



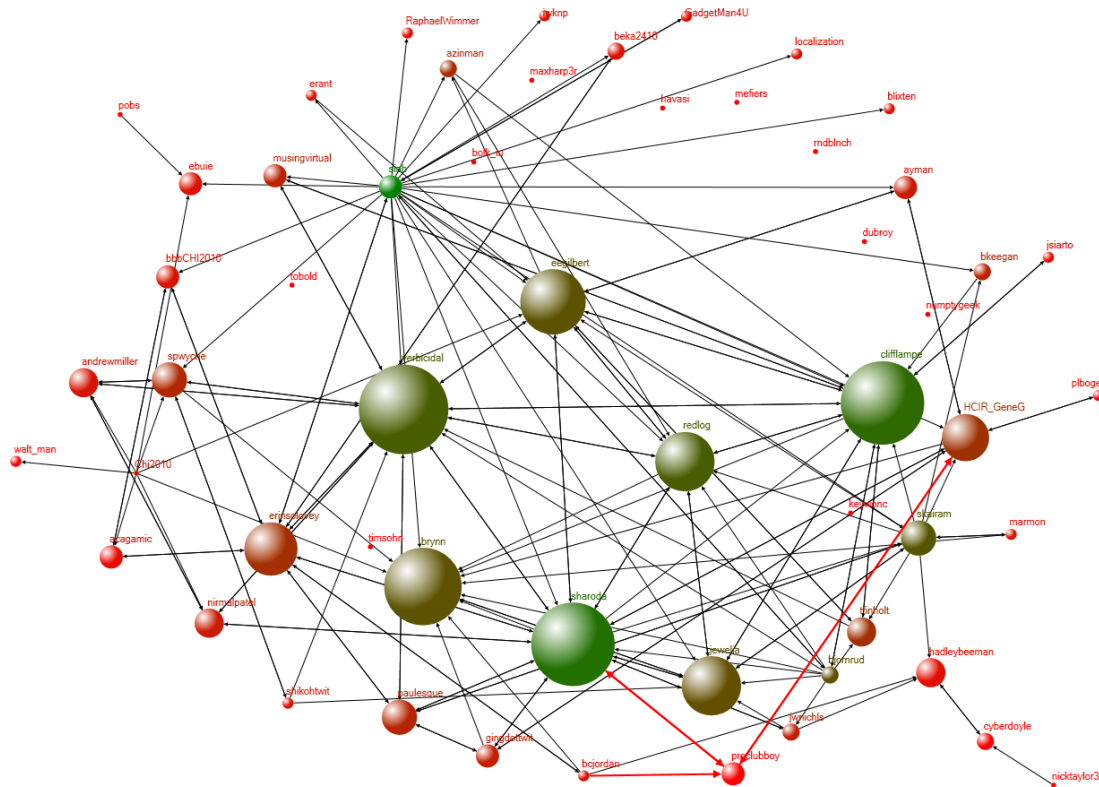
# **Altmetrics Applied Fiesole 2013**

Jennifer Lin  
Sr Product Manager, PLOS

# PLOS: Brief History

- Founded in 2003 as an open access publisher, Public Library of Science
- Seven journals today in life sciences & biomedical science
- Published 80k+ articles to date
- Mission: transform scholarly communications

# Networked-enabled research is premised on the capacity for connectivity

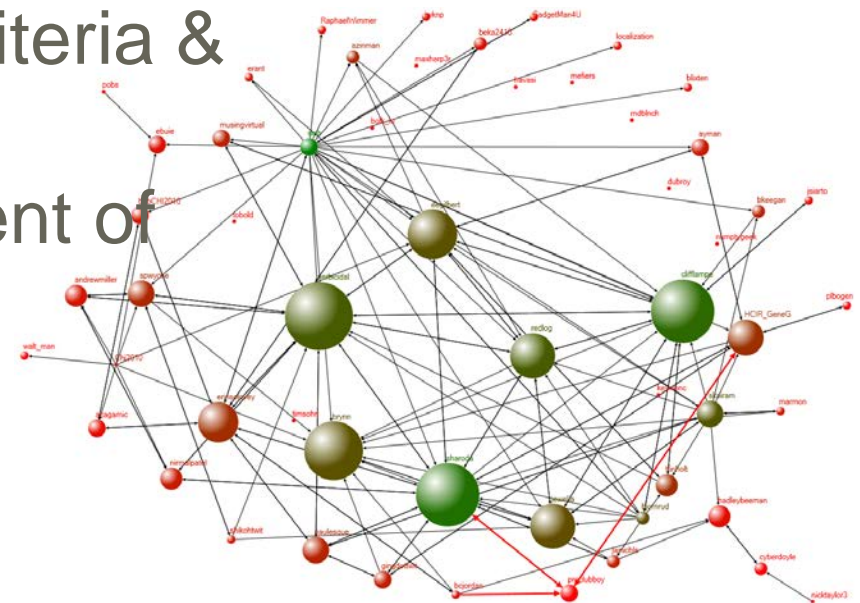


See Cameron Neylon's Feb 6, 2012 blog post on "network-enabled research":  
<http://cameronneylon.net/blog/network-enabled-research/>.

# PLOS: Optimize network-enabled research by building infrastructure that supports more efficient transactions

Over the past ten years:

- Open access for all
- Re-defined publication criteria & categorization
- Tracking and measurement of dissemination



## Article-Level Metrics

# The Measurement Dilemma



# Measurement of research

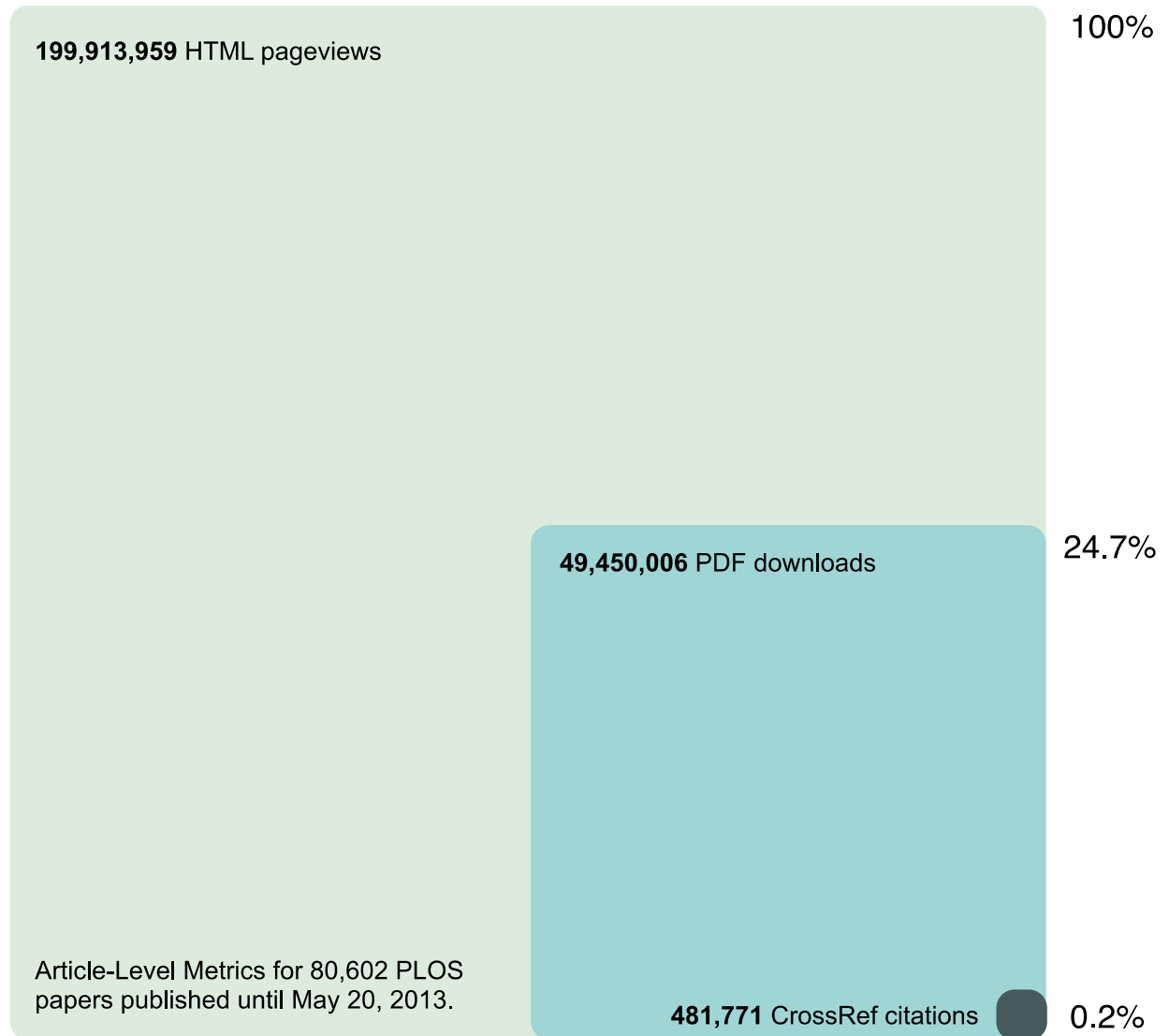
Researchers work within a diverse ecosystem of channels to share, comment, critique new research:

