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R&D Data*
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Connecting Research, Publications, and Evidence: The Lifecycle and Institutional Ecology of Data

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The Lifecycle and Institutional Ecology of Data



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DISCLAIMER

- These opinions are my own, they are not the opinions of MIT, Brookings, any of the project funders, nor (with the exception of co-authored previously published work) my collaborators

Motivations

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Recognized Benefits of Data Sharing

- Pioneering NRC report [Fienberg, et. al 1985] on data sharing recommended:
 - Sharing data should be a regular practice.
 - Investigators should share their data by the time of publication of initial major results of analyses of the data except in compelling circumstances.
 - Data relevant to public policy should be shared as quickly and widely as possible.
 - Plans for data sharing should be an integral part of a research plan whenever data sharing is feasible.
- Numerous subsequent reports recommend data sharing.

Increased Retractions, Allegations of Fraud

The New York Times

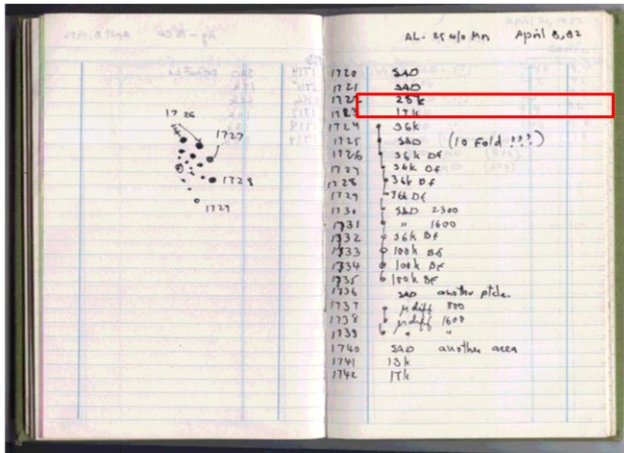
Fraud Case Seen as a Red Flag for Psychology Research

Dr. Stapel was able to operate for so long, the committee said, in large measure because he was "lord of the data," the only person who saw the experimental evidence that had been gathered (or fabricated). This is a widespread problem in psychology, said Jelte M. Wicherts, a psychologist at the University of Amsterdam. In a recent survey, two-thirds of Dutch research psychologists said they did not make their raw data available for other researchers to see. "This is in violation of ethical rules established in the field," Dr. Wicherts said.

In a survey of more than 2,000 American psychologists scheduled to be published this year, Leslie John of Harvard Business School and two colleagues found that 70 percent had acknowledged, anonymously, to cutting some corners in reporting data. About a third said they had reported an unexpected finding as predicted from the start, and about 1 percent admitted to falsifying data.

Unpublished Data Ends up in the “Desk Drawer”

- Null results are less likely to be published → published results as a whole are biased toward positive findings
- Outliers are routinely discarded → unexpected patterns of evidence across studies remain hidden



Daniel
Schechtman's
Lab Notebook
Providing
Initial
Evidence of
Quasi Crystals

Erosion of Evidence Base

- Researchers lack archiving capability
- Individualized incentives for preserving evidence base are weak



Examples

Intentionally Discarded "Destroyed, in accord with [nonexistent] APA 5-year post-publication rule."

Unintentional Hardware Problems "Some data were collected, but the data file was lost in a technical malfunction."

Acts of Nature The data from the studies were on punched cards that were destroyed in a flood in the department in the early 80s."

Discarded or Lost in a Move "As I retired Unfortunately, simply didn't have the room to store these data sets at my house."

Obsolescence "Speech recordings stored on a LISP Machine...., an experimental computer which is long obsolete."

Simply Lost "For all I know, they are on a [University] server, but it has been literally years and years since the research was done, and my files are long gone."

