#### UCLA Presentations

Title Whose Science? Whose Data? Whose Evidence?

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## Whose Science? Whose Data? Whose Evidence?

### Christine L. Borgman

Distinguished Research Professor Director, Center for Knowledge Infrastructures <u>https://knowledgeinfrastructures.gseis.ucla.edu</u> University of California, Los Angeles <u>http://christineborgman.info</u> @scitechprof

**Keynote presentation** 

**Open Science and the Role of Common Evidence** Sage Bionetworks 10<sup>th</sup> Anniversary Assembly Seattle, WA, July 25, 2019 https://sagebionetworks.org/events/2019-assembly/

### BIG DATA, LITTLE DATA, NO DATA

SCHOLARSHIP IN THE NETWORKED WORLD

Christine L. Borgman





# Data sharing policies

- Research Councils of the UK
- European Union
- U.S. Federal research policy
- Australian Research Council
- Individual countries, funding agencies, journals, universities



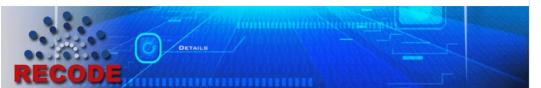
Supported by wellcometrust



Australian Government
National Health and Medical Research Council



Policy RECommendations for Open Access to Research Data in Europe







中央研究院





## **Open Data Practices**

- Deposit datasets in a data archive
- Link datasets to journal article or publication
- Publish data documentation
  - Research protocols
  - Codebooks
  - Software
  - Algorithms
- Cite data and software





UNIVERSITY

CALIFORNIA

\*dash

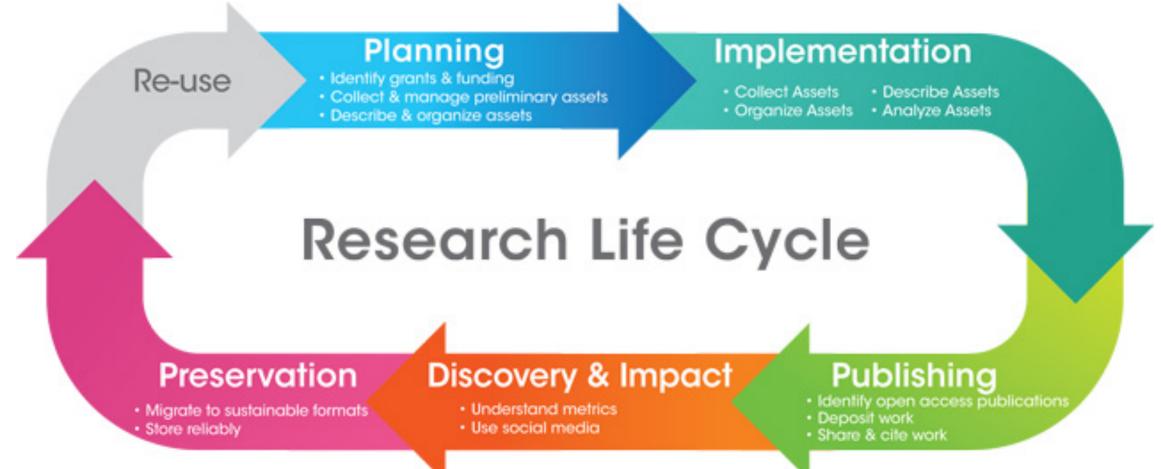




An easy-to-use data publication service

## Data creation and reuse: The Ideal

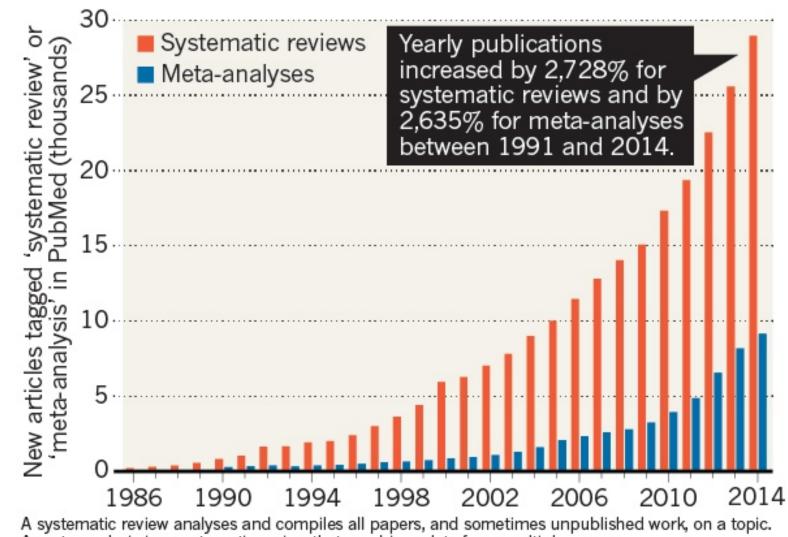
http://www.lib.uci.edu/dss/images/lifecycle.jpg