- article access,
- scholarly and nonscholarly citations,
- blog and news coverage,
- social network sharing
- research community conversations

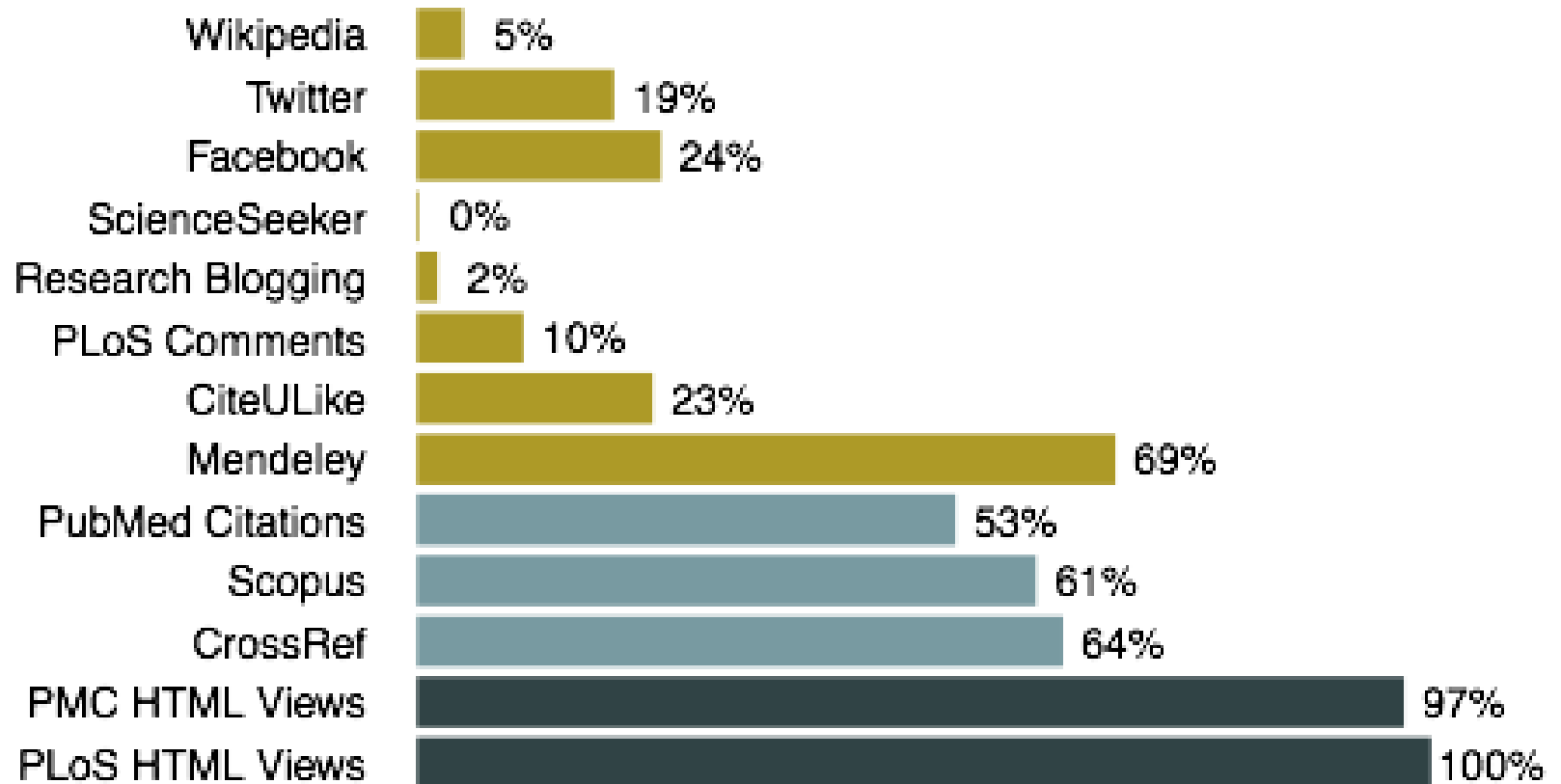


**Article-Level Metrics captures this activity and measures it in a transparent and comprehensive manner.**

# Conventional measures are a part of the puzzle...



# A broader view of research engagement



Proportion of articles covered by source

Metrics for 77,385 PLOS articles. Data collected April 11, 2013



# Article-level metrics add granularity and more dimensions

## Usage

PLOS Journals  
(HTML, PDF,  
XML)

PubMed Central  
(HTML, PDF)

