# Measuring the adoption of open science

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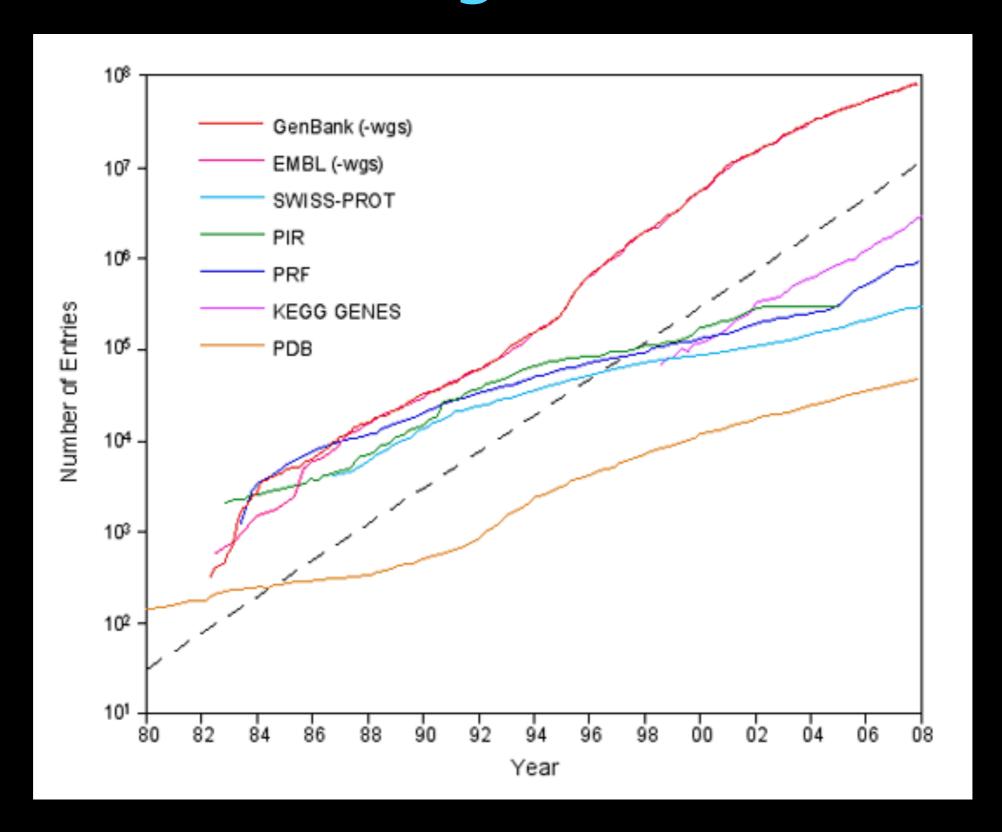
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#### you can not manage what you do not measure

# Measuring the adoption of open science sharing data

#### lots of data sharing!



### but how much isn't shared?

what isn't shared?

who isn't sharing it?

why not?

how much does it matter?

what can we do about it?

## I'll be highlighting the results of a number of studies:

surveys manual reviews citation analyses

#### Preview

Although some scientists voluntarily share their research data, many don't.