Borgman, C. L. (2019). The Lives and After Lives of Data. Harvard Data Science Review, 1(1). https://doi.org/10.1162/99608f92.9a36bdb6

### META MASS PRODUCTION

The number of systematic reviews and meta-analyses published each year has proliferated since 1986.



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Original Investigation 🔂 Full Access

### The Mass Production of Redundant, Misleading, and Conflicted Systematic Reviews and Meta-analyses

JOHN P.A. IOANNIDIS 🔀

First published: 13 September 2016 | https://doi.org/10.1111/1468-0009.12210 | Cited by: 212

### Publications <-> Data

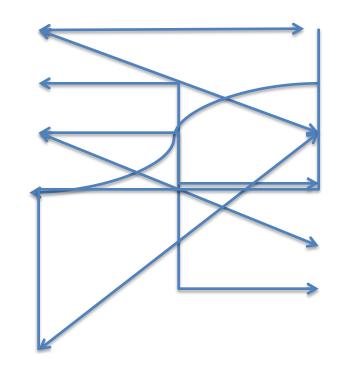
Publications are arguments made by authors, and data are the evidence used to support the arguments.



C.L. Borgman (2015). *Big Data, Little Data, No Data: Scholarship in the Networked World*. MIT Press

## Publications <-> Data: Mapping

- Article 1
- Article 2
- Article 3
- Article 4



• Article n

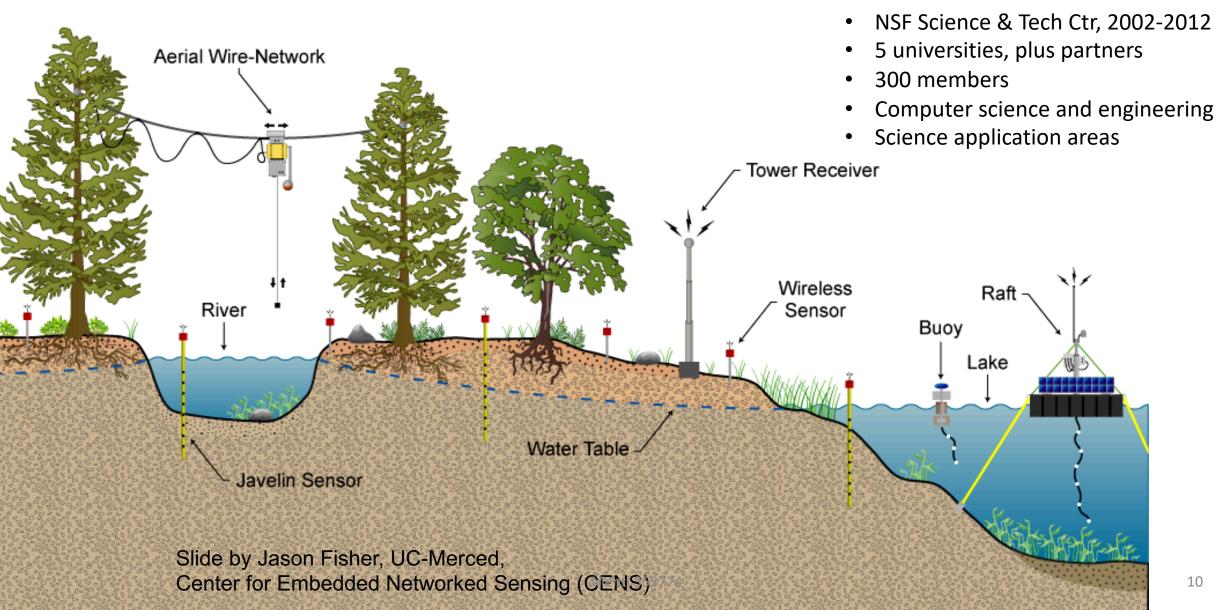
- Dataset time 1
- Dataset time 2
- Observation time 1
- Visualization time 3
- Community collection 1
- Repository 1



Data are representations of observations, objects, or other entities used as evidence of phenomena for the purposes of research or scholarship.

