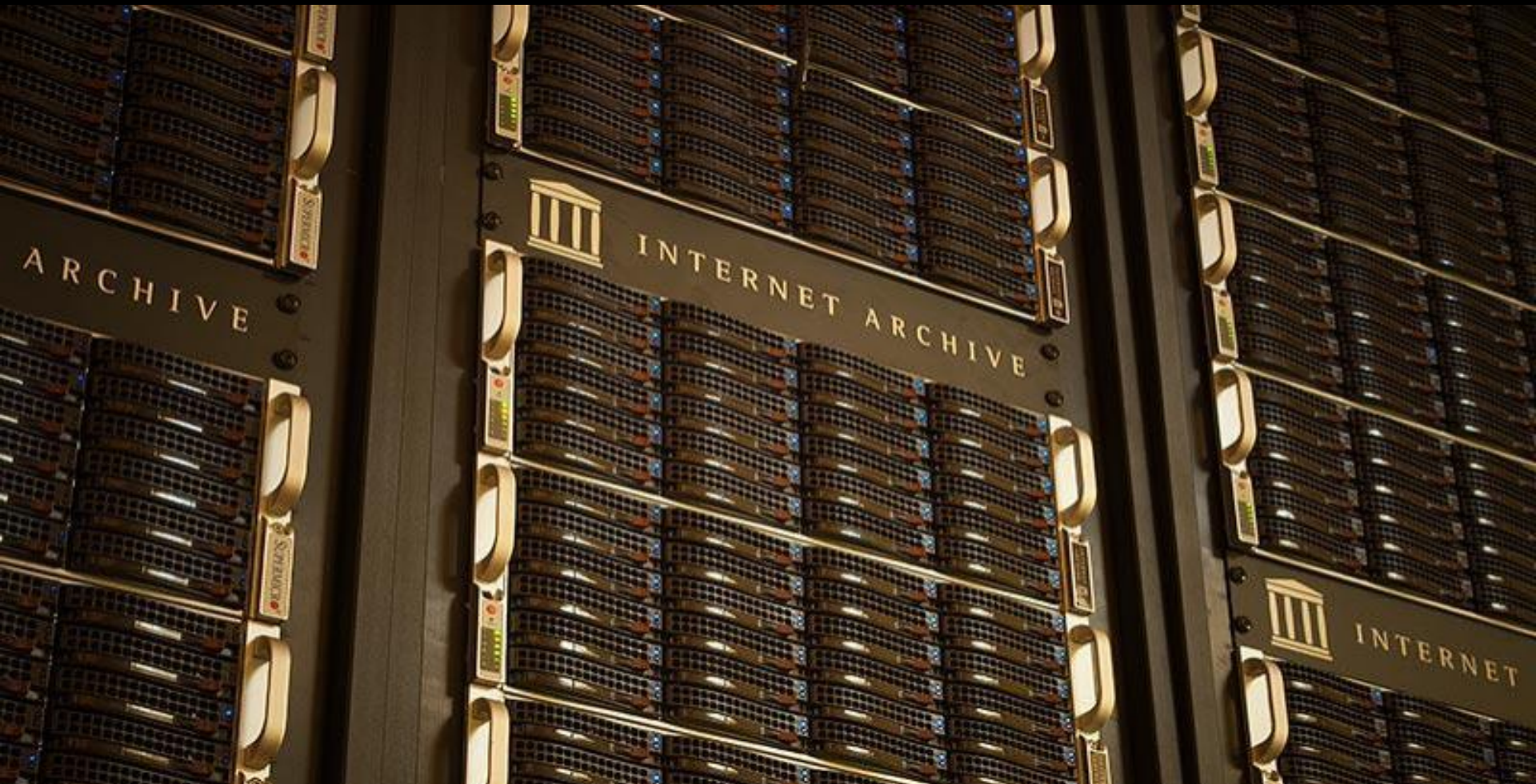


From Open Access to Perpetual Access: Archiving Web-Published Scholarship



Maria Praetzellis

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IIPC WAC 2019 | maria@archive.org**

Outline

1. Archiving (Digital) Scholarship
2. Conceptual Approaches
3. Technical Approaches
4. Fatcat Beta Walkthrough
5. Fat Machine Learning Cat