## Citations

CrossRef  
Scopus  
Web of Science  
PubMed Central

## Altmetrics

PLOS Comments

Mendeley  
CiteULike  
ResearchBlogging

Facebook  
Twitter  
Wikipedia

F1000 Prime

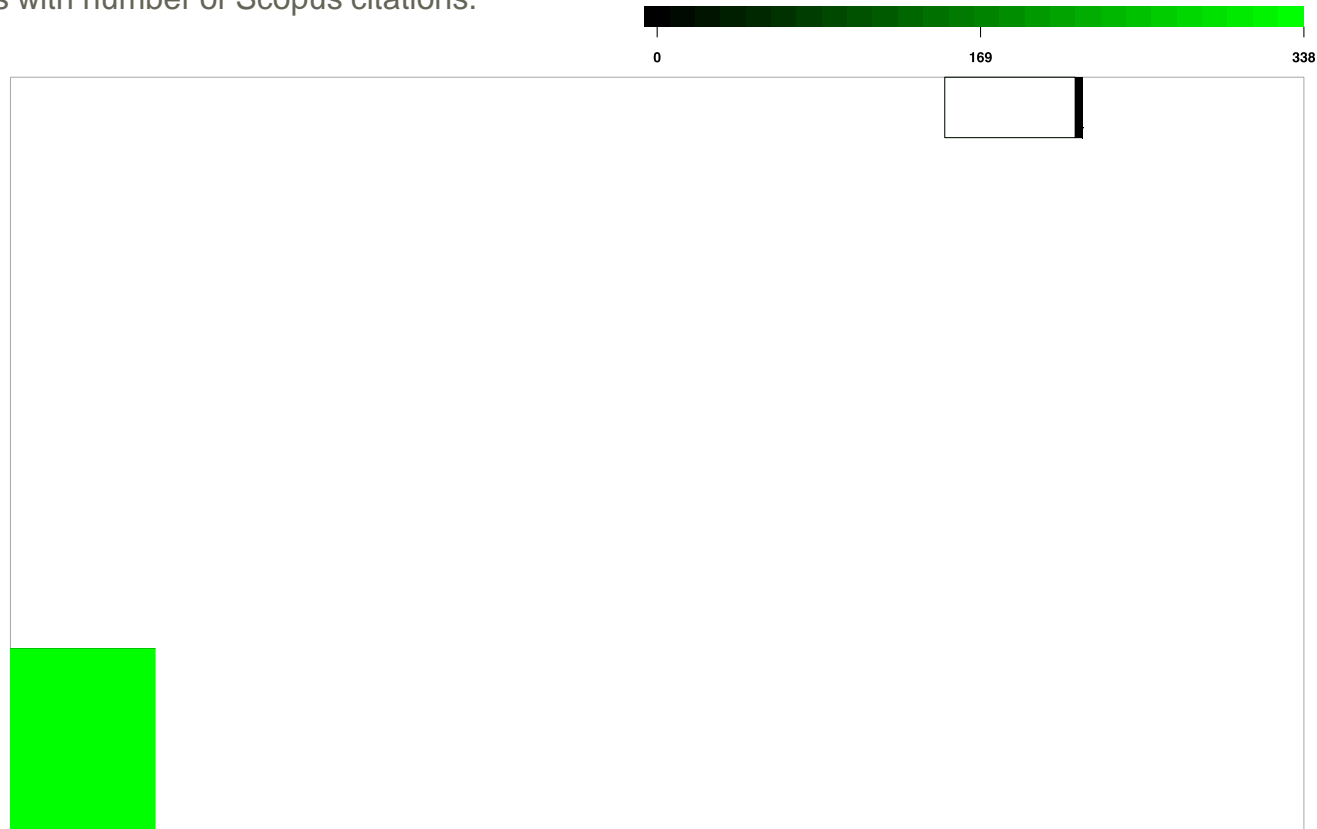
## Article-Level Metrics:

- Diverse and efficient measurement
- Increased diversity without losing traditional value
- Accelerated measurement response
- Flexibly accommodates varied uses

# ALMs reveal *what* articles are used

## Doris Duke Foundation funded PLOS articles

Rectangle size correlates with total views (HTML and PDF) from PLOS website. Color intensity correlates with number of Scopus citations.



Article Usage and Citations by Subject Category

# ALMs reveal *where* articles are used

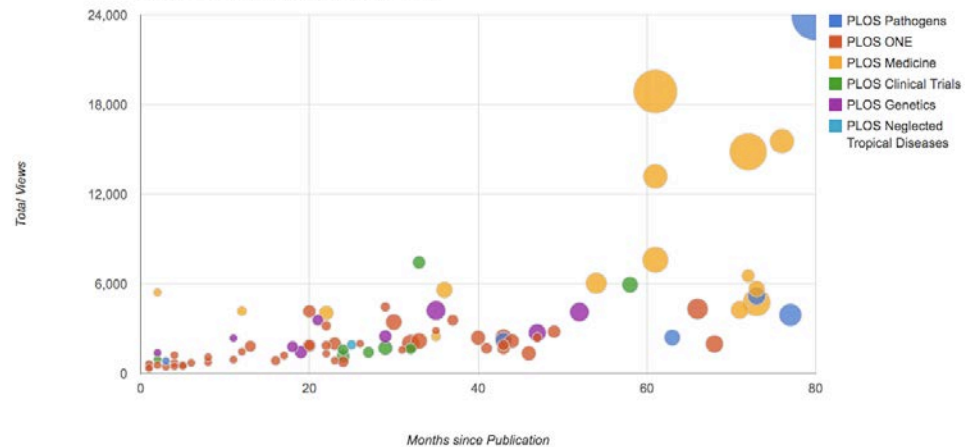
## Alzheimer's Association funded PLOS articles

