# **Data Infrastructure**

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MATERIAL MEASUREMENT LABORATORY

#### Data Landscape

Collaboration Tools (e.g. Google Drive, DropBox, Sharepoint, Github, MatIN)

Data Sharing Communities (e.g. Dryad, FigShare, NanoHub, Kaggle, NDS)

Data

Curation

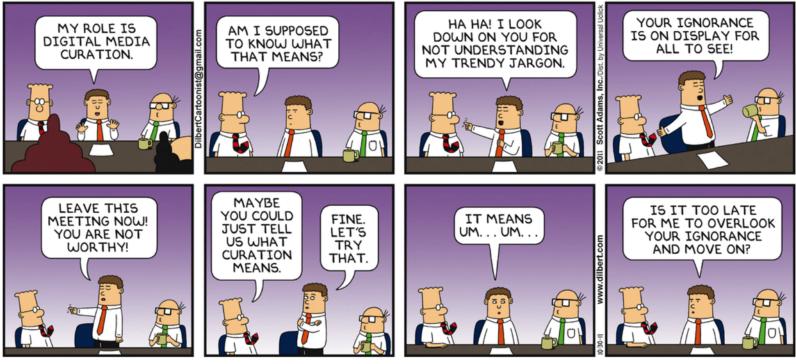
Software

Data Repositories (e.g. Aflow, MaterialsProject, OQMD, NIMS MaterialNavi, NoMaD, Materials Universe)

Data Analysis

Tools

## What is Data Curation?



Scott Adams, October 30, 2011

Data curation is the active and ongoing management of data through its lifecycle of interest and usefulness to scholarship, science, and education.

http://ischool.illinois.edu/academics/degrees/specializations/data\_curation



LEARN NETWORK ADVANC

## Materials Data Curation Tools

| NIST   | Name -   | Services 1 Login                | Maily Contact |
|--|--|---------------------------------|---------------|
|  | Materials Resource Regist  | y <sup>Beta</sup>               |               |
|  | MARCH FOR RESOURCES ADD YOUR RESOU   | RCE                             |               |
|  |  |                                 |               |
| Find Materia   | la Data  | _                               |               |
| Find Materia   | als Data   | tes 1ge                         |               |
| This system allows for the registr   | ation of materials resources, bridging the gap between existing resources  | <b>New You</b><br>Training      |               |
| This system allows for the registr<br>and the end users. The Materials   |  |                                 |               |
| This system allows for the regist<br>and the end users. The Materials<br>registered information available                                      | ation of materials resources, bridging the gap between existing resources.<br>Resource Registry functions as a centrally located service, making the<br>for research to the materials community. | Services                        |               |
| This system allows for the registe<br>and the end users. The Materials<br>registered information available<br>This is being developed at the N | ation of materials resources, bridging the gap between existing resources.<br>Resource Registry functions as a controlly located service, making the   | Service<br>Search for resources |               |



Representative list of tools focused on materials data, but not comprehensive

# **Data Model Definition**

#### Defines the structure of metadata and data

#### Measurement Data Model

#### Metadata e.g.

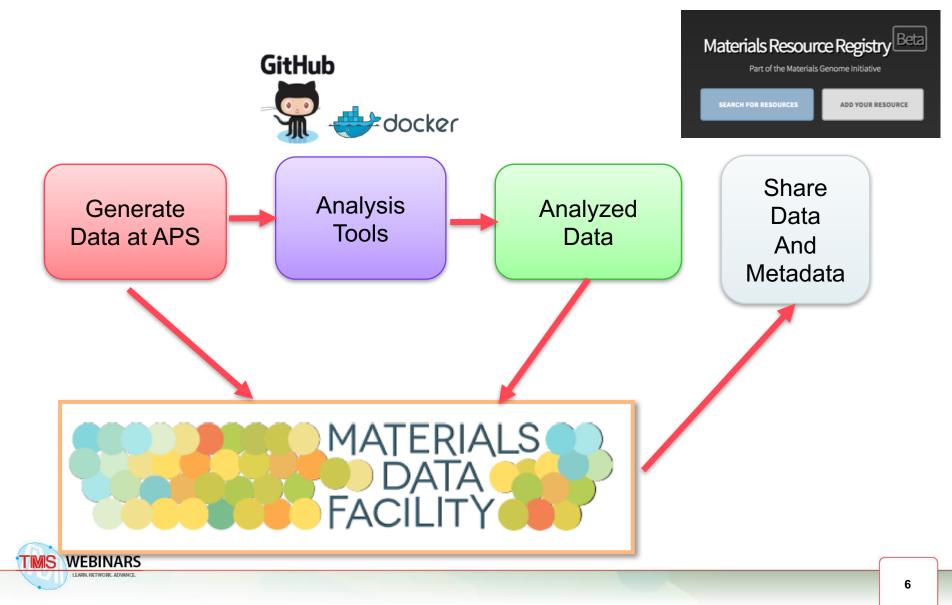
- Sample owner
- Date of measurment Kα1
- Sample stage position
- Apparatus temperature