Outline

1. Archiving (Digital) Scholarship

Archiving Digital Scholarship One-Liner

Build a complete, use-oriented, highly-available archive and knowledge graph of every publicly-accessible scholarly output + descriptive metadata and full-text, linked with versions and secondary outputs (data/blogs/etc) with a priority on long-tail, at-risk publications -- all accessible via API-first editable, distributed catalog that includes links to files in the web archive



Goals/Concepts of this Work

- Apply automation & scale of web harvesting to archiving specific content (scholarly works)
- Extract and add metadata to improve discovery of those resources in web archives
- Apply above to past web archives
- Use machine learning to improve processes
- Provide API-first access to this corpus
- Provide non-profit, open infrastructure for perpetual access to knowledge

Some Numbers

1. There are ~150-200M scholarly articles
 - a. How can we get all that are on the web
 - b. Once archived, how can we make all discoverable w/o knowing (wayback) URL
2. There are ~600M PDFs in Wayback Machine
 - a. How can we know which are scholarship
 - b. Once known, how can we make those discoverable w/o knowing (wayback) URL

Outline

1. Archiving (Digital) Scholarship
2. Conceptual Approaches

Conceptual Approaches 1

1. Identifier & metadata services (DOIs, ISSNs, etc) contain URLs of scholarly works
 - a. We will archive the metadata and the URLs
2. Web-scale harvesting is cheap in time/resources to archive ten/hundred millions of scholarly works
 - a. Automate for “scrape-to-crawl-to-find” process
3. Many efforts are aggregating scholarship but not for perpetual access and not the long-tail stuff
 - a. Advance work via partnerships, manifests sharing, system/service integrations

Conceptual Approaches 2

- **Top-down:**

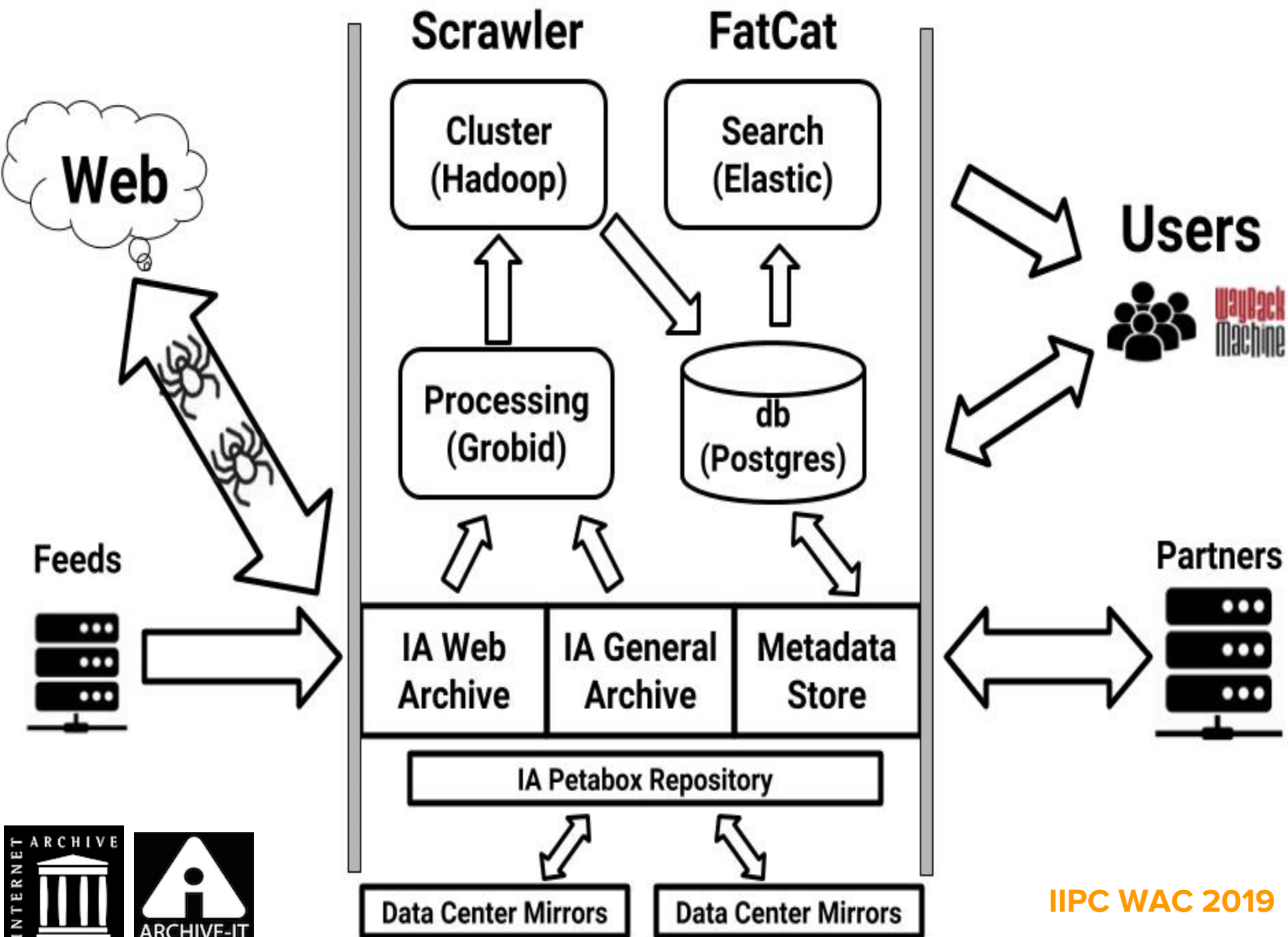
- Use lists/IDs/MD/etc to target harvesting and associate scholarship with metadata
- Extract metadata from archived works