Geolocation of 410 authors for 84 articles

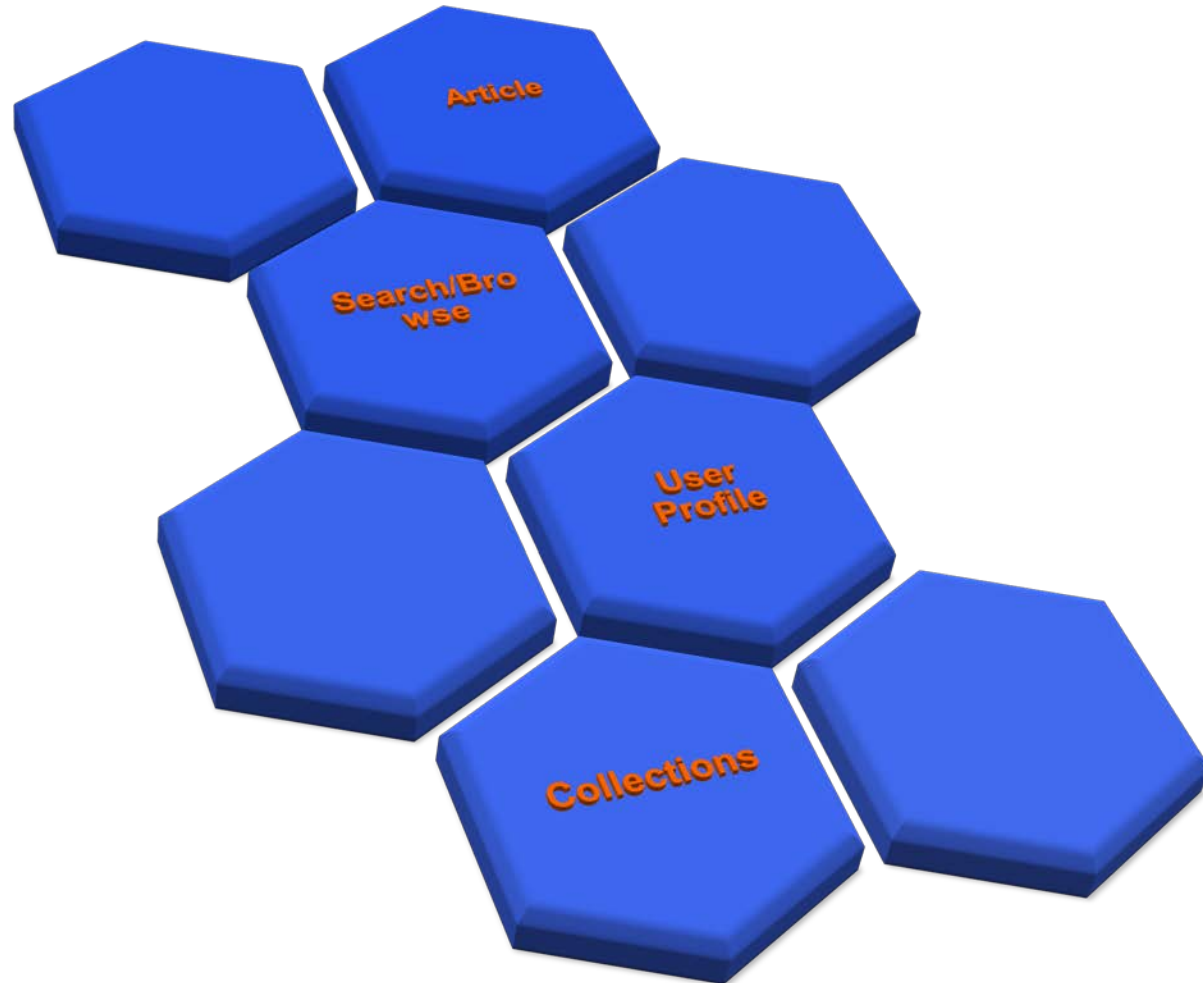


# ALMs reveal *how* is used

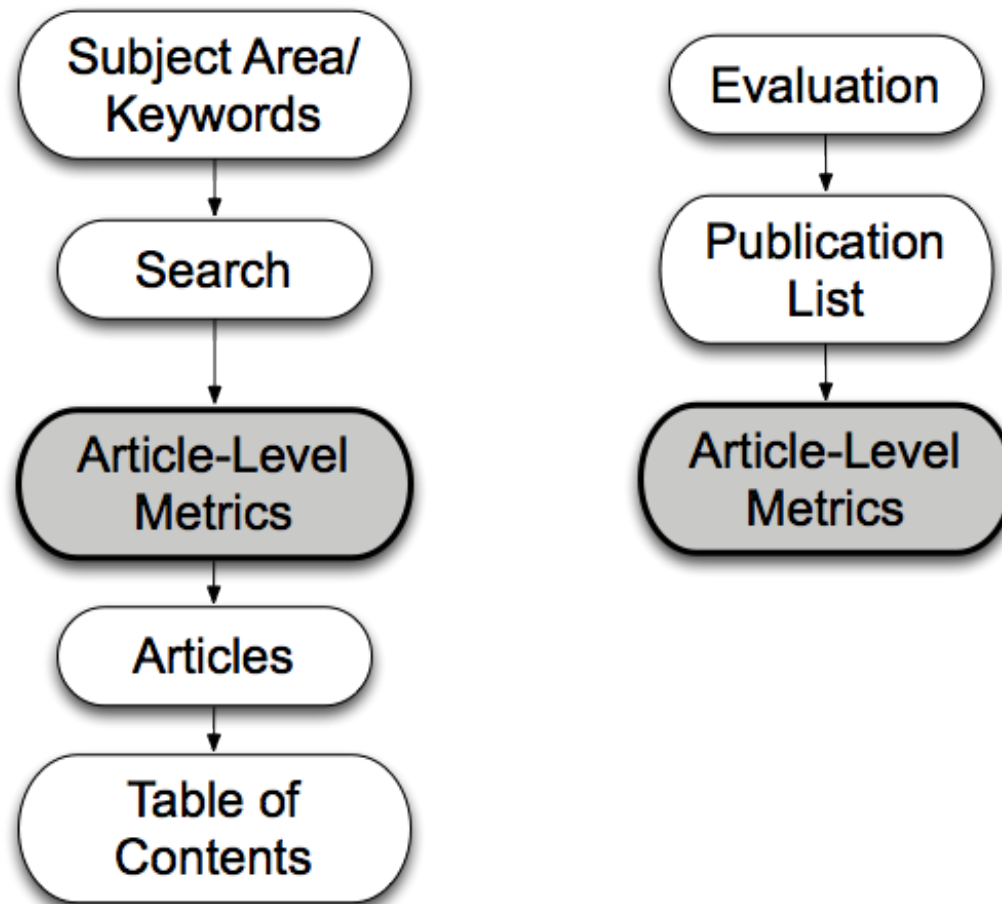
Article Usage and Citations as a function of Age



# Altmetrics Applied - PLOS Journals



# Integration of ALM into discovery and evaluation is work in progress



# ALMs at work

- article signposts
- search result listings
- sorting search results
- related content author listings
- RSS feeds
- [article recommendations]
- [researcher profiles]
- [editor assignments]

## Viewed ?

| Total Article Views                                  | HTML Page Views | PDF Downloads | XML Downloads | Totals  |         |
|--|-----------------|---------------|---------------|---------|---------|
| <b>118,523</b>                                       | 72,082          | 31,292        | 487           | 103,871 |         |
| Nov 20, 2008 (publication date) through May 7, 2012* | PDF             | 8,918         | 6,734         | n.a.    | 14,652  |
|  | Totals          | 81,000        | 37,026        | 487     | 118,523 |

46.71% of article views led to PDF downloads



BETA

Compare average usage for articles published in 2006 in the subject area:

Microbiology

Show reference set

\*Although we update our data on a daily basis, there may be a 48-hour delay before the most recent numbers are available. PMC data is posted on a monthly basis and will be made available once received.

## Cited ?

|        |          |     |                    |                |
|--------|----------|-----|--------------------|----------------|
| SCOPUS | Crossref | PMC | ISI Web of Science | Google Scholar |
| 1399   | 805      | 419 | 968                | Search         |

## Saved ?

|           |          |          |
|-----------|----------|----------|
| citeulike | Connotea | MENDELEY |
| 6         | 7        | 296      |

## Discussed ?

|                  |           |        |
|------------------|-----------|--------|
| nature.com/blogs | Wikipedia | Google |
| 3                | 10        | Search |



filter by +

Clear all filters

PLOS ONE X

Most cited, all time

54,832 results for University of Oklahoma

View as:  Figures |  ListSEARCH ALERT 

### **High-Throughput Sequencing of *Arabidopsis* microRNAs: Evidence for Frequent Birth and Death of MIRNA Genes**

Noah Fahlgren, Miya D. Howell, Kristin D. Kasschau, Elisabeth J. Chapman, Christopher M. Sullivan, Jason S. Cumbie, Scott A. Givan, Theresa F. Law, Sarah R. Grant, Jeffery L. Dangl, James C. Carrington  
Research Article | published 14 Feb 2007 | PLOS ONE  
10.1371/journal.pone.0000219

Views: 21,374 • Citations: 307 • Bookmarks: 112

### **A High Quality Draft Consensus Sequence of the Genome of a Heterozygous Grapevine Variety**

Riccardo Velasco, Andrey Zharkikh, Michela Troggio, Dustin A. Cartwright, Alessandro Cestaro, Dmitry Pruss, Massimo Pindo, Lisa M. FitzGerald, Silvia Vezzulli, Julia Reid, Giulia Malacarne, Diana Iliev, Giuseppina Coppola, Bryan Wardell, Diego Micheletti, Teresita Macalma, Marco Facci, Jeff T. Mitchell, Michele Perazzolli, Glenn Eldredge, Pamela Gatto, Rozan Oyzerski, Marco Moretto, Natalia Gutin, Marco Stefanini, Yang Chen, Cinzia Segala, Christine Davenport, Lorenzo Demattè, Amy Mraz, Juri Battilana, Keith Stormo, Fabrizio Costa, Quanzhou Tao, Azeddine Si-Ammour, Tim Harkins, Angie Lackey, Clotilde Perbost, Bruce Taillon, Alessandra Stella, Victor Solovyev, Jeffrey A. Fawcett, Lieven Sterck, Klaas Vandepoele, Stella M. Grando, Stefano Toppo, Claudio Moser, Jerry Lanchbury, Robert Bogden, Mark Skolnick, Vittorio Sgaramella, Satish K. Bhatnagar, Paolo Fontana, Alexander Gutin, Yves Van de Peer, Francesco Salamini, Roberto Viola  
Research Article | published 19 Dec 2007 | PLOS ONE  
10.1371/journal.pone.0001326

Views: 23,686 • Citations: 305 • Bookmarks: 140

### **Serum MicroRNAs Are Promising Novel Biomarkers**

Shlomit Gilad, Eti Meiri, Yariv Yogev, Sima Benjamin, Danit Lebanony, Noga Yerushalmi, Hila Benjamin, Michal Kushnir, Hila Cholakh, Nir Melamed, Zvi Bentwich, Moshe Hod, Yaron Goren, Ayelet Chajut  
Research Article | published 05 Sep 2008 | PLOS ONE  
10.1371/journal.pone.0003148