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Research by:
ICPSR

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4 Compliance with Data Sharing Policies is often Low

- ▶ Compliance is low even in best examples of journals
- ▶ Checking compliance is labor-intensive without citation and repository standards



Report on the American Economic Review Data Availability

Table 1: Data and code submission results by year of publication

	2006	2007	Mar-08
Articles Published ⁷	98	100	22
Articles Subject to Data Policy	61	63	11
Articles Investigated	13	24	2
With Readme File	12	23	1
	(92%)	(96%)	(50%)
With complete submission ⁸	7	12	1
	(54%)	(50%)	(50%)
With proprietary data instructions	1	10	0
	(8%)	(42%)	(0%)
Articles Investigated believed replicable without contacting the author(s)	8	22	1
	(62%)	(92%)	(50%)

Got Replicability?

The Journal of Money, Credit and Banking Archive

B.D. McCULLOUGH¹

Table 1: Lifetime Compliance

Journal	Empirical articles	Entries	Compliance %
<i>J. App. Econometrics</i>	292	290	99
<i>Fed. St. Louis Review</i>	219	162	74
<i>JMCB</i>	193	66	34
<i>J. Bus. Econ. Statistics</i>	342	121	35

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Trends toward Reuse

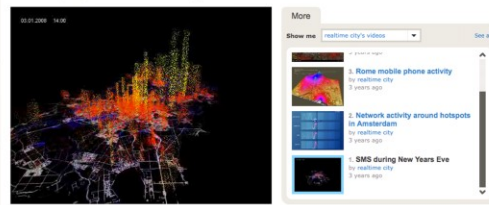
More Data



More Open



Shifting Evidence Base



Visualization of SMS activity in Amsterdam during New Years Eve

More Learners



Publish, then Filter



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High Performance Collaboration (here comes everybody...)



LHC produces a PB every 2 weeks, Sloan Galaxy zoo has hundreds of thousands of “authors”, 50K people attend a class from the University of Michigan, and to understand public opinion instead of surveying 100’s of people per month we can analyze 10000 tweets per second.

Observations

- There is an increasing recognition of the importance of access to data for verification, replication, meta-analysis, evaluation, and reuse
- Trends in the practice of science toward big data, crowdsourcing, post publication filtering, collaboration, and multidisciplinary analysis make data availability increasingly important
- Access to the scientific evidence base is uneven, and long-term access is at risk