- **Bottom-up:**

- ML/algorithms to identify scholarly works already in the archive, assess quality of preservation of a web-only publication
- ML/algorithms to identify, archive, and associate “secondary” works (data, blog, etc)

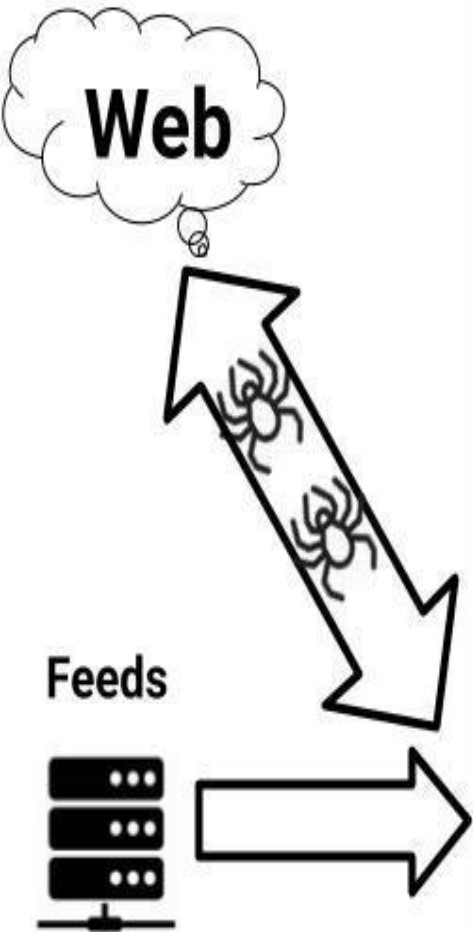
Outline

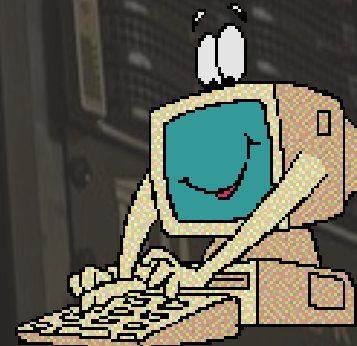
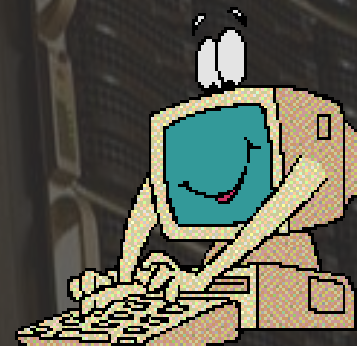
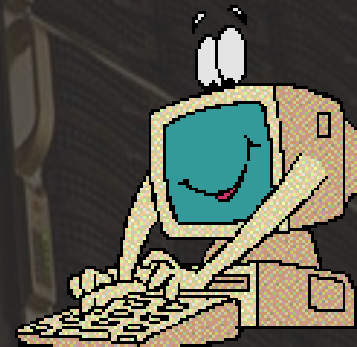
1. Archiving (Digital) Scholarship
2. Conceptual Approaches
3. Technical Approaches