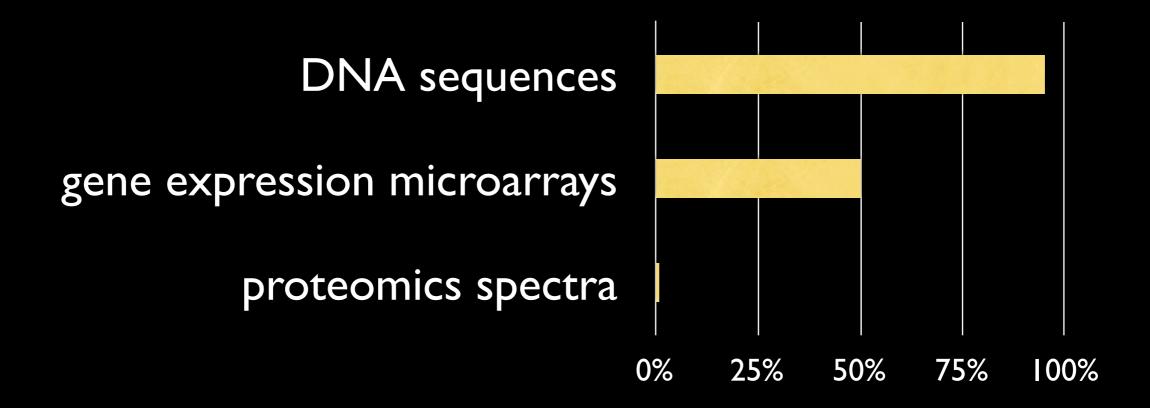
Data withholding correlates with the usual suspects.

Feedback on incentives may surprise you.

Much room for continued research, including several ways that you can help.

### How much data gets shared?

## Data sharing frequency depends on datatype



Noor et al. PLoS Biology 2006. Ochsner et al. Nature Methods 2008. Piwowar et al. PLoS ONE 2007. Editorial. Nature Biotech 2007.

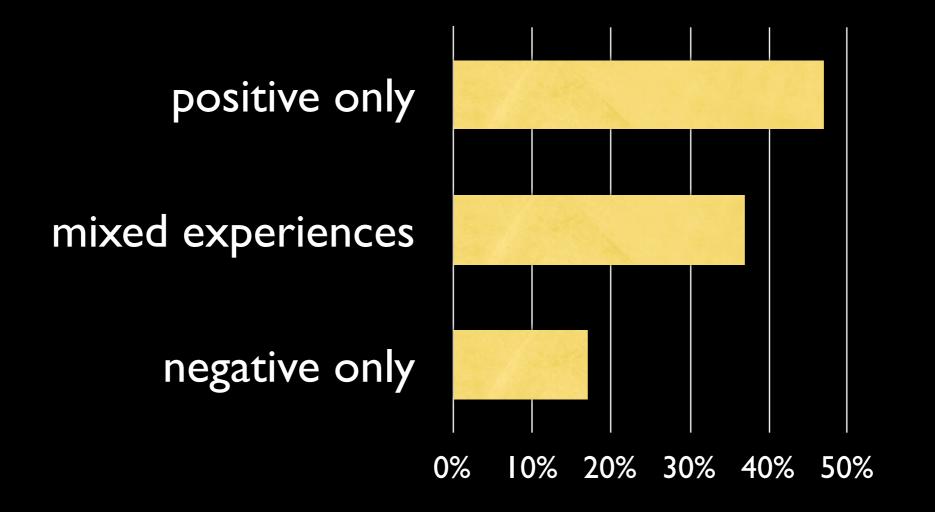
# Data sharing frequency depends on who you ask

self-reported denying a request in last 3 years trainees self-reported denying a request been denied access to data, materials, code authors "not able to retrieve raw data" not willing to release data 0% 10% 30% 40% 20%

> Campbell et al. JAMA. 2002. Kyzas et al. J Natl Cancer Inst. 2005. Vogeli et al. Acad Med. 2006. Reidpath et al. Bioethics 2001.

