## **Data Integrity**



- Integrity checked once per day
- Files are quarantined and reverted back to the previous version if an issue is detected

### Future Enhancements Planned

- Metrics for the NIST Public Data patterns of use
  - "Data as a First-Class Research Output" (https://makedatacount.org/)
  - Researchers can see how many Page Views or Downloads their data
- Enhance machine readability of datasets for Al
- Public software & analysis tool linked integration
- Large-scale datasets they already exist as a challenge!
  - Evaluating Globus (community demonstrated with archive systems for public access)
- Search auto suggest enhance with Data Driven index
  - E.g. natural language processing of the metadata (e.g. rules-based ontology)



## Interoperability & Reusability

## Part of a Larger Interoperability Problem

more

abstract

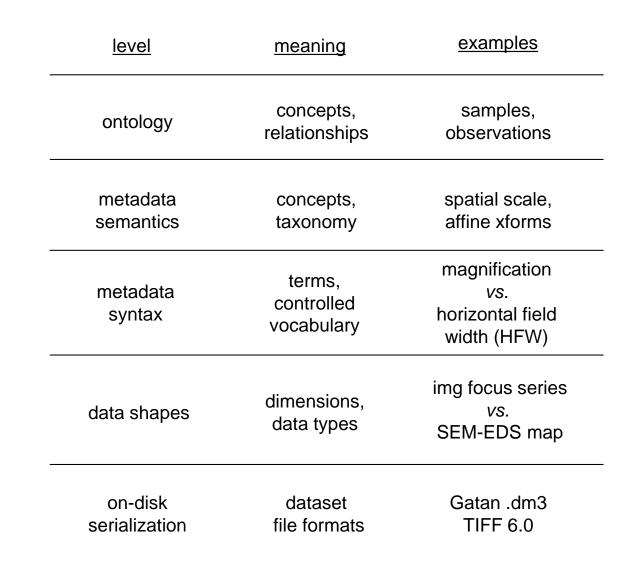
less abstract

Long-tail research data is limited by lack of :

- Interoperability
- Provenance
- Automated reasoning

Experimentalists, instrument operators, and modeling/simulation researchers face interoperability challenges at many levels of abstraction

As you all know, fixing these problems is *hard*.





### Research Data Alliance (RDA) Activities



https://rd-alliance.org

RDA/CODATA Materials Data, Infrastructure & Interoperability IG

"Materials IG"

**Chairs** 

James Warren (NIST)
Laura Bartolo (Northwestern)
Takuya Kadohira (NIMS)
Adham Hashibon (Fraunhofer IWM)
Alysia Garmulewicz (Universidad de
Santiago de Chile)



Chairs

Gerhard Goldbeck (Goldbeck Consulting)
Clare Paul (Air Force Research Lab)
John Henry Scott (NIST)

1. Initial Call: 13 March 2019

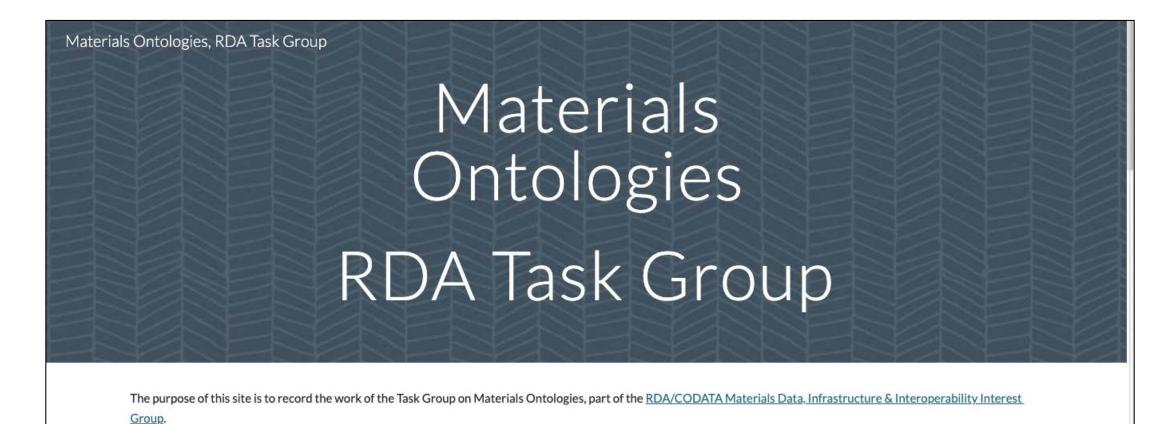
2. Task Group Approved: 04 Apr 2019 @ P13

