

High Fidelity:

**Connecting information for Better Research
Reproducibility**



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Director
Samuel J. Wood Library

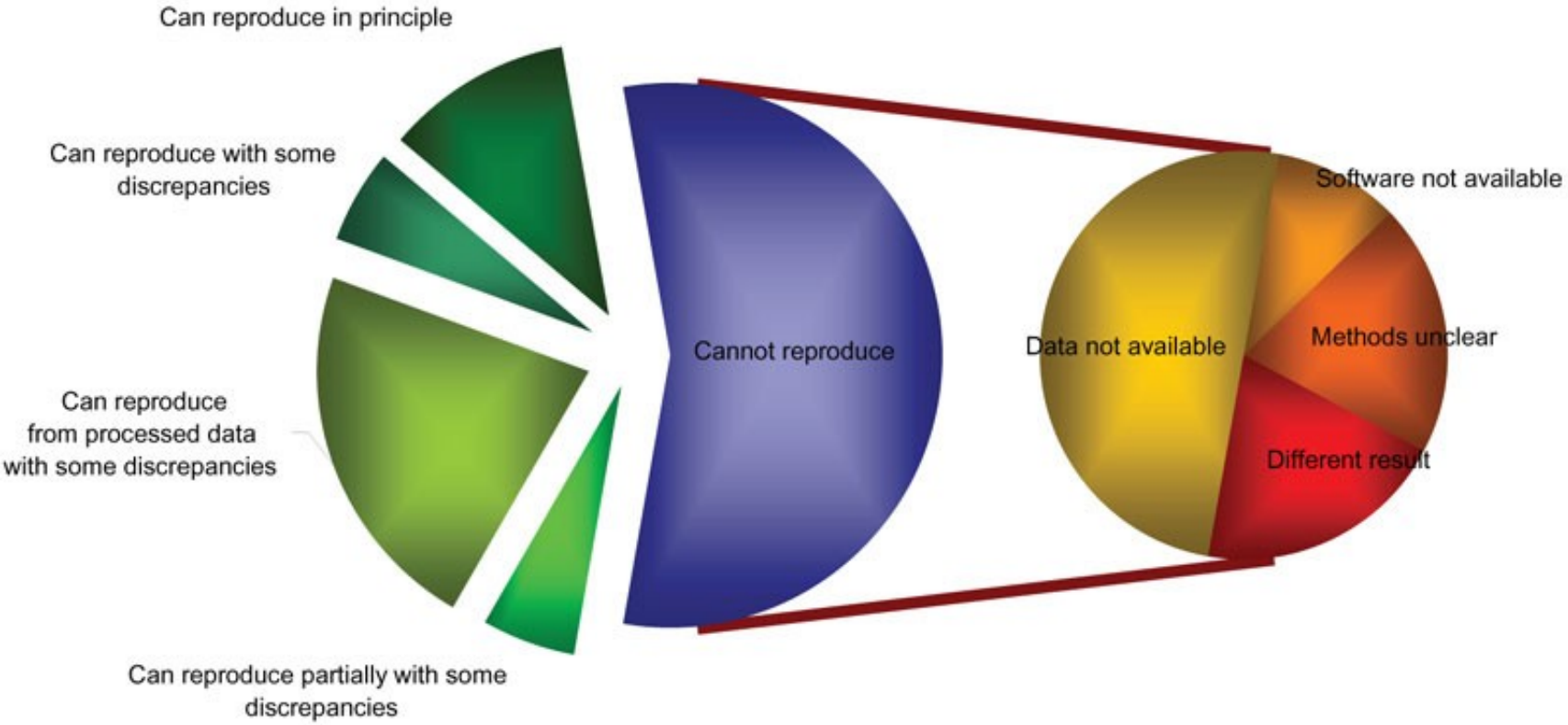
Peter Oxley, PhD
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There are three fires burning that motivate our actions towards better reproducibility



1. “Reproducibility Crisis”
2. Data Retention Mandates
3. Allegations of Misconduct

Attempting to reproduce research proves to be difficult, when you can't get the data...