Sources

- Manifests: Unpaywall, CORE (UK), ISSN, Semantic Scholar, DOAJ, MS Academic, CiteSeerX, Meta, other
- Metadata: DOIs (CrossRef), ISSNs, ORCID, DataCite, Wikidata, PubMed, etc
- Other: SHERPA/RoMEO (license); Keeper's Registry (preservation)





Scrawler

FatCat

Cluster
(Hadoop)

Search
(Elastic)

Processing
(Grobid)

db
(Postgres)

IA Web
Archive

IA General
Archive

Metadata
Store

IA Petabox Repository

Data Center Mirrors

Data Center Mirrors

Sources Archived

Internet Archive Bibliographic Metadata
Internet Archive Web Group

This collection contains both external ("upstream") metadata dumps and Internet Archive generated databases and reports on our holdings of papers, books, and other documents.

Share
★ Favorite
✎ Edit
🕒 History
▶ Play All

ABOUT COLLECTION

51 RESULTS

Search this Collection

Metadata
Text contents

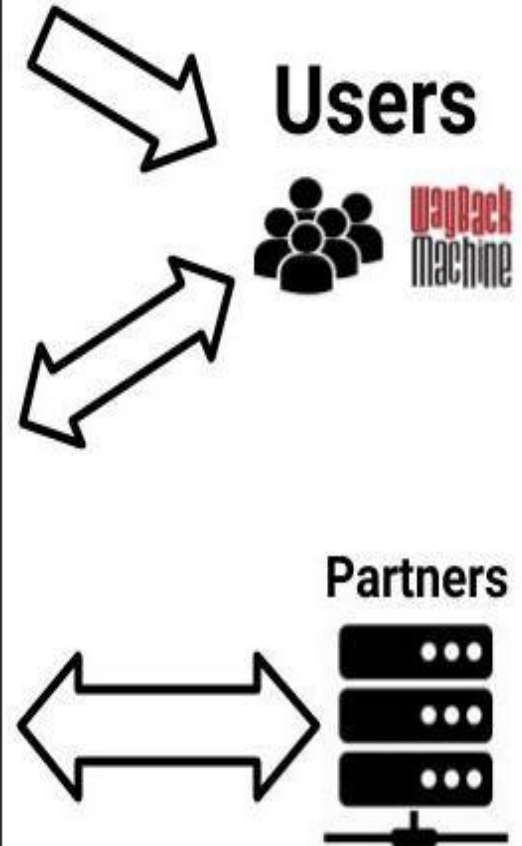
PART OF
The Internet Archive

Media Type
data 51

Year
2018 14
2017 11
2016 3
2015 1
2014 1
2013 1
More

Topics & Subjects

- Crossref DOI Dump (2018-01)
- oaDOI DOI/URL Dataset
- Internet Archive Paper Manifest (2017-09-19)
- Internet Archive Paper Manifest (2018-01-25)
- CORE Open Access Paper Metadata (2017-11-)
- ROAD/ISSN Directory (2018)
- ORCID Public Data File (2017)
- DOAJ Journal and Article Metadata (2018)
- ISSN ISSN-L Mapping
- Internet Archive Paper Manifest (2017-12-18)
- ORCID Public Data File (2014)
- DataCite OAI-PMH Feed Snapshots
- Microsoft Academic Search