Views: 36,566 • Citations: 301 • Bookmarks: 155

#### Search History

University of Oklahoma  
university of oklahoma  
cancer  
lonnides

#### Related

##### Authors

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54,832 results for University of Oklahoma

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SEARCH ALERT

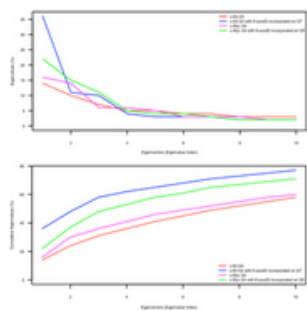


13 Feb 2008

### Oil Palm Research in Context: Identifying the Need for Biodiversity Assessment

Edgar C. Turner, Jake L. Snaddon, Tom M. Fayle, William A. Foster

Views: 10,674 • Citations: 21 • Bookmarks: 1169

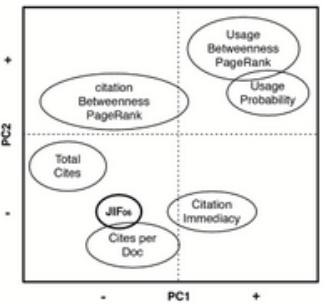


22 Aug 2012

### An *In Silico* Study of the Differential Effect of Oxidation on Two Biologically Relevant G-Quadruplexes:...

William J. D. Stebbeds, Joseph Lunec, Lee D. Larcombe

Views: 676 • Citations: None • Bookmarks: 446

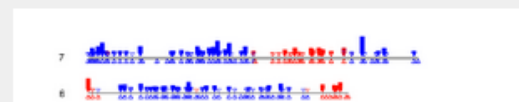


29 Jun 2009

### A Principal Component Analysis of 39 Scientific Impact Measures

Johan Bollen, Herbert Van de Sompel, Aric Hagberg, Ryan Chute

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OPEN ACCESS

ESSAY

# Why Most Published Research Findings Are False

John P. A. Ioannidis

829,438

VIEWS

915

CITATIONS

4,571

SAVES

5,408

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Article

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## Related PLOS Articles

When Should Potentially False Research Findings Be Considered Acceptable?

Most Published Research Findings Are False—But a Little Replication Goes a Long Way

Minimizing Mistakes and Embracing Uncertainty

## Comments

Open Access and the Skewness of Science: It Can't Be Cream All the Way Down



Hide Figures

## Abstract

Modeling the Framework for False Positive Findings

Bias



Testing by Several Independent Teams

## Abstract

### Summary

There is increasing concern that most current published research findings are false. The probability that a research claim is true may depend on study power and bias, the number of

# Co-Evolution of Transcriptional Silencing Proteins and the DNA Elements Specifying Their Assembly

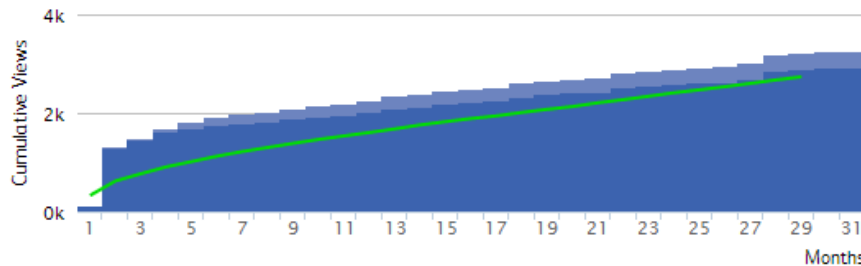
Oliver A. Zill , Devin Scannell, Leonid Teytelman, Jasper Rine 

Article | About the Authors | **Metrics** | Comments | Related Content

## Article Usage

| Total Article Views   |               | HTML Page Views | PDF Downloads | XML Downloads | Totals       |
|---|---------------|-----------------|---------------|---------------|--------------|
| <b>3,256</b><br><small>Nov 30, 2010 (publication date) through May 7, 2013*</small> | PLOS          | 2,255           | 594           | 64            | 2,913        |
|   | PMC           | 225             | 118           | n.a.          | 343          |
|   | <b>Totals</b> | <b>2,480</b>    | <b>712</b>    | <b>64</b>     | <b>3,256</b> |

**28.71% of article views led to PDF downloads**



**BETA**

■ Compare average usage for articles published in 2010 in the subject area: 

Evolutionary biology | [Show reference set](#)

\*Although we update our data on a daily basis, there may be a 48-hour delay before the most recent numbers are available. PMC data is posted on a monthly basis and will be made available once received.

- Views-downloads ratio
- Average usage: calculation for 1<sup>st</sup> & 2<sup>nd</sup> level subject categories available
- Incorporates papers of same publication year
- Full reference set displayed (link)

## ALM: Measuring the Impact of Research

Your List 0

ALM Reports allows you to view article-level metrics for any set of PLOS articles as well as summarize and visualize the data results.  
About | Samples | Send Us Feedback

1 Select Articles 2 Preview List 3 View Report

### Search all Articles

Keyword

Author

Author Country

Institution

Publication date

Subject Area

Journal

Funder name or funding number

Search Clear All

### Find Specific Articles

By DOI/PMID

Upload File

Browse the 'Best In Class' articles from PLOS



Explore sample reports



# ALM Reports

The ALM Reports application allows researchers, institutions & funders to:

- create a report of the ALMs for a single or set of PLOS articles
- view a summary of the metrics along with an accompanying set of data visualizations.

Users will be able to search based on:

- keyword
- author name & country
- institution
- publication date
- subject areas
- funder

*almreports.plos.org*

# ALM Reports

## Metrics

## Visualizations

1 Select Articles
2 Preview List
3 View Report

Metrics Data
Visualizations

[Edit List](#)  
[Start Over](#)

21-25 of 25 articles

**21** A Prospective Study of Red and Processed Meat Intake in Relation to Cancer Risk

Amanda J Cross, Michael F Leitzmann, Mitchell H Gail, Albert R Hollenbeck, Arthur Schatzkin, Rashmi Sinha

Research Article | published 11 Dec 2007 | PLOS Medicine  
10.1371/journal.pmed.0040325

Show all ALMs ▾

**Usage**

|                    |        |
|--------------------|--------|
| PLOS views         | 28,895 |
| PLOS PDF downloads | 3,828  |
| PLOS XML downloads | 150    |
| PMC views          | 4,219  |
| PMC PDF downloads  | 1,828  |
| Total usage        | 38,920 |

**Social Network**

|           |    |
|-----------|----|
| CiteULike | 1  |
| Mendeley  | 44 |
| Facebook  | 51 |

**Citation**

|                |     |
|----------------|-----|
| PubMed Central | 34  |
| CrossRef       | 72  |
| Scopus         | 105 |

**Blogs & Media**


|              |   |
|--------------|---|
| Nature Blogs | 1 |
| Wikipedia    | 6 |

**22** Meat Consumption and Cancer Risk


Jeanine M Genkinger, Anita Koushik

Research Article | published 11 Dec 2007 | PLOS Medicine


**Downloads**



**Metrics Data**  
1.2MB - CSV file



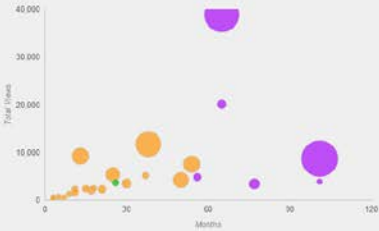
**Visualizations**  
5.7MB - PNGS in ZIP file



**Your List of Article DOIs**  
157K - CSV file

[Share](#)


**1** Article Usage and Citations as a function of Age




Total usage includes page views and downloads from PLOS and PMC. Bubble size correlates with Scopus citations and bubble color with the PLOS journal.