3. 1<sup>st</sup> Telecon: 25 May 2019





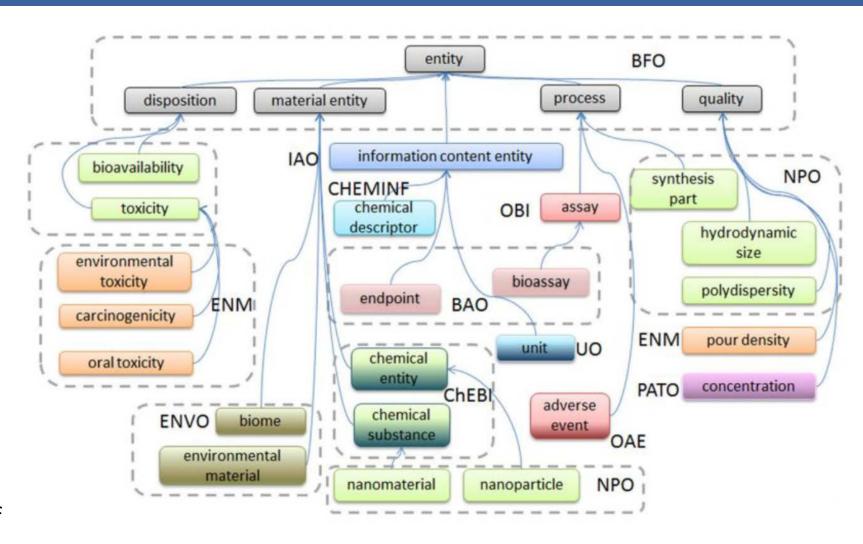
## RDA Materials Ontologies Task Group



https://sites.google.com/view/rda-materials-ontologies-tg/home

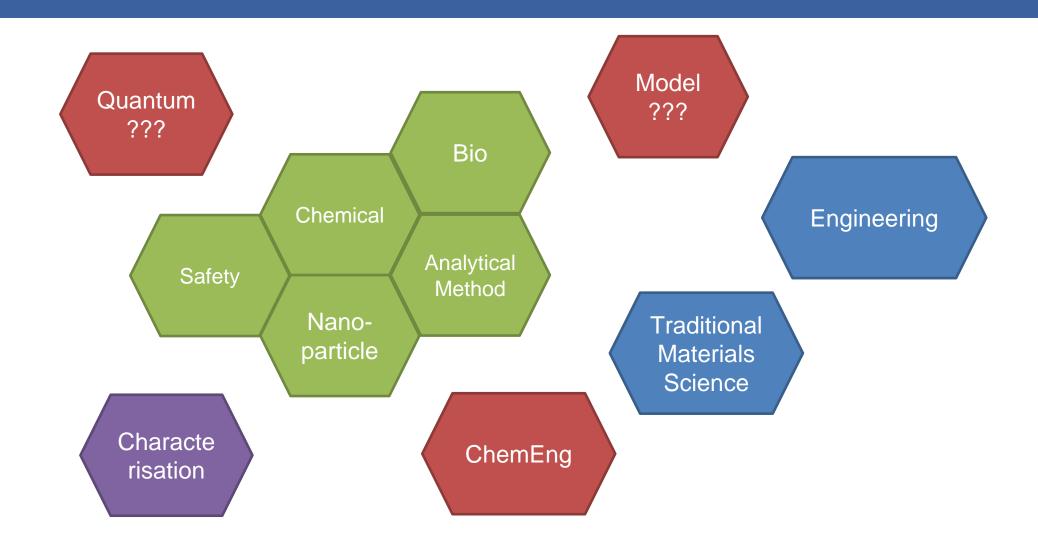


### Balkanization of materials ontologies



Courtesy of

### **Current Status**



## Where do we want to get to?



### Research Data Alliance (RDA) Activities

RDA Vocabulary Services IG

Chairs

Adam Shepherd
Simon Cox
Yann Le Franc
John Graybeal

Semantic Assets for Materials Science Task Group

Chairs

Vasily Bunakov (STFC)

**Zach Trautt (NIST)** 

RDA Heritage Science @ P13

Heritage Science
Research Data:
Challenges of Linked
Open Data Authoritative
Sources

Fenella France (LoC)
Andrew Forsberg (LoC)
John Henry Scott (NIST)



### Research Data Alliance (RDA) Activities



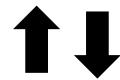
### Schema Repository and Registry

Part of the Materials Genome Initiative

https://schemas.nist.gov







## The EMMC Taxonda Registry



THE EUROPEAN MATERIALS MODELLING COUNCIL





**WORKSHOP 5** 

## 2018 NIST/CHiMaD Materials Microscopy Data Conference

October 25-26, 2018 (Northwestern University)

Program, videos, all talks online at:

http://chimad.northwestern.edu/news-events/CHiMaD\_Data\_Database\_Efforts.html







WORKSHOP 6

#### 2019 NIST/CHiMaD Video Conference

Workflow, June Lau, April 9, 1:30-3:00PM ET

To learn more about the conference click here.

<u>Vocabulary/Metadata</u>, John Henry Scott, March 19, 1:30-3:00PM ET

To learn more about the conference click here.

Sample History, Carelyn Campbell, March 5, 1:30-3:00PM ET

All content online at:

http://chimad.northwestern.edu/news-events/CHiMaD\_Data\_Database\_Efforts.html







WORKSHOP 7

### 2019 NIST/CHiMaD Materials Microscopy Data Conference

May 15-16, 2019 (NIST National Cybersecurity Center of Excellence)

All content online at:

http://chimad.northwestern.edu/news-events/CHiMaD\_Data\_Database\_Efforts.html



#### Microstructure Repository and Metadata Workshop: May 13-14

Lehigh University, the National Institute for Standards and Technology (NIST), and the National Science Foundation will be sponsoring a workshop from mid-day May 13, 2019 – May 14, 2019 to address key issues involved in materials data curation, assess current best practices, and develop a plan for establishing future protocols for widely accessible data repositories. This workshop will serve to create a new microstructures data repository that will enable researchers to share, access, and analyze images and associated data from multiple platforms. In preparation for this workshop, we held a preliminary meeting last November to discuss potential schema and the curation of metadata as related to electron micrographs and associated data. As a result of this November meeting, we have started construction of the repository as a testbed to evaluate proposed schema.







#### Program online at:

https://www.nist.gov/document/agenda-microstructure-workshop-may-13-14-2019



### Thank You

please contact me if you want these slides, or if you have questions (or suggestions!)

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ResearcherID: B-4593-2015