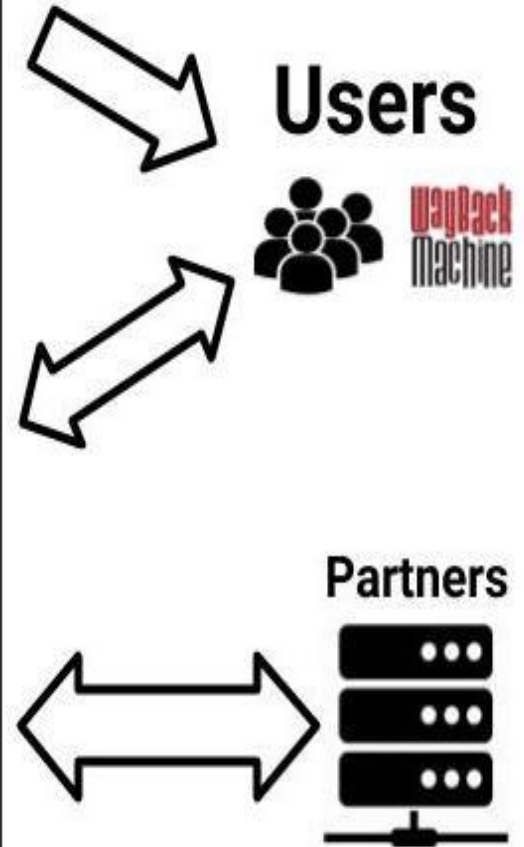


Partnerships



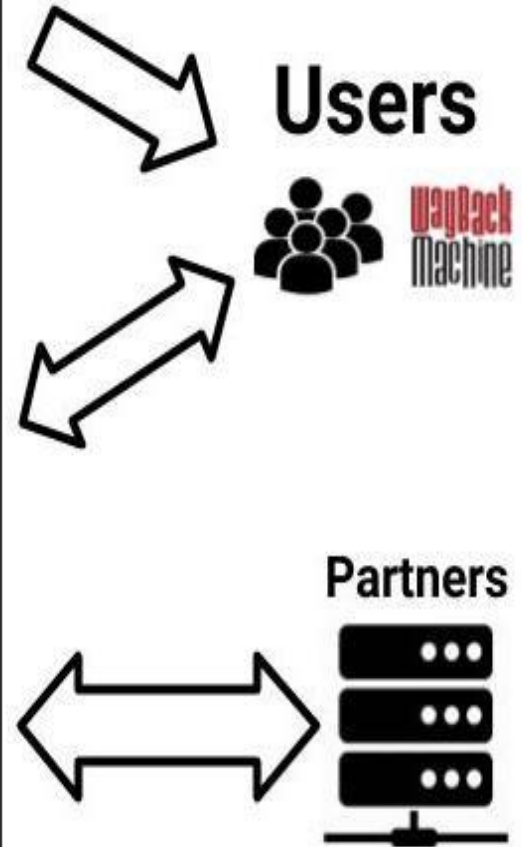
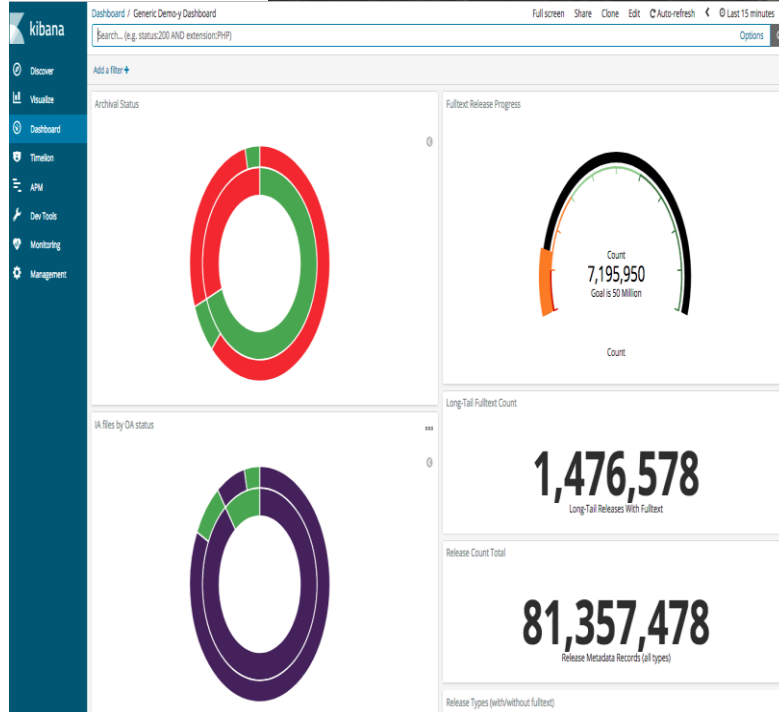
Find and understand peer-reviewed research papers