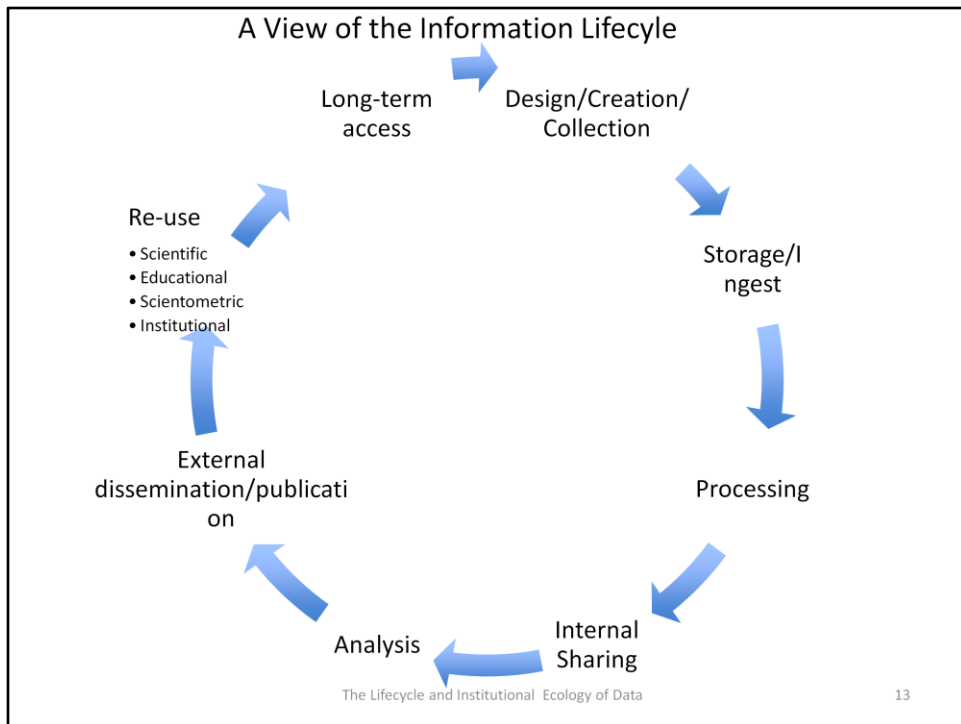
Lifecycle and Institutional Ecology

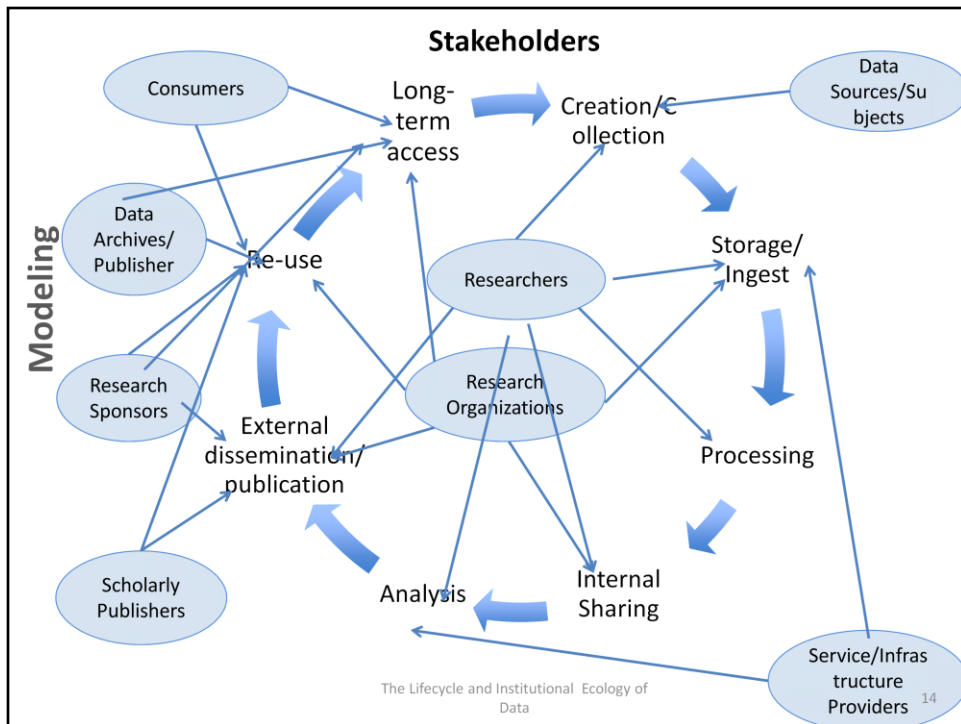
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Scientific Publications \neq Science

- Publications are a summary of portions of the science conducted
- Often, to fully understand, replicate, and extend the science requires:
 - data produced by the science
 - external data
 - external publication
 - software
 - sometimes even ... “lab notebooks”, records of data collection, research conduct

