

Towards a Big-Data Toolkit: Ensuring Data Governance & Ethical Considerations Are Applied to Large Datasets

DOE Data Days

2022-05-27

Alex May, Olga Kuchar, Katie Knight, Rohit Srivastava





The Fundamental Question:

Do the Data Curation Network's best practices and human-intensive workflows scale, and if not, what are the ethical implications?







The Issues:

Defining Big Data

No consistent definition: what is it, exactly?

How "Big" is Big Data?

What is the data lifecycle for Big Data?

Curation

Which data should be stored, and how?

What should get tagged: the entity creating the data, or the actual data?

How do workflows interact with data?





DCN Curation Checklist **à** Does this Work for 600,000 lmages?



| С | Check files/code and read documentation (risk mitigation, file inventory, appraisal/selection) |
|---|---|
| U | Understand the data (or try to), if not (run files/code, QA/QC issues, readmes) |
| R | Request missing information or changes (tracking provenance of any changes and why) |
| Α | Augment metadata for findability (DOIs, metadata standards, discoverability) |
| Т | Transform file formats for reuse (data preservation, conversion tools, data visualization) |
| E | Evaluate for FAIRness (transparent usage licenses, responsibility standards, metrics for tracking use) |
| D | Document all curation activities throughout the process |







Data Governance and Ethical Considerations



Schwarz et al., 2021

Corrupted binaries and files will impact reproducibility and file format migration

Personal Identifiable Information (PII) –, e.g., faces in a dataset of 600,000 images and embedded location metadata

Incomplete information for understanding the dataset itself

Increasing use of ML and/or Al makes it possible to identify individuals by combing deidentified datasets





Need for Data Management Policies

Enable Open Science Comply with Federal & International Law

Risk Management

Sensitive Data Compliance

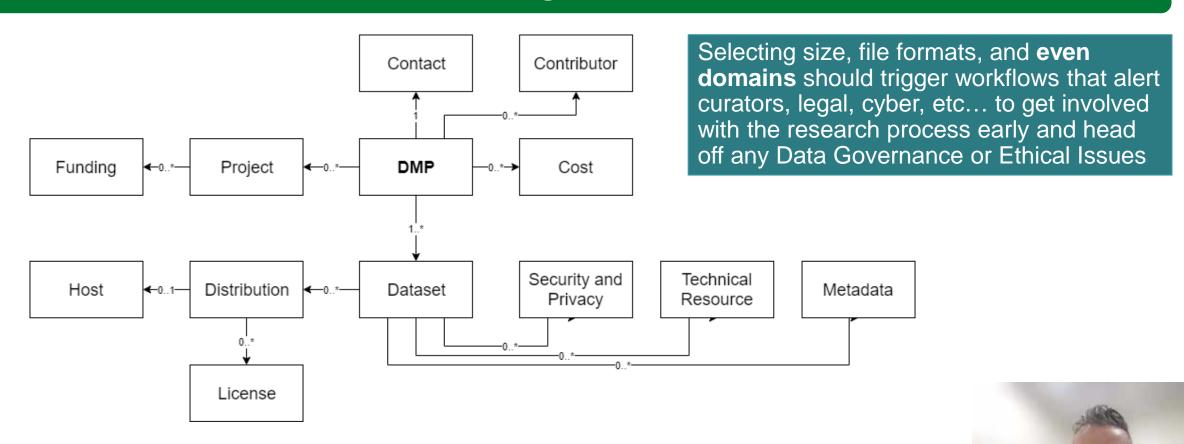
Add Data Value Adhere to the Prime Contract

Long-term stewardship





Machine Actionable Data Management Plans



Adapt the RDA-DMP-Common-Standard to the specific needs of the Labs





Don't focus solely on file formats

Create **automated workflows** that are **domain specific**

Create domain-specific primers

Start creating a **domain repository**

e.g., BioPortal2, an open, automatically updated repository of versioned biomedical ontologies stored in various formats accessible via Web browsers





Invest in a Lab-Wide Data Catalog

For **preservation**, know the:

Frequency of accession

What factors contribute to dataset discovery

Adopt machine-actionable access controls that can:

Align with data governance and policies

Automatically scan metadata, provide file-level sna





Sciences & Humanities Can Solve the Problem Together

Look to Digital Humanities work with **Al and ML**

Al for Libraries interest group

Stanford and Library of Congress work in classifying images

Repurpose tools like the MIT's Sonification Toolkit

e.g., quickly identify bad binaries

Look into <u>ARCHANGEL</u> blockchains

Data can be added but not overwritten, amended or deleted

Offers a **digital finger** archival materials
Verify authenticity





Evaluate Organization -Wide Solutions

Our big data is not "special" Avoid technical debt

Evaluate and find turn-key solutions

How is this already handled in industry, other domains?

e.g., Google DataFlow, Apache Beam, HubZero

While all products may not work perfectly, they may point to potential solutions





Get Creative!

Create virtual, web-based environments for curators

Create a repository of curation tools

e.g., Re3Data

No more spreadsheets!

Use HPC to curate data

Harness big computers for big data

Consider Digital Object solutions

BDBag

FAIR Digital Objects

RO-Crate





The Big Data Toolkit is, in fact, a Constellation of Services

- Next Steps
- Work towards a MaDMP
- Evaluate lab-wide data catalog solution
- Participate in DCN's Big Data Interest Group
- Continue to learn from curating Big Data datasets in order to build the toolkit