Try: "vaccines and autism," "How safe is bicycling," or "chocolate"



APIs, Reporting, Bulk Access

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  ]
}
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Oh Look -- A GUI!

A Large-Scale Analysis of Impact Factor Biased Journal Self-Citations

release ubok22odkvg3tc6ccmlzhlkj2a

by [Caspar Chorus](#), Ludo Waltman

Date (published): 2016-08-25

PubMed: [27560807](#)

PubMed Central: [PMC4999059](#)

Wikidata Entity: [Q36113005](#)

This *journal-article* is a release (version) of the work [t2g77tbx4rf7hoyftgvoxxfyey](#). There may be other releases (eg, pre-prints, formal publications, etc) linked to the same work.

Published in [PLoS ONE](#) by Public Library of Science (PLoS)

Extra Metadata (raw JSON)

crossref: <truncated, see full JSON>

Abstracts

No known abstracts.

All Contributors

Attribution Order	Name	Role
1	Caspar Chorus	author
2	Ludo Waltman	author
	Wolfgang Glanzel	editor

Known Files and URLs

SHA-1	Size (bytes)	File Type	Links
8b1471	1471	application/pdf	repository.tudelft.nl (web) web.archive.org (webarchive)
8b13545	3545	application/pdf	journals.plos.org (web) web.archive.org (webarchive)

[Download Full Text](#)

Release Type [journal-article](#)

DOI [10.1371/journal.pone.0161021](#)

Container Metadata

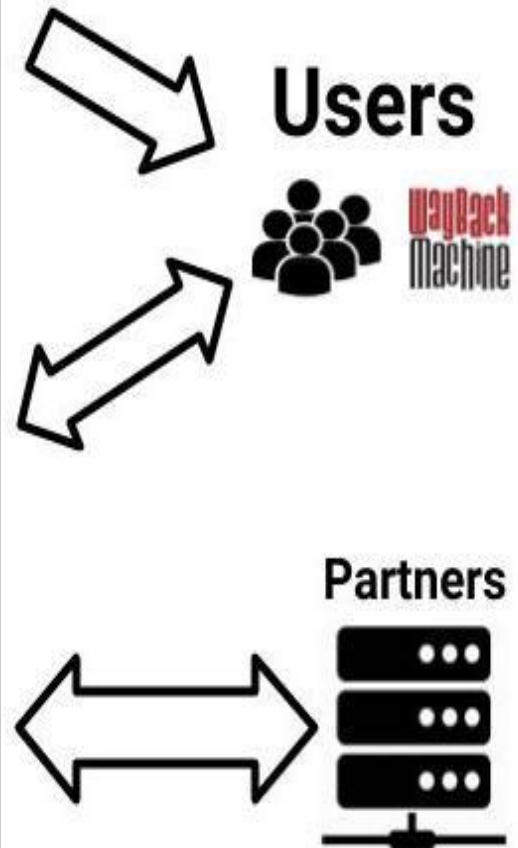
- Open Access Publication
- In DOAJ
- Not in ISSN ROAD
- Not in Keepers Registry
- ISSN-L: 1932-6203
- Fatcat: [utxlnrmwrradvjzzjwkogo4k44](#)

Lookup Links

Fatcat Bits

State is "active". Revision: [2fb81468-8ae8-4a2c-be56-5830a75a453e](#)
As JSON object via API

[Edit Metadata](#) [View History](#)



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4. Technical Approaches
5. Fatcat Beta Walkthrough

Fatcat! (Big Catalog)

- Editable catalog tracking the (archival) location, metadata, and status of research objects to ensure perpetual access
- Built by matching crawled web content (both historical and ongoing) against metadata
- Now at ~150M metadata records, ~18M known full text works, ~70M likely total works, ~700M citations