C.L. Borgman (2015). *Big Data, Little Data, No Data: Scholarship in the Networked World*. MIT Press

### Center for Embedded Networked Sensing



### Science <-> Data

#### Engineering researcher:

### *"Temperature is temperature."*



**CENS** Robotics team

### Science <-> Data

### Engineering researcher: *"Temperature is temperature."*

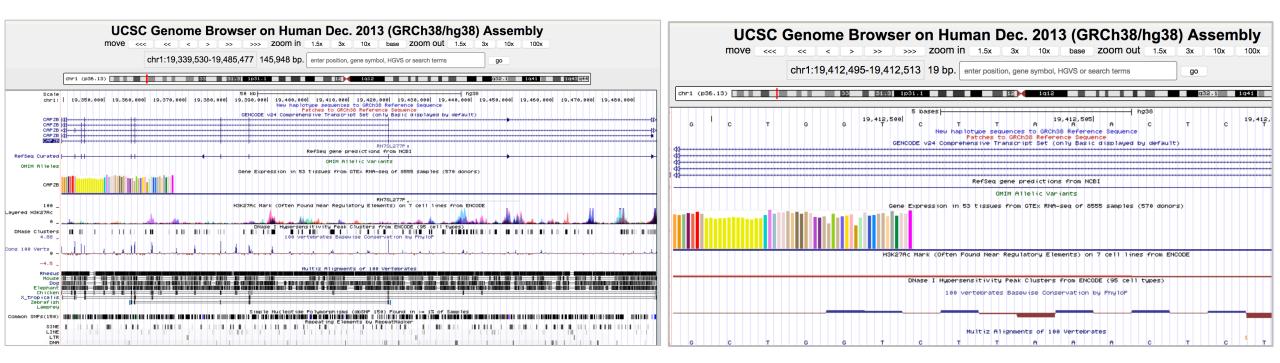


**CENS** Robotics team

# Biologist: "There are hundreds of ways to measure temperature.

'The temperature is 98' is low-value compared to, 'the temperature of the surface, measured by the infrared thermopile, model number XYZ, is 98.' That means it is measuring a proxy for a *temperature, rather than being in contact* with a probe, and it is measuring from a distance. The accuracy is plus or minus .05 of a degree. I [also] want to know that it was taken outside versus inside a controlled environment, how long it had been in place, and the last time it was calibrated, which might tell me whether it has drifted.."

# Comparative data reuse: calibrate, control, "ground truth"



UCSC Genome Browser – Search example (CAPZB gene)

#### UCSC Genome Browser – Zoom IN

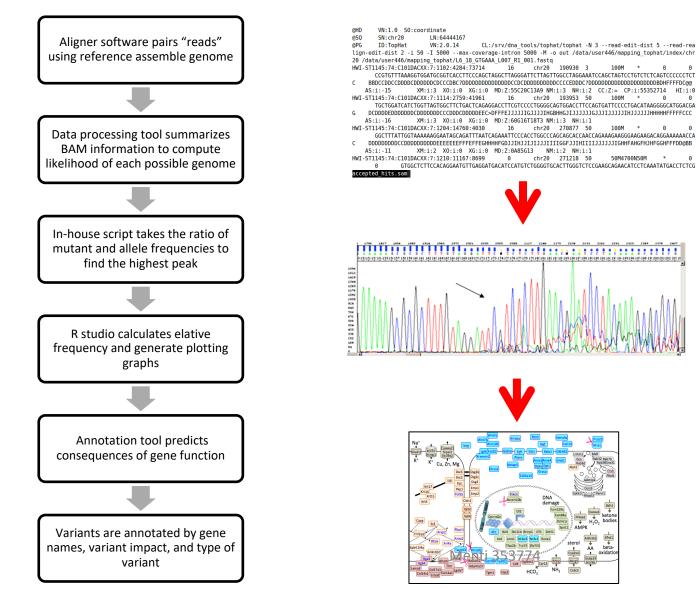
Pasquetto, I. V. (2018). *From Open Data to Knowledge Production: Biomedical Data Sharing and Unpredictable Data Reuses* (Ph.D. Dissertation, UCLA). Retrieved from <u>https://escholarship.org/uc/item/1sx7v77r</u>

