## **Agenda**

- Welcome and introductions
- Motivation and the plan for this day
- Project plan
- CDCS site presentation
- SS441 introduction example of dataset
- Data structure
- API intorudction
- Finalisation . Discussion on all structures
- Way forward



# Project 2019 – AM-database

Greta Lindwall, Niclas Stenberg and Sareh Götelid *Stockholm, 2019-10-25* 



## **Outline**

- Aim of proposed project
- Configurational Data Curation System (CDCS)
- Project work packages and time plan

**Aim**: Capture and store AM-related materials data produced within PhD/postdoc projects at Swedish universities in an open searchable and reusable structure.

## **Motivation**

- Materials science is becoming more data intensive
- Data-driven techniques (e.g., machine learning) are becoming more common
- Awareness and education

**Aim**: Capture and store AM-related materials data produced within PhD/postdoc projects at Swedish universities in an open searchable and reusable structure.

#### **Approach**

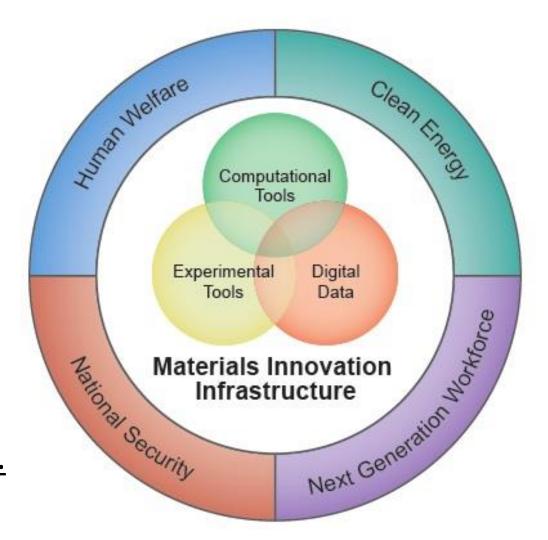
- Make use of available materials data infrastructures (suggestion: to use CDCS)
- Setup a common repository/database
- Train students in using CDCS to fill the repository
- Engage students in collaborative activities

# **Materials Genome Initiative (MGI)**

A U.S. multi-agency initiative to create policies, resources and infrastructure to support

- Discovery
- Manufacturing
- Deployment

of advanced materials <u>twice</u> as fast and at a <u>fraction of the cost</u>.



Holdren, MGI for global competitiveness (2011)

## MGI activities at NIST

#### **General Info:**

- NIST MGI: MGI.NIST.GOV
- Center for Hierarchical Materials Design: <a href="mailto:chimad.northwestern.edu">chimad.northwestern.edu</a>



#### **Software**

- Materials Data Curation System: <a href="https://github.com/usnistgov/MDCS">https://github.com/usnistgov/MDCS</a>
- Materials Resource Registry: <a href="https://github.com/usnistgov/MaterialsResourceRegistry">https://github.com/usnistgov/MaterialsResourceRegistry</a>
- Materials Design Toolkit: <a href="https://mgi.nist.gov/materials-design-toolkit">https://mgi.nist.gov/materials-design-toolkit</a>
- Cloud of Reproducible Records: <a href="https://mgi.nist.gov/cloud-reproducible-records">https://mgi.nist.gov/cloud-reproducible-records</a>

#### **Data Resources**

- Materials Resource Registry (tool to search for resources): <u>materials.registry.nist.gov</u>
- Schema Registry: <u>Schemas.nist.gov</u>
- MaterialsData Repository (General Materials Data): materialsdata.nist.gov/
- Phase-based Data Repository: <a href="PhaseData.NIST.GOV">PhaseData.NIST.GOV</a>
- Interatomic potentials: <u>www.ctcms.nist.gov/potentials/</u>
- Density Functional Data: <u>www.ctcms.nist.gov/~knc6/JVASP.html</u>



# **Configurable Data Curation System (CDCS)**

#### Need

- Scientific data exists in many formats
- Difficult to
  - Combine data from multiple sources
  - Understand and reuse existing data
  - Find associated metadata
  - Transform data into new formats

## Objectives

- ▶ Facilitate collection, use, and reuse of materials data
- Provide needed informatics infrastructure to enable High Throughput Experimentation (HTE)