#### Data e.g.

- As XML
- Raw data (text, ASCII, binary)
- Imported table
- \*Link to image or raw data



## Example APS Data (Large Data Example)



# Workflows

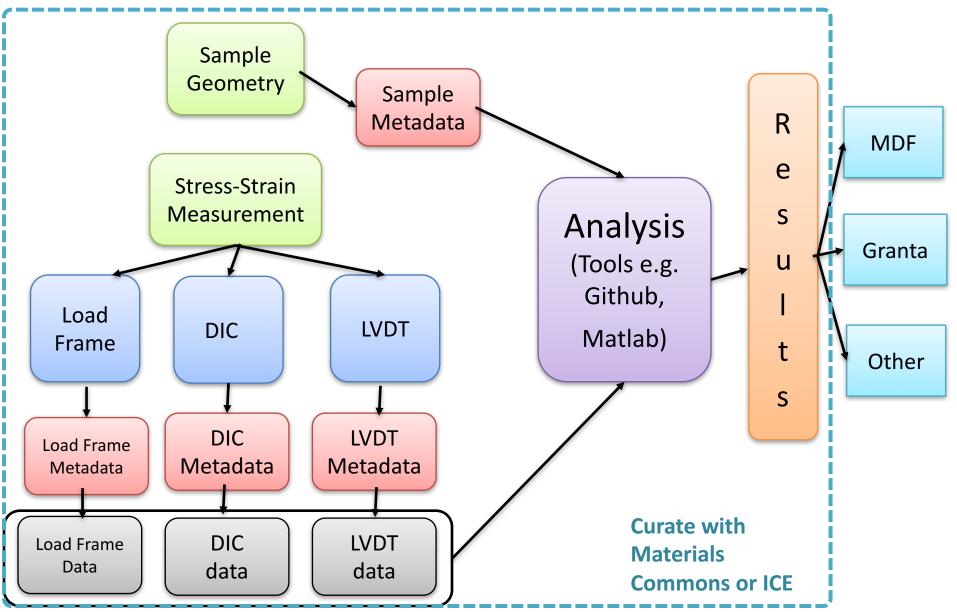
- Large Data sets: Single Point Source (e.g. APS)
- Experimental data (small to medium size), multiple source generation
- Computational Data

• Infrastructure Selection Tool

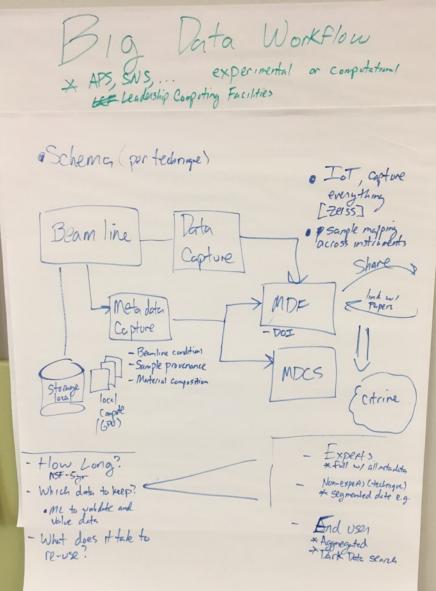
## Stress-Strain Measurement

O Measurement Data Experimental Data Workflow 1 Resi \*TCE 1 Workflow \*Material Commons 19 DCS 4CEED (Microscopy) \* Small -> Medium \* Multiple modalities (2) Measurement Analysis Example: Stress-Strain Curve ost-it MTS-result Sample Geometry Resalts Dh DIC Matlab Measurement achinemeta DICSONAC LVDD Final Streas-Stress-Strain Measuronent MIS Ralibrat ASE Storg