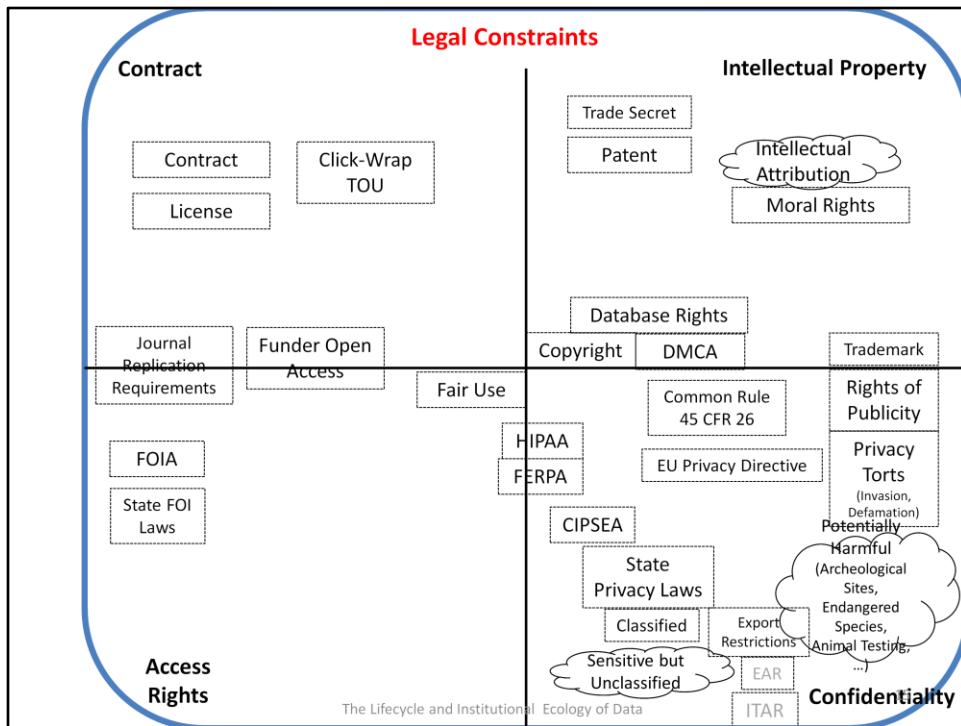


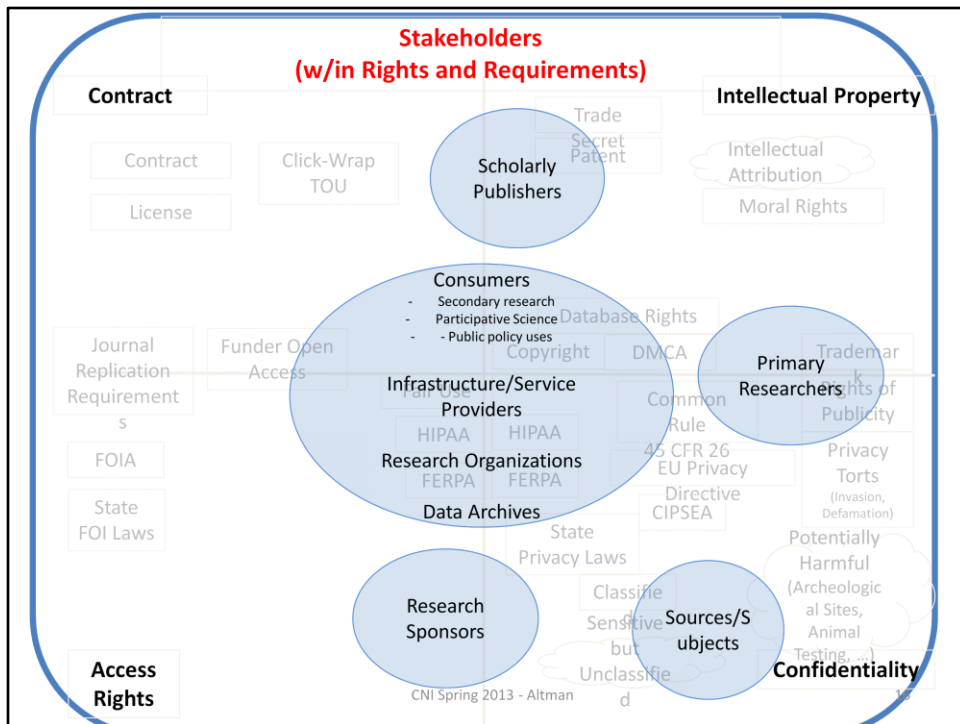


Most of the different stakeholders have stronger relationships/stakes with research at different stages.

But researchers and research institutions are in the middle – they have a strong stake in most stages

Researchers are more directly concerned with collection, processing, analysis, dissemination. Organizations have a higher stake in internal sharing, re-use, long-term access.