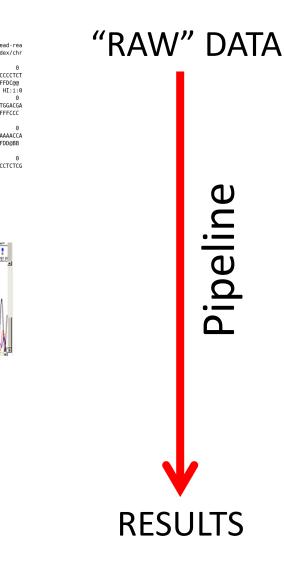
### Integrative Data Reuse: Hypothesis Testing and Statistical Analysis

100M

50M4700N50M

chr20 270877 50





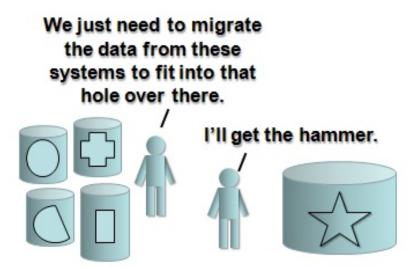
	Comparative Data Reuse <-> Integrative Data Reuse	
Goal	"Ground truthing:" calibrate, compare, confirm	Analysis: identify patterns, correlations, causal relationships
Example	Instrument calibration, sequence annotation, review summary-level data	Meta-analyses, novel statistical analyses
Frequency	Frequent, routine practice	Rare, emergent practice
Interpretation	Interactional expertise, "knowledge that"	Contributory expertise, "knowledge how," tacit knowledge

Pasquetto, I. V., Borgman, C. L., & Wofford, M. F. (in review). Uses and reuses of scientific data: The data creators' advantage. Harvard Data Science Review.

### Data Stewardship: The Reality

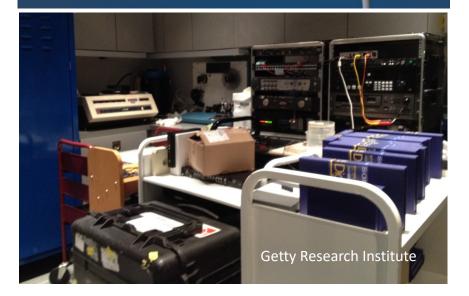


http://www.information-age.com/cloudcomputing-pharmaceutical-industry-123462676/

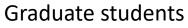




http://www.datamartist.com/data-migration-part-1-introduction-to-the-data-migration-delema



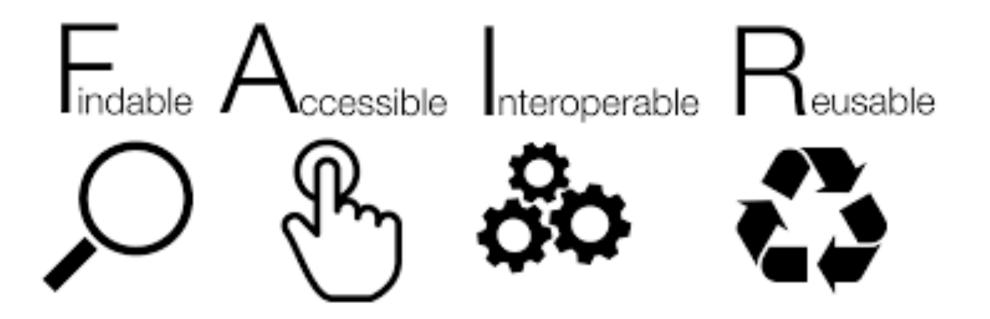






Post-doctoral fellows <sup>16</sup>

### Data Stewardship: The Ideal



Wilkinson, et al. (2016). The FAIR Guiding Principles for scientific data management and stewardship. *Scientific Data*, *3*, http://dx.doi.org/10.1038/sdata.2016.18

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### Open Science and the Role of Common Evidence

- Whose science?
  - Community practices
  - Investigators' hypotheses, theories, models, methods, code...
- Whose data?
  - Global, comparative, fungible
  - Local, integrative, specific
- Whose evidence?
  - Common, cumulative, collaborative
  - Data creators' advantage





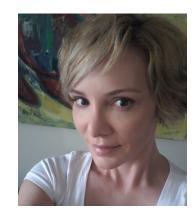
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