#### Experimental Workflow: Stress-strain Measurement



## **Big Data Workflow**



#### **Computational Data Workflow**

- Lots of different techniques
- PhaseField modeling: no standards.
- Community standards needed

- Codes changes quickly
- Social change needed.
- FEM more benchmark. -- more standardize

#### How do I select a Materials Data Infrastructure Tool?

# **Example: Workflow Tool Selection**

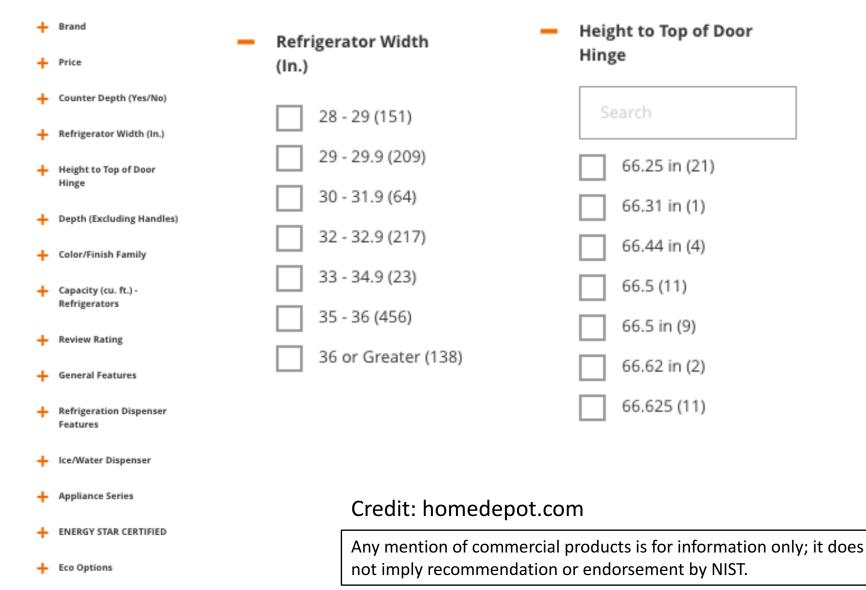
| ournal of Grid Computing (2006) 3: 171–200<br>DOI: 10.1007/s10723-005-9010-8                          | © Springer 2006     |                   |                    |                   |  | 18  |
|---|---------------------|-------------------|--------------------|-------------------|--|---|
|   |                     | Table 2. Workflow | design taxonomy ma | pping.            |  |   |
| A Taxonomy of Workflow Management Systems for   | r Grid Computing    | Project name      | Structure          | Model             | Composition systems                                | QoS constraints   |
|   | on a company        | DAGMan            | DAG                | Abstract          | User-directed<br>• Language-based                  | Us r specified rank<br>expression for desired resources |
| lia Yu and Rajkumar Buyya*<br>Grid Computing and Distributed Systems (GRIDS) Laboratory, Department ( | of Commuter Science | Pegasus           | DAG                | Abstract          | User-directed<br>• Language-based<br>Automatic     | N/A   |
| und Software Engineering, The University of Melbourne, Melbourne, Austro<br>E-mail: raj@cs.mu.oz.au   |                     | Triana            | Non-DAG            | Abstract          | User-directed <ul> <li>Graph-based</li> </ul>      | N/A   |
| Received 28 May 2005; accepted in revised form 6 December 2005  |                     | ICENI             | Non-DAG            | Abstract          | User-directed<br>• Language-based<br>• Graph-based | Metrics specified by users                              |
|   |                     | raveina           | DAG                | Abstract/concrete | • Language-based<br>• Graph-based                  | N/A   |
| <i>ey words:</i> Grid computing, resource management, scheduling, taxonomy, w                         | orkflow management  | GridAnt           | Non-DAG            | Concrete          | User-directed     Language-based                   | N/A   |
| bstract   |                     | GrADS             | DAG                | Abstract          | User-directed<br>• Language-based                  | Estimated application execution tit                     |