Ioannidis *et al.* (2009) Nat. Gen. 41:149

“OMB Circular A-110 states that the retention period is three years from the date the final financial report is submitted.”

“NSF states in its General Grant Conditions that records must be retained for three years after the submission of all required reports”

“in the case of research misconduct involving NIH funds, records must be retained for six years after the final resolution date of the case.”

“retain research data pertinent to patented inventions for the life of the patent”

“about 2% of scientists admitted to have fabricated, falsified or modified data or results at least once”

“Up to one third admitted a variety of other questionable practices”

Fanelli (2009) PLOS One 0005738

“3.8% of published papers contained problematic figures, with at least one exhibiting features suggestive of deliberate manipulation”

Bik *et al.* (2016) mBio 00809–16



Brainard and You (2018) Science 00809–16

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2. Data Retention Mandates
3. Allegations of Misconduct

Maximizing data value and ethical research
conduct

We are not automatically making research reproducible,
but providing the infrastructure that helps make research re

Reporting Standards

PRISMA

MIAME

MIQE

Principles of reproducibility

FAIR

Literate Programming (Knuth 1992)

Compendiums (Gentleman and Lang, 2003)

Data Publication standards

Open Science

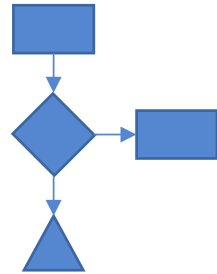
Communities of practice

The Turing Way

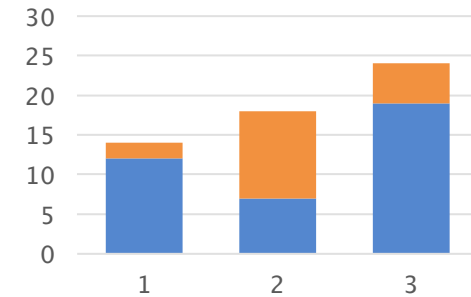
How can we help researchers capture the data and workflows that lead to publishable results?

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010101000101
010111100001
001101001001
000111111001
010001111010
001010100100
100100101111
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DATA



WORKFLOWS



RESULTS

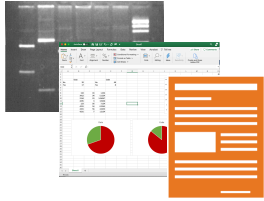
Hurdle #1: Dealing with confidential data

Hurdle #2: Researchers are very busy

Hurdle #3: Data and workflows are very diverse

Hurdle #4: Maintaining a high quality solution

Piece #1: Electronic Lab Notebooks capture (small) data and while remaining flexible to researcher needs



Direct storage of images, data files, analysis files, workflows



File versioning and immutable timestamps



Integration with Jupyter Notebooks (on roadmap)



Shareable and transferable

Piece #2: A file management system for tagging, tracking, and archiving files on the institutional storage systems