Core Dimensions of Shared Information Infrastructure

- Stakeholder incentives
 - recognition; citation; payment; compliance; services
- Dissemination
 - access to metadata; documentation; data
- Access control
 - authentication; authorization; rights management
- Provenance
 - chain of control; verification of metadata, bits, semantic content
- Persistence
 - bits; semantic content; use
- Legal protection
 - rights management; consent; record keeping;
- Usability for...
 - discovery; deposit; curation; administration; annotation; collaboration
- Economic model
 - valuation models; cost models; business models
- Trust model
 - verification; transparency; enforcement

See: King 2007; ICSU 2004; NSB 2005; Schneier 2011

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Observations

- Publications are a summary of portions of the science conducted – the scientific evidence base is much larger
- Effective data management policies will engage with information lifecycle, stakeholders, incentives, core dimensions of information infrastructure

Potential Leverage Points

Data Management Plans

- Operational Values
 - Orchestrate data for *efficient and reliable use within a designated research project*
 - Control *disclosure*
 - *Compliance* with contracts, regulations, law, and institutional policy
 - Ensure short term and long term *dissemination*
- Use-value
 - predicted future value of the information asset*
 - Value to research group
 - Value to institution
 - Value to discipline
 - Value to science & scholarship
(e.g. through interdisciplinary discovery and access, scientific reproducibility, reducing publication & related bias)
 - Value to public
(wide reuse, public understanding, participative science, and transparency in public policy)
 - Minimize disclosive harms
(e.g. breaches of confidentiality, taking of intellectual property) – to subject populations, intellectual rights holders, general public

Data Management Planning Principles

- **Information stewardship**
 - View information as potentially durable assets
 - Manage durable assets for long-term sustainable use
- **Awareness of information lifecycle**
 - Information organization & architecture
(Metadata, identification, provenance, data structure & format)
 - Processes
- **Awareness beyond disciplinary boundaries**
 - Inter-disciplinary discovery
 - Multi-disciplinary access
- **Justify Trust**
 - Trust but verify
 - Demonstrate trustworthiness of repositories, stewardship organizations,

Citation and Identification

- *Citation and identification is a key tool for information management and scholarly communication that supports*
 - *Provenance; Attribution; Discovery; Evaluation*
- Any information that is essential for the full understanding of a published work should be cited as a part of the scholarly record
- Persistent identifiers for data (e.g. through **DataCite**, **The Dataverse Network**), persistent identifiers for researchers (e.g. through **ORCID** and **ISNI**), and citation practices that incorporate these (see Altman 2013; Altman & King 2007) are now available, or rapidly becoming available

Scientific Approaches to Information Privacy

- Inconsistent and overly simplified treatment of information confidentiality and security are a barrier to efficient access to and reuse of research data.
- Reports from the National Research Council [2005, 2009], have reinforced that data produced or funded by government agencies should continue to be made available for research through a variety of modes, including:
 - full access to original data under appropriate license and security restrictions
 - mediated access to confidential data through interactive systems
 - and open access to data altered to maintain confidentiality.
- For many interesting forms of data (networks, geospatial trails) and data collections release of a static anonymization is not realistically achievable
- Treatment of data privacy risks should be based on scientifically informed analysis that includes [Vadhan 2011]:
 - the likelihood of risks being realized
 - the extent and type of the harms that would result from realization risks
 - the availability and efficacy of technical, computational/statistical, and legal methods to mitigate risks.
- Ad-hoc data usage agreements and consent terms hinder data interoperability and reuse
- Advances in the field of information privacy are yielding more sophisticated protection methods

Multi-Institutional Stewardship

- Many institutions hold unique digital assets for which long-term access is desired
- Content management by single institution is subject to single-point failure from [Reich & Rosenthal 2005]:
 - Third party attacks
 - Institutional funding
 - Change in legal regimes
 - Unintentional curatorial modification
 - Loss of institutional knowledge & skills
 - Intentional curatorial de-accessioning
 - Change in institutional mission
- Emerging approaches
 - Multi-institutional stewardship organizations (e.g. **LOCKSS**, **Data-PASS**, **MetaArchive**)
 - Recognized good practice development (e.g. through the **National Digital Stewardship Alliance**, and **Research Data Alliance**)
 - Trusted repository standards (e.g. **TRAC**, **The Data Seal of Approval**)
 - Trust engineering approaches (e.g. through **SafeArchive**, **IRods**)
 - Interoperable API's and licenses

Observations

- Effective access to data often requires interoperable API's , metadata, licenses
- Effective access to data often requires multi-institutional collaboration
- Trust, but verify – compliance is not assured: use incentives (e.g. attribution); transparency; auditing, etc.

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Questions?

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