# Are the outcomes of data sharing positive or negative?

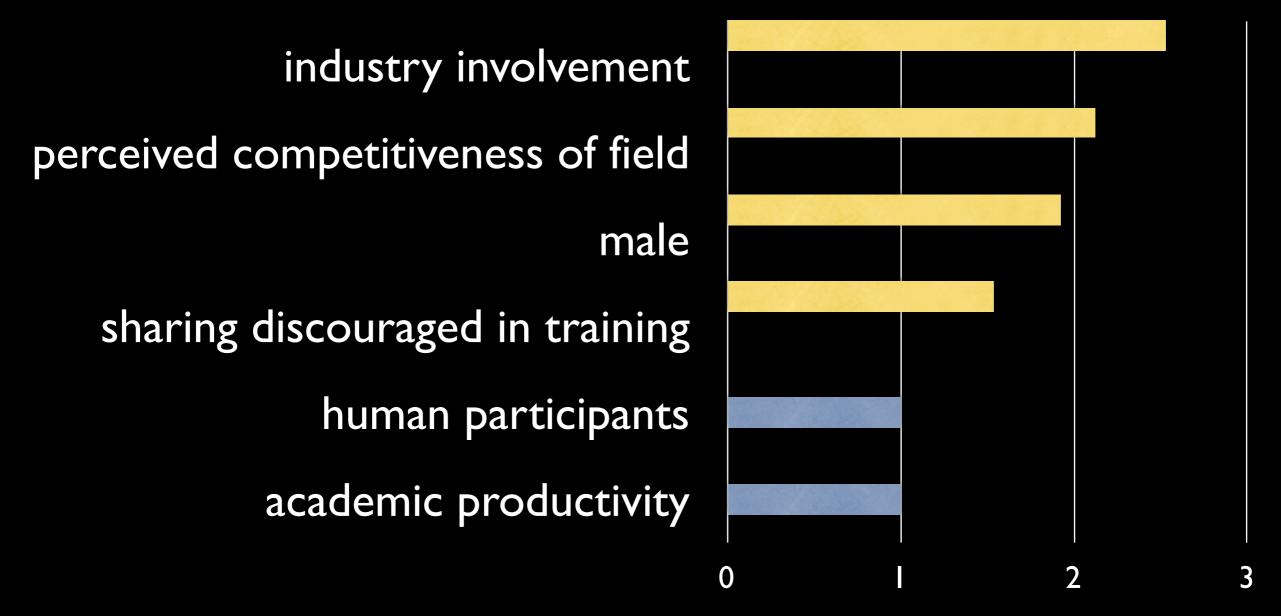
# 80% of scientists report positive experiences from data sharing



Positive experiences: collaboration, new research, etc. Negative: scooping, preventing publishing, IP, or \$\$ benefit, etc.

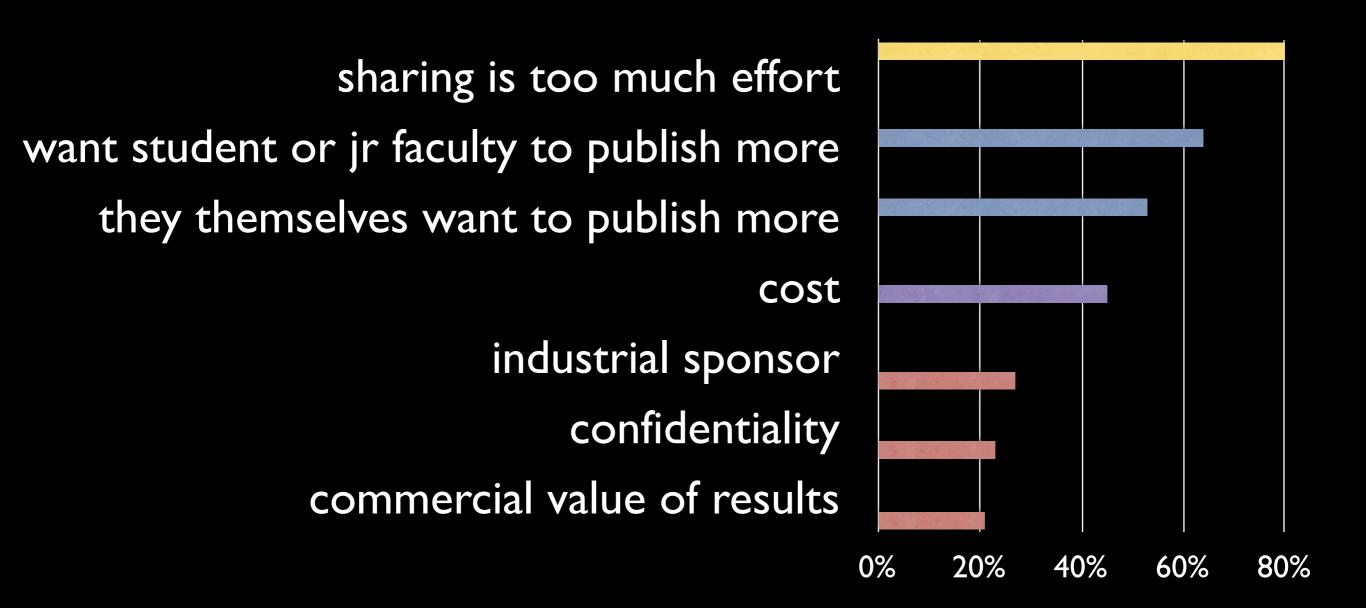
### Why is data withheld?