SOURCE: 25 published articles from December 26, 2004 to February 06, 2013


**Downloads**



**Metrics Data**  
1.2MB - CSV file



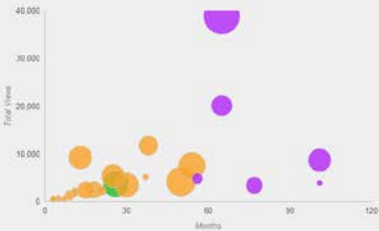
**Visualizations**  
5.7MB - PNGS in ZIP file



**Your List of Article DOIs**  
157K - CSV file

[Share](#)


**2** Article Usage and Mendeley Bookmarks as a Function of Time



Total usage includes page views and downloads from PLOS and PMC. Bubble size correlates with Mendeley bookmarks and bubble color with the PLOS journal.

SOURCE: 25 published articles from December 26, 2004 to February 06, 2013


**3** Article Usage by Subject Area



Rectangle size correlates with the number of articles associated with the subject area and the color intensity with total usage.

SOURCE: 25 published articles from December 26, 2004 to February 06, 2013

**4** Research Articles by Location



# Expanding utilization outside PLOS

Researchers use ALMs in various ways to track and communicate the progress of their work\*:

## With Whom?

*\* Author survey, July 2012*

University administrators, funding organizations (program managers), research collaborators, public relations departments & other promotion outlets

## How?

Formally:

- Curriculum Vitae
- grant & funding applications
- research assessments
- progress & merit report
- research reports

Informally:

- blogs,
- presentations,
- twitter
- web postings, conversations
- personal article management tools

# Expanding utilization within PLOS

## Improve Business Intelligence

- Strategically invest in trending areas and break into nearby market segments
- Optimize publicity efforts with more targeted campaigns (Call For Papers, conference presence, etc.)
- Increase revenue stream by launching new collections of papers in areas of interest
- Find new fields growing at the intersections between communities of interest
- Expand advertising revenue with customized paid advertising
- Improve marketing messages to communities of interest with data-driven decisions on everything from cover design to marketing text
- Enhance direct marketing efforts for improved circulation and paid subscription rates (as applicable)

## Deepen Editorial Capacities

- Conduct cross journal analysis: identify what to focus on and what is lacking across published content
- Manage and negotiate journal relationships and workflows when dealing with overlapping content areas
- Assess the strength and validity of previous editorial decisions re: publication using a data-driven approach
- Strategically direct invest editorial resources to promote new research of interest in growing fields
- Identify promotion opportunities for papers and authors (writing press releases, front matter content, editorial overviews, etc.)
- Uncover potential new authors

## Deliver a Richer Product

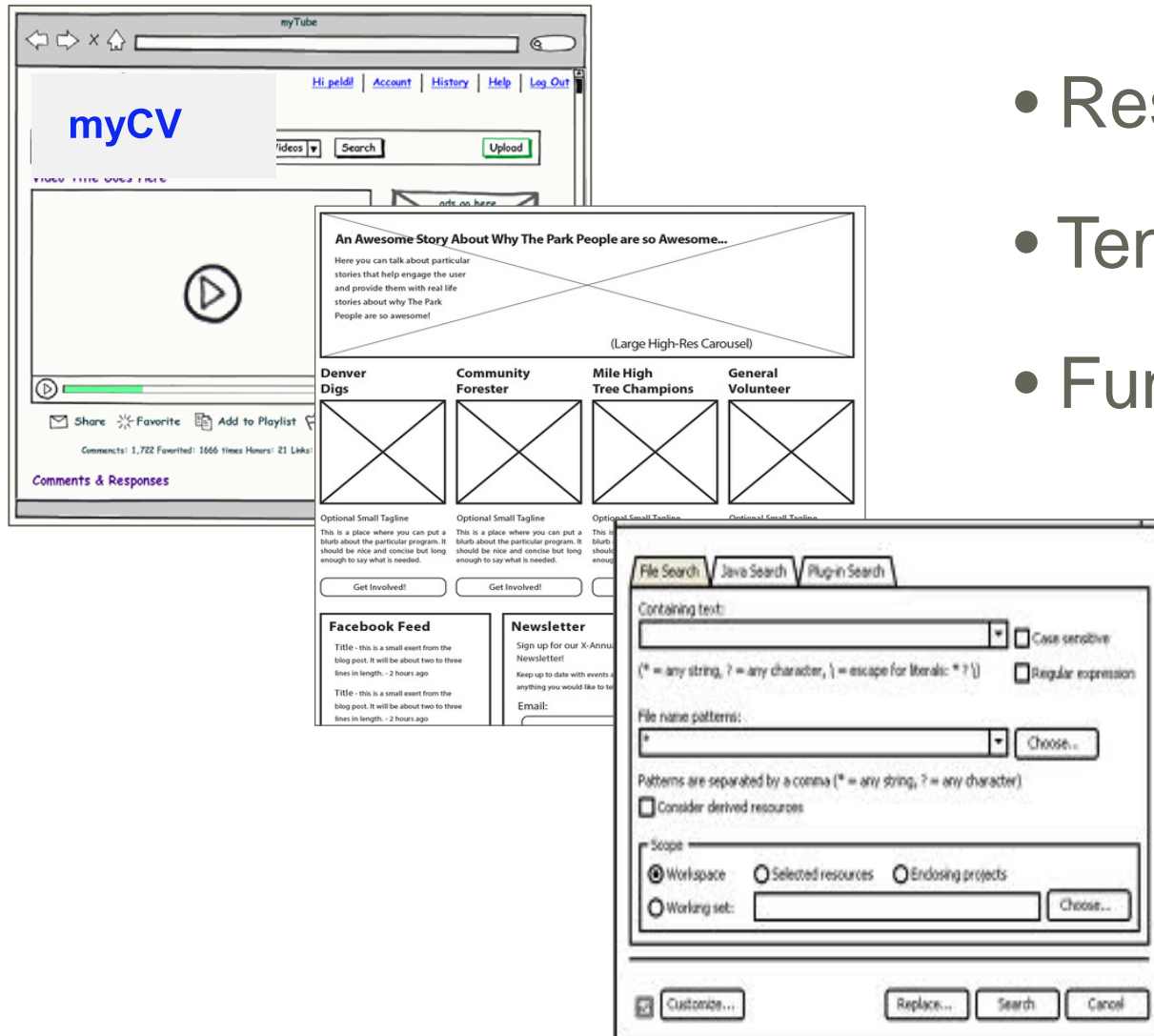
- Maximize front matter visibility with more valuable content
- Create more targeted editorial overviews
- Enhance press reviews and promotional content for high-impact papers

## Streamline Publishing Operations

- Effectively source papers in editorial board selection and reviewer assignments

# Altmetrics on the horizon

- Researcher CV
- Tenure Portfolio
- Funding Application





**No simple solution...**

**But that's where opportunity lies.**

# Next steps

- Coordination & standardization between data aggregators
- Breakthrough technologies to measure the current “unmeasurables” (downstream impact)
- Data validation and anti-gaming mechanisms
- New services & tools
- More bibliometric research to understand the new metrics