With the complex resources Therefore computin building develope onomy n workflov

#### Table 2. Workflow design taxonomy mapping.

| Project name | Structure | Model    | Composition systems                |
|--------------|-----------|----------|------------------------------------|
| DAGMan       | DAG       | Abstract | User-directed                      |
|              |           |          | <ul> <li>Language-based</li> </ul> |
| Pegasus      | DAG       | Abstract | User-directed                      |
| -            |           |          | • Language-based                   |
|              |           |          | Automatic                          |
| Triana       | Non-DAG   | Abstract | User-directed                      |
|              |           |          | • Graph-based                      |
| ICENI        | Non-DAG   | Abstract | User-directed                      |
|              |           |          | <ul> <li>Language-based</li> </ul> |
|              |           |          | • Graph-based                      |
|              |           |          |                                    |

# **Example: Hardware Store Website**



# Example: Used Car Website

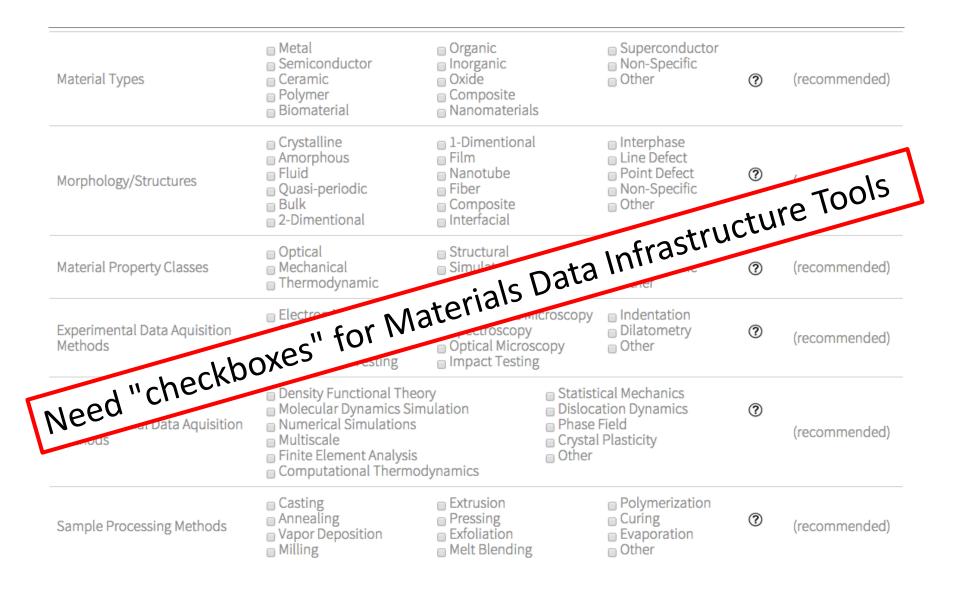
| Price                | + |
|----------------------|---|
| Mileage              | + |
| Years                | + |
| Used / New           | + |
| Make                 | + |
| Туре                 | + |
| Features             | + |
| Size                 | + |
| Exterior Color       | + |
| Interior Color       | + |
| MPG City             | + |
| MPG Highway          | + |
| Cylinders            | + |
| Transmission         | + |
| Packages             | + |
| Domestic /<br>Import | + |
| Store                | + |

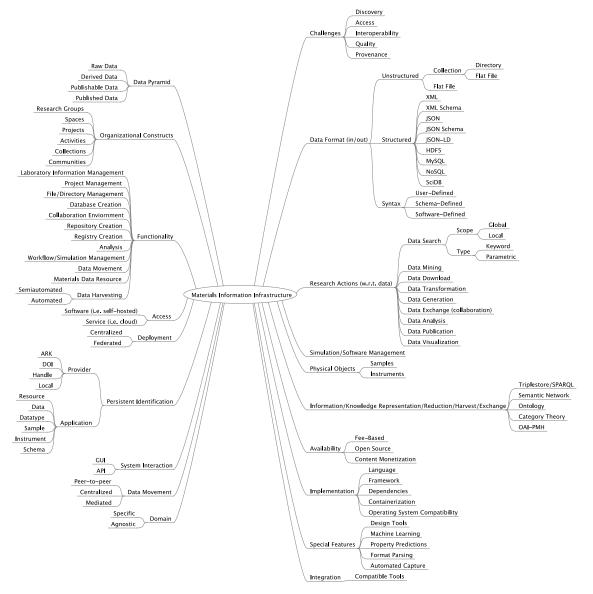
# MPG CityFeaturesOver 20 MPG city (4507)Adjustable Suspension<br/>(98)Over 25 MPG city (1875)Air Conditioning (8091)Over 30 MPG city (459)Alloy Wheels (6688)Over 35 MPG city (256)Auto Cruise Control (217)Over 40 MPG city (191)Automated Parking (46)