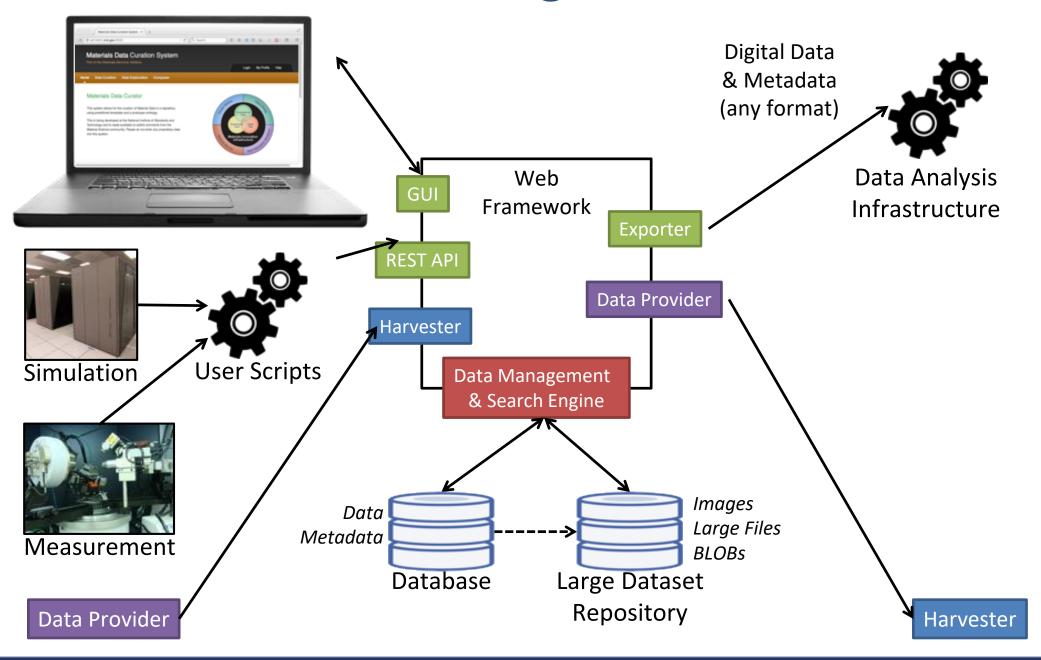


https://github.com/usnistgov/MDCS

- Achievements and Impact
  - Made available to community via GitHub
  - Several early adopters of CDCS

Warren & Ward, JOM 2018:70

# **Overall Design - CDCS**



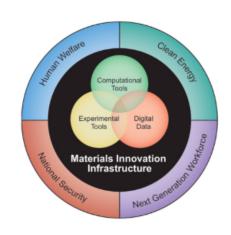
# https://github.com/usnistgov/MDCS

# Materials Data Curation System Welcome, admin. Thanks for logging in. Logout | Dashboard | Help Home Data Curation Data Exploration Composer

#### Materials Data Curator

This system allows for the curation of Material Data in a repository using predefined templates.

This is being developed at the National Institute of Standards and Technology and is made available to solicit comments from the Material Science community. Please do not enter any proprietary data into this system.



#### **MDCS Functions**

- Data Curation
- Data Exploration/Exporter
- Composer

#### **Available Options**

All Options »



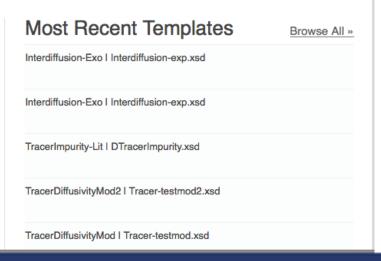
#### Curate your Materials Data

Click here to select a form template and then fill out the corresponding form.



#### Explore the repository

Click here to search for Materials Data in the repository using flexible queries.