# Withholding is associated with industry links, competiveness



40% of surveyed scientists said data sharing was discouraged during their training!

## Withhold because too much effort, desire for continued publishing



## Obstacles for sharing: *publishing*, *control*, *cost*

want to publish more papers first

want exclusive use
ensure data confidentiality
control
avoid cost of preparation

0% 10% 20% 30% 40% 50%

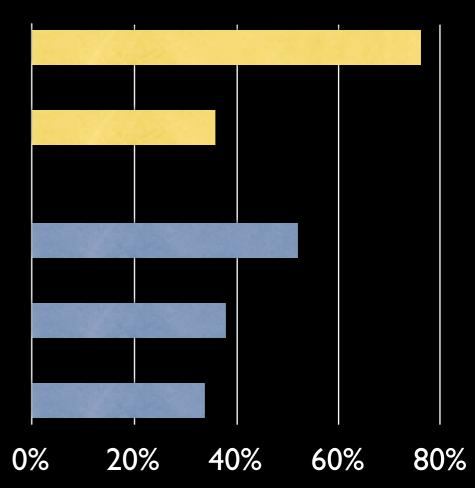
#### Comments show desire for control

- `Before I send you the data could I ask what you want it for?'
- 'Can you be more explicit, please, about the <u>analyses you have in</u> mind and what you plan to do with them?'
- 'We'll have to discuss your request with the other coauthors. Before we do that, I'd like to know your proposed analysis plan.'
- 'We are not finished using the data, but when we are finished with it, we would be open to requests for the data.'
- `Any use of the data other than for the specific purpose laid down in the contract of collaboration is effectively ruled out.'

# What are the perceived and measured benefits?

#### Benefits both societal and personal

saves other people effort
for the public good
will be cited and enhance my reputation
saves me effort in answering questions
saves me effort in managing my data