#### Credit: carmax.com

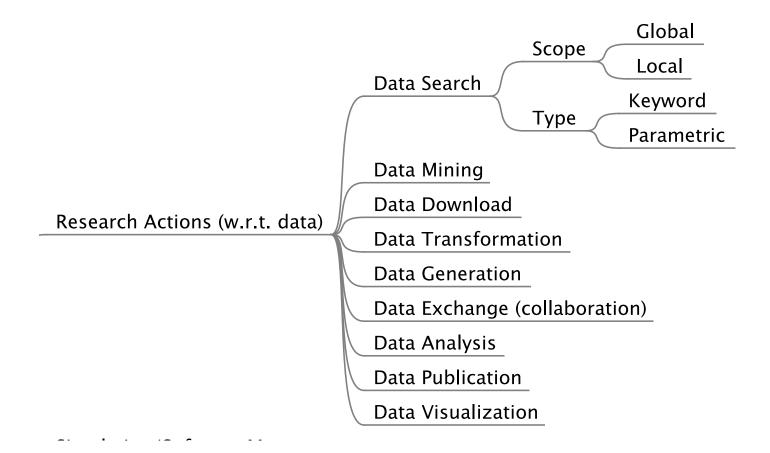
Any mention of commercial products is for information only; it does not imply recommendation or endorsement by NIST.

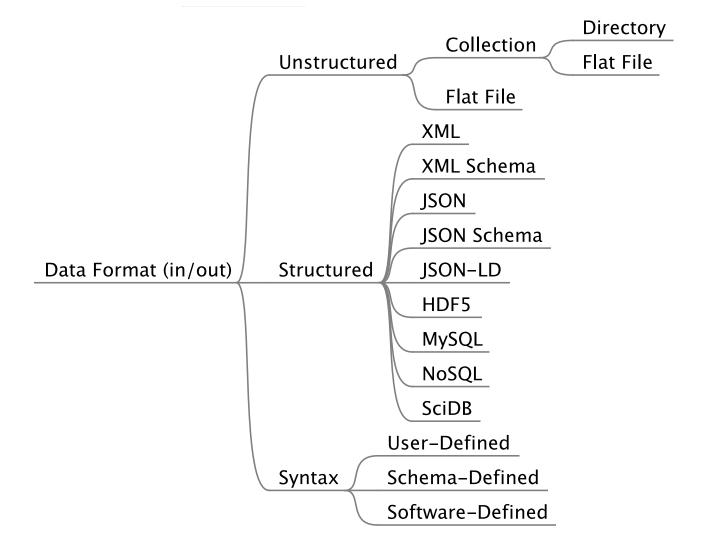
#### **Registry:** Materials Data Infrastructure Tools





Laboratory Information Management Project Management File/Directory Management **Database** Creation **Collaboration Enviornment Repository Creation Functionality Registry Creation** Analysis Workflow/Simulation Management Data Movement Materials Data Resource Semiautomated **Data Harvesting** Automated





#### Notes from Summit Wrap-up Session

- Integrate tools into undergraduate education
  - Tools need to more user friendly
- Embed data experts into experimental groups
  - Alternate: floating data experts available for experimental groups.
  - Need to define skills needed for these data experts
- Encourage more conference exchanges at Data Analytics and Materials communities
- Define data curation guidelines/code
  - Benefit to users
- Data Challenge (Student)
  - Prize for data set
  - Best paper/DOI/PID
- Develop implementation path
- Improve peer recognition
- Develop data cite profile

Interest in following up with small working groups on specific issues.

Data Cit. Profile

Tool Integ. into undergrad edu - More userfriendly

Embedding data into exp. on floating data expents. groups

Data Analytics/Materials conf. exchange

Guidelines for data curation/ (Benetitions) code Data Challenge (studint-band) -prize -best paper/DOI-PID

Peer recognition Role/Function Implementation Path