# Access is Critical Keep it Open

**Thank You**

Jennifer Lin

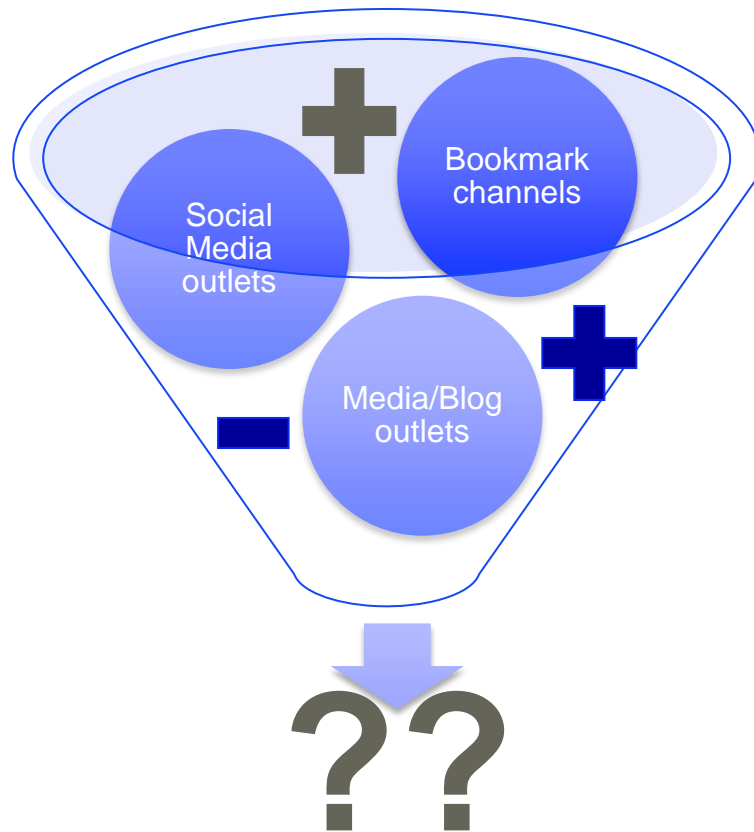
[jlin@plos.org](mailto:jlin@plos.org)

[@plosalm](#)

# Miscellany

# Nature of ALM data types - Issues to be aware of...

A. Landscape of data channels is constantly shifting



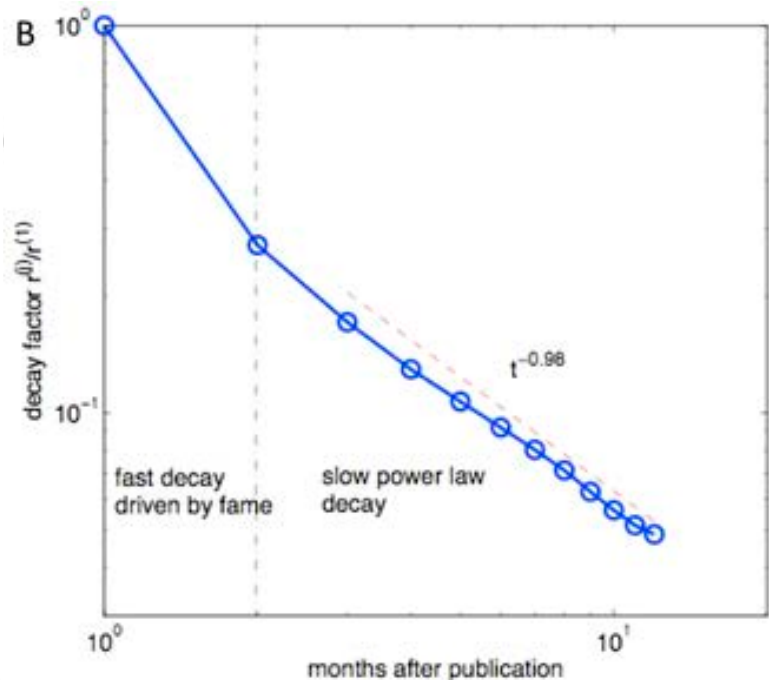
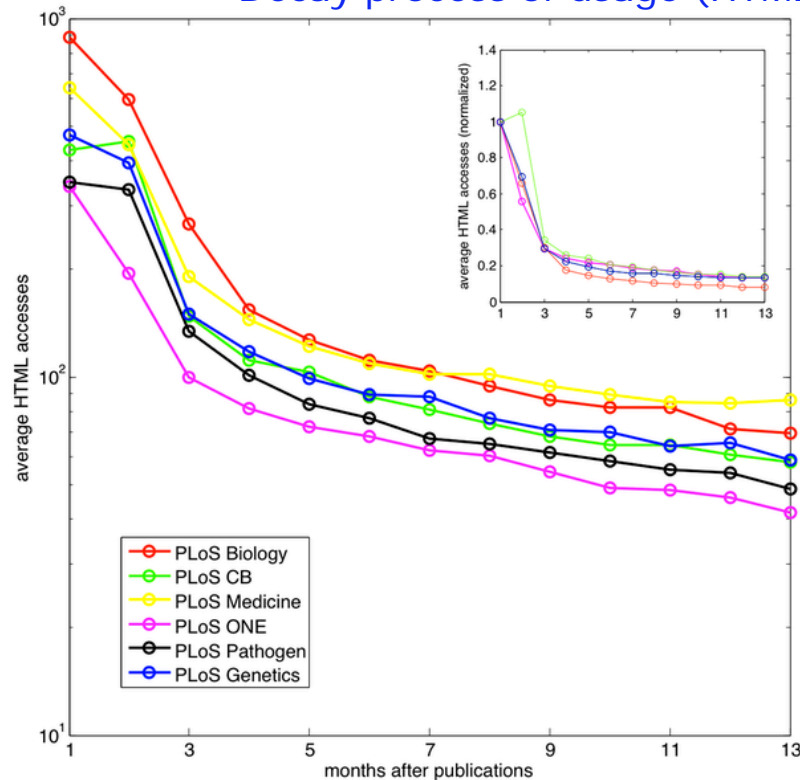
A. New data sources emerge and old ones disappear

B. Significance of each data channel constantly in flux (both waxes and wanes)

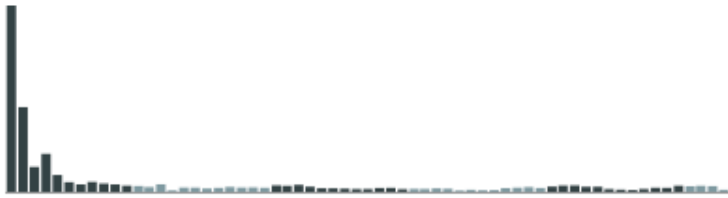
## B. Metric activity depends on age of article

- New papers – high rates of metric activity which decrease quickly
- Old papers – little activity with slower decline

Decay process of usage (HTML views) in six PLOS journals

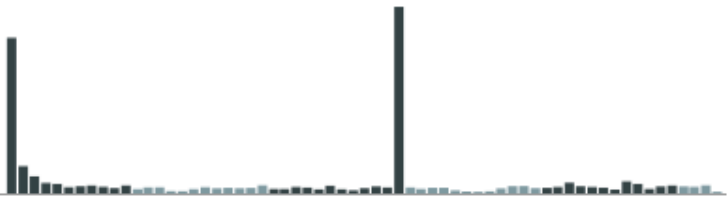


# Articles differ in usage over time



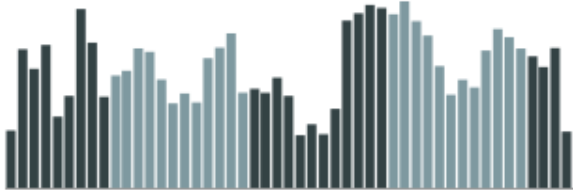
Initial Severity and Antidepressant Benefits: A Meta-Analysis of Data Submitted to the Food and Drug Administration

[10.1371/journal.pmed.0050045](https://doi.org/10.1371/journal.pmed.0050045)



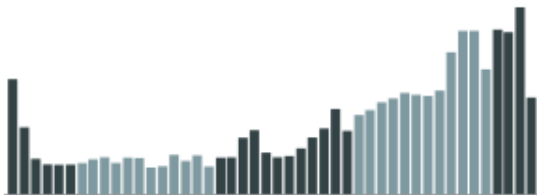
Lifetime Medical Costs of Obesity: Prevention No Cure for Increasing Health Expenditure