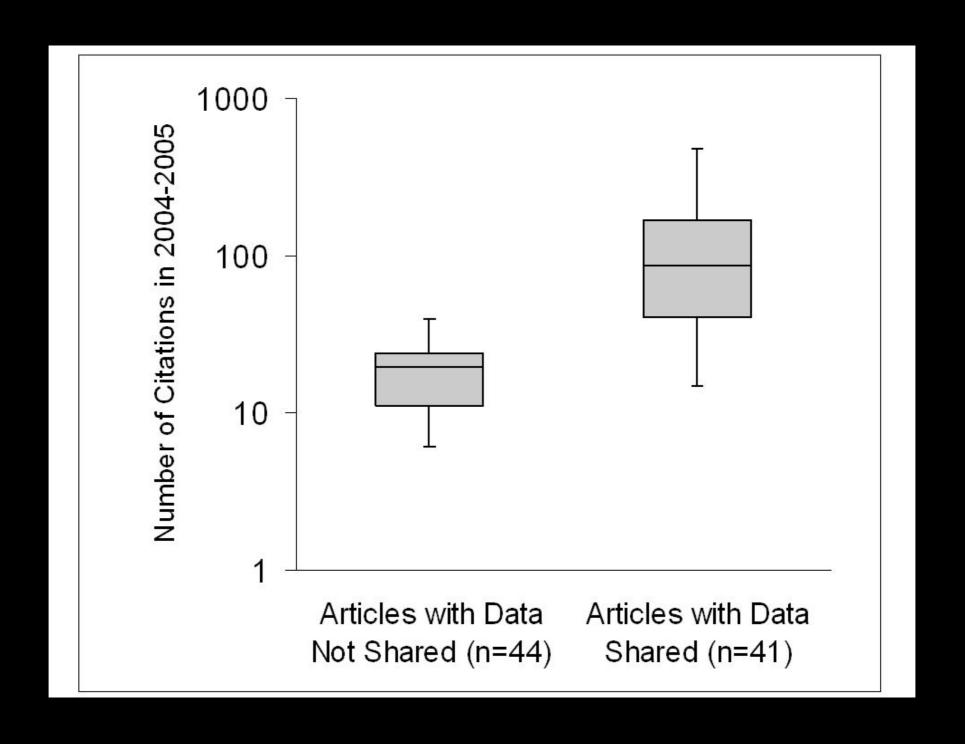
#### Measuring societal benefit

- assume each database hit saves \$0.10, or a fraction of data collection costs
- assume the value is approximated by the (idealized) funding target for data maintenance:

20-25% the cost of generating the data

Remembering, moreover, the indirect benefits are much higher than the direct ones.

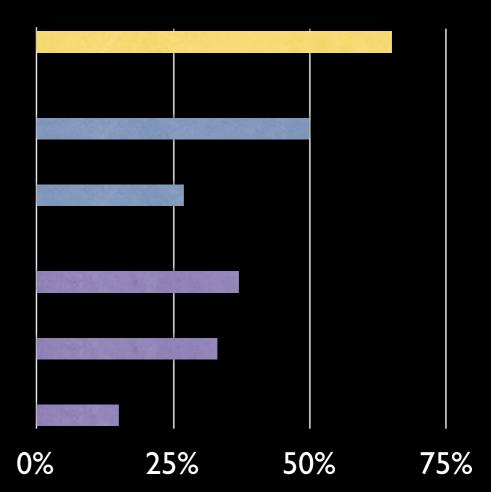
### Measuring personal benefit: increased citations



#### What incentives are valued?

# Incentives to share: perceived value, mandates, recognition as publication

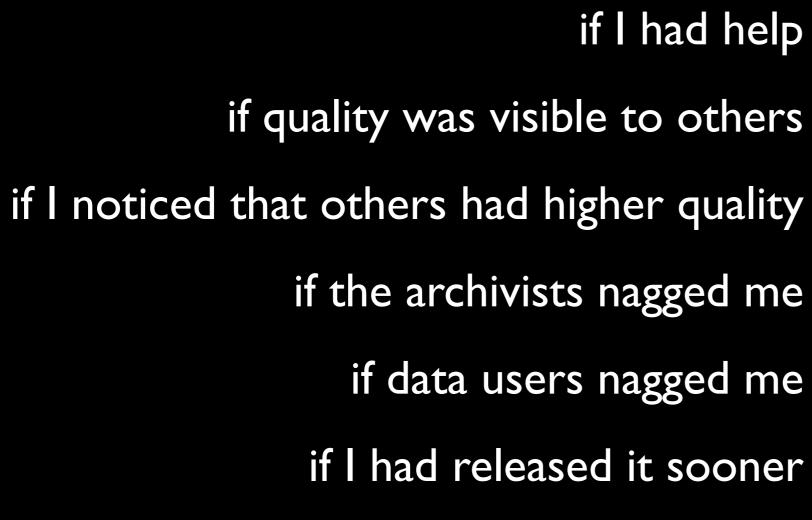
if I thought it would really benefit others
if required for future funding
if required for publication
if deposits counted as a publication
if citations to data were valued
if monetary compensation