Data associated with a project/publication assigned a unique tag



File identity managed by hashing

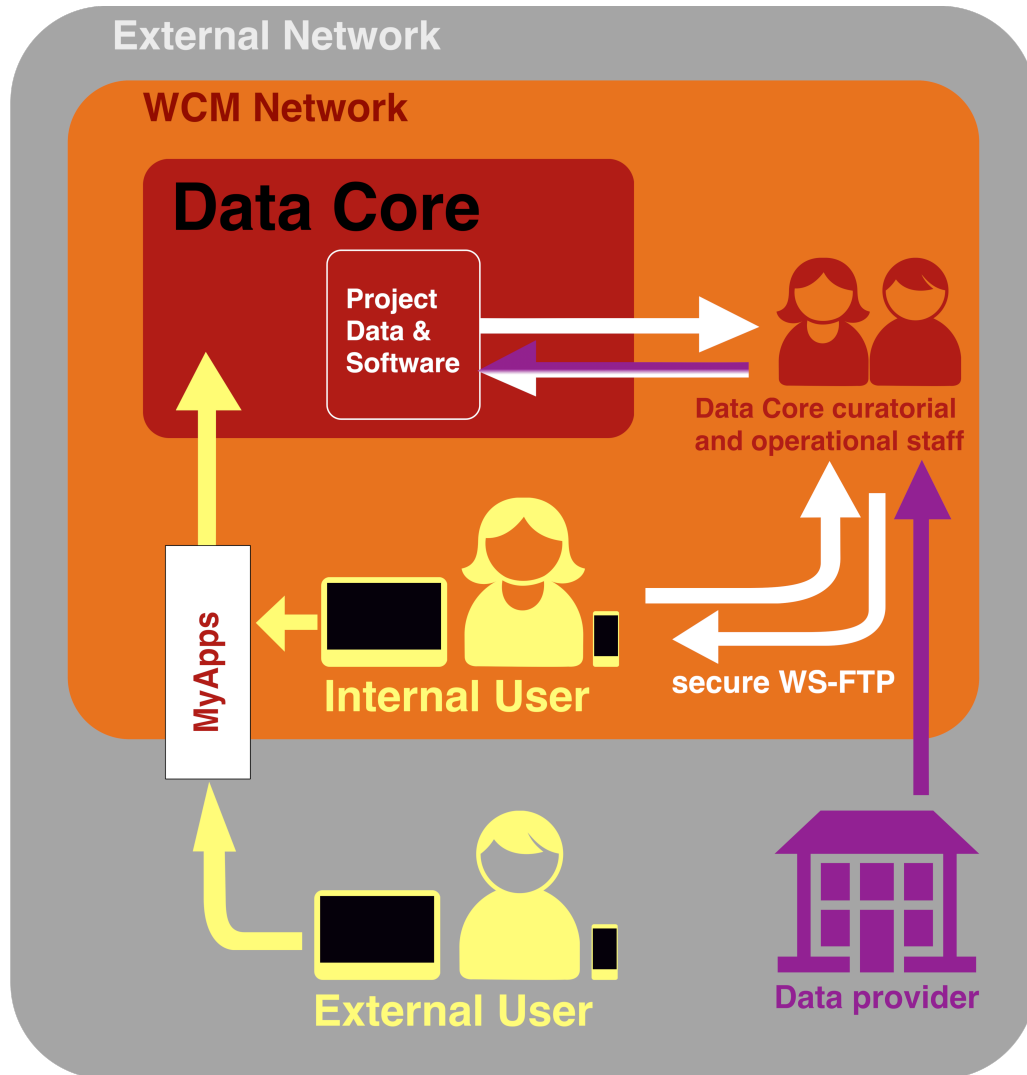


File location tracked within institutional storage



Actionable scripts for marking project complete, and archiving

Piece #3: Secure file access management and computation to the institutional Data Core

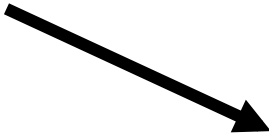
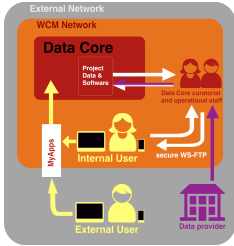


Secured, collaborative, flexible

Project governance and monitoring

Data curation for import and export

Holding the pieces together: an institutional Data Catalog that connects data, workflows, governance and access conditions



Data Catalog (Beta) View Details pro2004 Submit New: Search catalog Submit

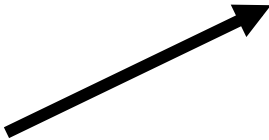
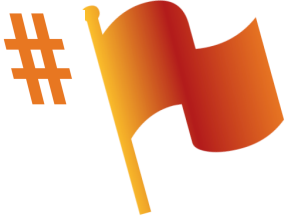
COVID-19 Data Lake