# Why use CDCS?

- Open-source software built on widely used opensource software packages (MongoDB, Django, Redis, Celery)
- XML format (text based) readable by machines and humans
- It already has built-in APIs (very important!)
- It's available and it's developed for these purposes acknowledgeing
- It's been developed for years and is still being developed (XML schemas for AM)

# **Example: AM Bench Schema**

## **Additive Manufacturing Benchmark test series**

Its intent is to develop a continuing series of controlled benchmark tests + conference series

## Main goals:

- (1) Allow modelers to test their simulation results against rigorous and controlled experimental data
- (2) Encourage AM practitioners to develop novel mitigation strategies of challenging build scenarios

## **Example: AM Bench Schema**

#### **AM-Bench 2018 measurements**

- Laser powder bed fusion (L-PBF) 3D builds of Ni-based superalloy IN625 and 15-5 SS test objects: modelers were challenged to predict the part deflection, residual elastic strains, microstructure, phase fractions and phase evolution.
- Individual laser traces on bare metal plates of IN625 for different laser power and scanning speed: modelers were challenged to predict melt pool geometry, cooling rate, topography, grain shapes, dendritic microstructure and 3D structure.
- Materials extrusion polymer 3D builds of test objects: modelers were challenged to predict part thickness, mass, tensile properties, void distribution and cross section.
- Polymer powder bed fusion (P-PBF) with test objects being of dogbone shape and of Nylon
   modelers were challenged to predict part thickness, mass, tensile properties, void distribution, cross section, crystallinity and melting.

**Aim**: Capture and store AM-related materials data produced within PhD/postdoc projects at Swedish universities in an open searchable and reusable structure.

#### **Approach**

- Make use of available materials data infrastructures (suggestion: to use CDCS)
- Setup a common repository/database
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## Four workpackes



- ▶ WP1 Setup
  - ▶ WP2 Organization
  - ► WP3 Training
  - ► WP4 Data capture

#### WP1 – Setup

Setting it all up at the host-university and write manual (API documentation). Explore required conditions for a sustainable solution.

- 1. Decide on host, set the design and name
- 2. Set up the main server and administer
- 3. Set long-term development
- 4. Set long-term funding

## Four workpackes

- ► WP1 Setup
- → WP2 Organization
  - ► WP3 Training
  - ► WP4 Data capture

#### **WP2 – Organization**

Coordinate the work. Nominate CDCS "ambassadors" (PhD student/postdoc) at each university to lead the in-house CDCS activities and communicate the sub-group.

- 1. Nominate ambassadors
- 2. Project management
- 3. Follow and communicate the progress of the work

## Four workpackes

- ► WP1 Setup
- ▶ WP2 Organization
- WP3 Training
  - ► WP4 Data capture

#### WP3 – Training

Training of students in how to use CDCS, how to develop XML Schemas and use rest-API.

- 1. Hands-on workshops at the universities
- 2. Document rest-API function

## Four workpackes

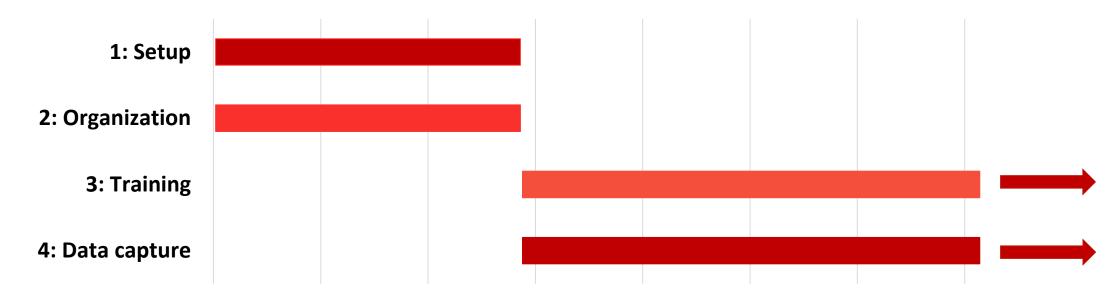
- ► WP1 Setup
- ▶ WP2 Organization
- ► WP3 Training
- → WP4 Data capture

#### WP4 – Data capture

Data capturing and creation.
Engagement activites to accelerate the work, motivate the students and help reach consensus on common schemas temlates for similiar types of data sets.

- 1. Data capture and curation at each university
- 2. XML schema "hackatons"

# Time plan



10-Apr-19 30-May-19 19-Jul-19 07-Sep-19 27-Oct-19 16-Dec-19 04-Feb-20 25-Mar-20

## **Useful links**

https://amdata.proj.kth.se/

https://github.com/swedish-amarena

https://cdcs.nist.gov