[10.1371/journal.pmed.0050029](https://doi.org/10.1371/journal.pmed.0050029)



The Preventable Causes of Death in the United States: Comparative Risk Assessment of Dietary, Lifestyle, and Metabolic Risk Factors

[10.1371/journal.pmed.1000058](https://doi.org/10.1371/journal.pmed.1000058)



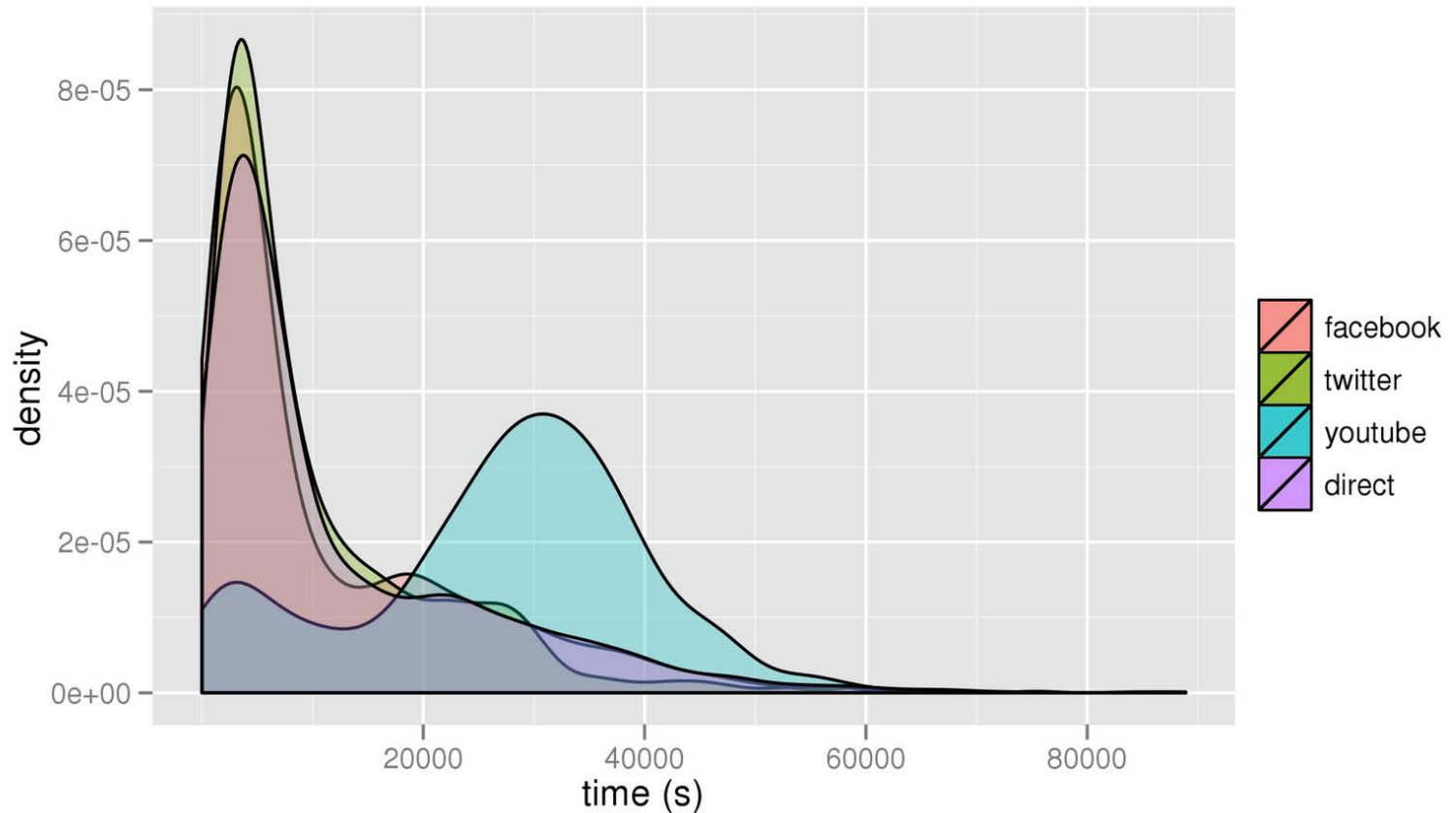
Preferred Reporting Items for Systematic Reviews and Meta-Analyses: The PRISMA Statement

[10.1371/journal.pmed.1000097](https://doi.org/10.1371/journal.pmed.1000097)

HTML views per month from PLOS website (April 18, 2013)

# Dissemination activity also changes over time across data channels.

Ex: Social Media Channels



Bit.ly study of 1000 bitly links.



## C. Data channels have disparate degrees of significance

Between channels

Ex: 1 blog reference  $\neq$  1 Wikipedia reference

1 Tweet  $\neq$  1 Mendeley bookmark

1 Facebook Like  $\neq$  1 citation manager download

1 Facebook comment  $\neq$  1 PLoS article comment

1 NYTimes citation  $\neq$  1 New Scientist mention

Within channels

Ex: 1 blog reference  $\neq$  1 blog reference



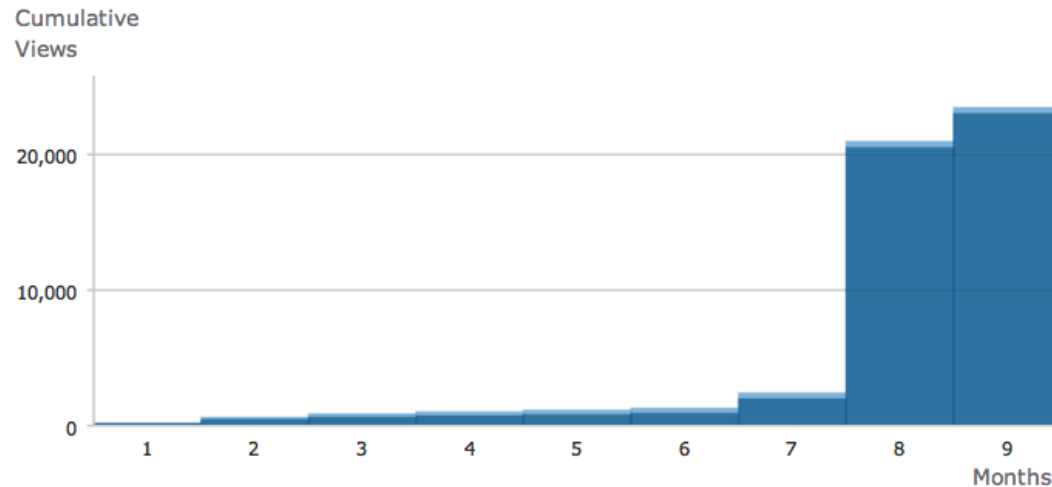


# E. Gaming and Spam

- Data integrity functionality
- Community norms and policing

## Article Usage ⓘ

| Total Article Views   |               | HTML Page Views | PDF Downloads | XML Downloads | Totals        |
|---|---------------|-----------------|---------------|---------------|---------------|
| <b>23,475</b><br>Jan 26, 2012 (publication date)<br>through undefined NaN, NaN* | <b>PLoS</b>   | 22,683          | 283           | 60            | 23,026        |
|   | <b>PMC</b>    | 276             | 173           | n.a.          | 449           |
|   | <b>Totals</b> | <b>22,959</b>   | <b>456</b>    | <b>60</b>     | <b>23,475</b> |



\*Although we update our data on a daily basis, there may be a 48-hour delay before the most recent numbers are available. PMC data is posted on a monthly basis and will be made available once received.