Update dataset details

Data publisher: [Architecture for Research Computing in Health \(ARCH\)](#)

A data lake to support the study of patients tested for SARS-CoV-2. The set includes standard electronic health record (EHR) data in addition to novel collection of SARS-CoV-2 data via REDCap. Available EHR data includes: patient demographics, patient visits, medications, prescriptions, transfers, labs, orders/procedures, diagnoses, observations, vitals and computed scores, notes (both outpatient and discharge summary), ventilator usage, transfusions. Available SARS-CoV-2 data, for patients that tested positive for the virus, includes: HIV regimen, pregnancy and gestational age, immunosuppression (binary variable and details), date of first symptoms and details of symptoms, prior utilization (was patient discharged from other hospital or ED before

Local contact	Tom Campion (thc2015)
Record Period Start	Jan. 1, 2015
Record Period End	None
Publication Date	April 13, 2020
Confidentiality Impact Level	WCM ITS 11.03: High Risk (Confidential)
Data Creators	Architecture for Research Computing in Health (ARCH)
Media Types	
Landing URL	https://medcornell.sharepoint.com/sites/covid_arch/Idr/SitePages/About.aspx
Keywords	ARCH COVID



Discovery layer with the capacity to connect grants, data, publication

The WCM Data Catalog was built to manage data governance and access conditions

Scope of authorization

User authorization

Data Controls

Reuse scope

Healthcare Cost and Utilization Project (HCUP) OMB Control # 0915-0276

Agency for Healthcare Research and Quality (AHRQ)

description

Governs use of data from the Healthcare Cost and Utilization Project (HCUP), maintained by the Center for Delivery, Organization, and Markets (CDOM) within the Agency for Healthcare Research and Quality (AHRQ).

Start date	Nov. 1, 2016
End date	June 30, 2021
PI	Michael Bales (meb7002)
Mixing of different datasets allowed?	False
Data destruction required?	True

Data Storage Requirements

Data must be stored within the WCM Data Core
Data must be encrypted at rest

Data Access Conditions

two-factor authentication

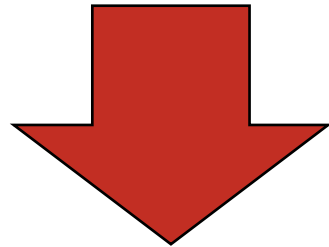
Update DUA details

Datasets for OMB Control # 0915-0276: Healthcare Cost and

Three triggers to prompt capture and storage



1. Project/Grant completion
2. Publication
3. Faculty member leaves the institution



Move files to archive
Register project, file tag, ELNs in Data Catalog

Acknowledgements:

Curt Cole (WCM CIO)

Data Core

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Danny Tan

Lucy Walle

Tony DiFazio

Data Catalog

The Data Catalog Collaboration (DDC)

Nicole Contaxis (NYU Langone)

Tom Campion

File System Management

Cindy Chen

Darrin Stivala (Starfish)

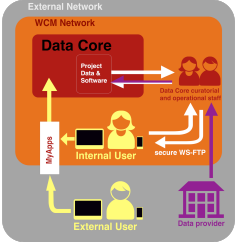
Doug Hughes (Starfish)

Jo Hargitai

Tony DiFazio

Peter Oxley pro2004@med.cornell.edu
Terrie Wheeler tew2004@med.cornell.edu

Design and Implementation of a Secure Computing Environment for Analysis of Sensitive Data at an Academic Medical Center.
Oxley PR, Ruffing J, Campion TR Jr, Wheeler TR, Cole CL.
AMIA Annu Symp Proc. 2018 Dec 5; 2018:857–866.



Data Catalog (Beta) View Details ▾ pro2004 ▾ Submit New: ▾ Search catalog Submit

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