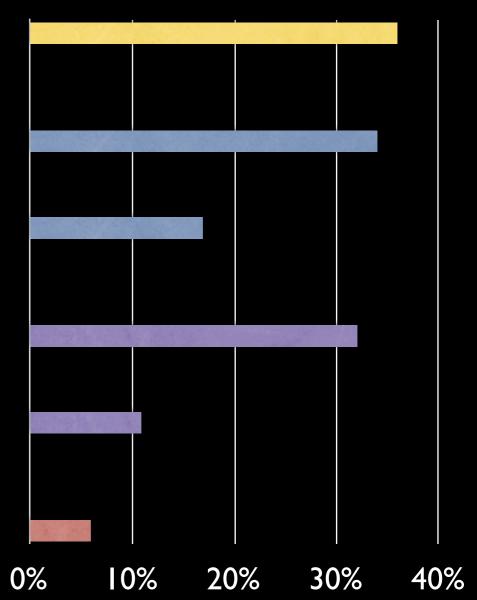


# What would make it easier? help and straightforward guidelines



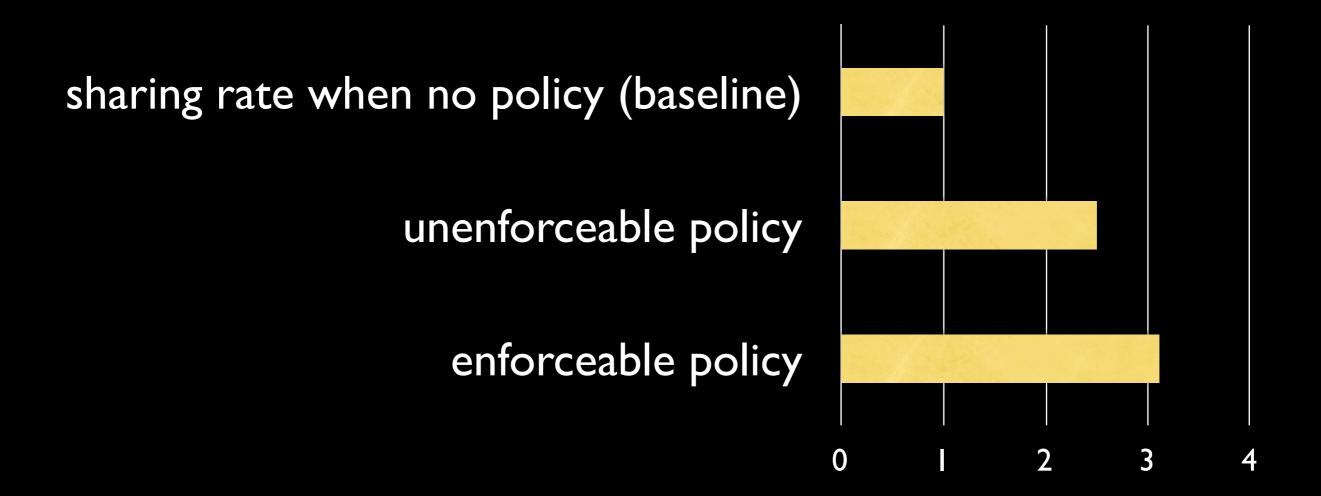
# Incentives for quality and docs: help, visibility, and nagging





### Do journal mandates work?

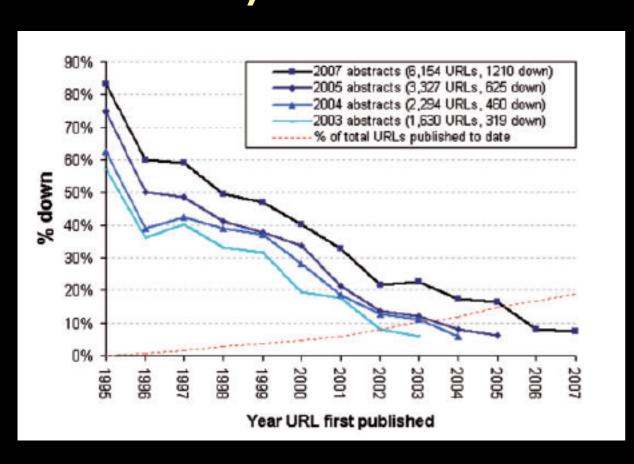
## Journals with *enforceable policies* have more shared datasets



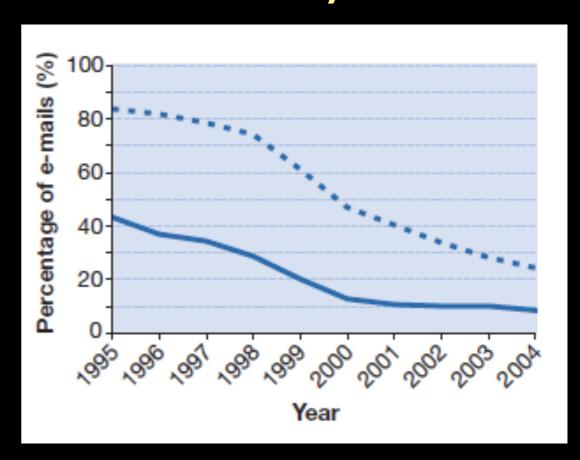
#### Once shared, always there?

### Data contacts and storage *decay* with time

#### **URL** decay:



#### email decay:



Supplementary information: in 6 top journals: 5% unavailable after 2 years, 10% unavail after 5 years

Evangelou et al. FASEB J. 2006. Wren. Bioinformatics 2008. Wren et al. EMBO Rep 2006.

### Anything else?

# data completeness? replicability? theoretical models of info behaviour?

Good questions. Out of time. Ask or see online bibliography for more info.

#### Do funder mandates work?

Which subdisciplines have best practices? particular weaknesses? why?

Good questions. Research underway.... NIH: Haga, S.

Exploring Attitudes About Data Disclosure and Data-Sharing in Genomics Research.

**NSF**: Hedstrom, M.

Incentives for Data Producers to Create Archive-Ready Data Sets.

National Inst of Nursing Research: Pienta, A. Barriers and Opportunities for Sharing Research Data.

**NLM training grant**: Piwowar, H. *Impact, prevalence, and patterns of shared biomedical data.* 

+others

### In some cases do the costs outweigh the benefits?

Do mandates decrease quality of shared data?

What is the prevalence of data reuse?

What would facilitate reuse?

Good questions. We don't know. Future research!

### Conclusions

#### Take home #1

Although some researchers voluntarily share data, many don't.

the frequency of sharing depends on data type, who you ask, how you ask, what you plan to do with the data, what journal it is published in....

#### Take home #2

Withholding is correlated with the usual suspects:

desire to publish more, avoid effort, maintain control, industry relationships.

Relative value of incentives is surprising: demonstrated value, visibility, help, straightforward guidelines, effective mandates, and nagging:)

Each of us can make a difference here:

Write letters to the editor about journal policies, blog a how-to guide in plain English, get involved in data standards, offer help to colleagues, communicate instances of value.

#### Take home #3

Much room for future research: costs and benefits, data quality, reuse ....

Opportunities for traditional large-scale grants across a range of disciplines and agencies

But also opportunity for impact in less formal channels: You can help communicate anecdotes, evaluations, and visualizations

via blogs, published research notes, perspectives, letters to the editor, and water-cooler conversations.

#### you can not manage what you do not measure

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If we measure current behaviour, we'll learn how to **facilitate** the adoption of open science, and

We'll know what and when to celebrate!

#### Thanks to

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Study references available at <a href="http://www.citeulike.org/user/hpiwowar/tag/psb-talk">http://www.citeulike.org/user/hpiwowar/tag/psb-talk</a>
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