Scholarly Context Not Found: One in Five Articles Suffers from Reference Rot

release ws2argtms5bitptbg4wiobc42m

by Martin Klein, Herbert Van de Sompel, Robert Sanderson, Harihar Shankar, Lyudmila Balakireva, Ke Zhou, Richard Tobin

- ▶ Published in [PLoS ONE](#) by Public Library of Science (PLoS)
- ▶ All Contributors (8)

Extra Metadata (raw JSON)

crossref.type	journal-article
crossref.license	[{'start': '2014-12-26T00:00:00Z', 'URL': 'http://cr...'}]

Known Files and URLs

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---	--

References

This release citing other releases

1. Hiberlink (2014) Available: <http://hiberlink.org/>. Accessed: 2014 November 1.
2. Resolve a DOI Name (2014) Available: <http://dx.doi.org>. Accessed: 2014 November 1.
3. LOCKSS (2014) Available: <http://lockss.org/>. Accessed: 2014 November 1.
4. CLOCKSS (2014) Available: <http://www.clockss.org/>. Accessed: 2014 November 1.
5. Portico - A Digital Preservation and Electronic Archiving Service (2014) Available: <http://www.portico.org/>. Accessed: 2014 November 1.
6. The Keepers Registry (2014) Available: <http://thekeepers.org/>. Accessed: 2014 November 1.
7. Wavelab and reproducible research Wavelets and Statistics.199555 (DOI: [10.1007/978-1-4612-2544-7_5](https://doi.org/10.1007/978-1-4612-2544-7_5))

Download Full Text

Type article-journal
 Status published
 Date 2014-12-26

DOI [10.1371/journal.pone.0115253](https://doi.org/10.1371/journal.pone.0115253)
 PubMed [25541969](#)
 PMC [PMC4277367](#)
 Wikidata [Q28653394](#)

Container Metadata

🔓 Open Access Publication
 ✓ In DOAJ
 ✗ Not in ISSN ROAD
 🔄 ISSN-L: 1932-6203
 ➔ [Fatcat Entry](#)

Work Entity

grouping other versions (eg, pre-print) and variants of this release

▶ Lookup Links

Fatcat Bits

State is "active". Revision:
 542b4e08-8363-43c1-844f-2de9c6d876c1
[As JSON object via API](#)

Edit Metadata

View History

Scholarly Context Not Found: One in Five Articles Suffers

release ws2argtms5bitptbg4wiobc42m

by Martin Klein, Herbert Van de Sompel, Robert Sanderson, Harihar Shankar, Lyudmila Balakireva,

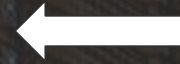
▼ Published in **PLoS ONE** by Public Library of Science (PLoS)

ISSN-L	1932-6203
Issue	12
Page(s)	e115253
Release Date	2014-12-26
Publisher	Public Library of Science (PLoS)
Primary Language	en (lookup)

► All Contributors (8)

Extra Metadata (raw JSON)

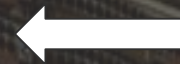
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Bibliographic metadata



ISSN metadata








DOI metadata

 **Download Full Text**

Type article-journal
 Stage published
 Date 2014-12-26

DOI [10.1371/journal.pone.0115253](https://doi.org/10.1371/journal.pone.0115253)
 PubMed [25541969](https://pubmed.ncbi.nlm.nih.gov/25541969/)
 PMC [PMC4277367](https://pubmed.ncbi.nlm.nih.gov/pmc/articles/PMC4277367/)
 Wikidata [Q28653394](https://www.wikidata.org/wiki/Q28653394)

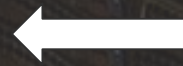
Container Metadata
 Open Access Publication
 In DOAJ
 Not in ISSN ROAD
 ISSN-L: 1932-6203
 Fatcat Entry

Work Entity
 grouping other versions (eg, pre-print) and variants of this release

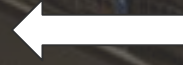
▶ **Lookup Links**

Fatcat Bits
 State is "active". Revision:
 542b4e08-8363-43c1-844f-2de9c6d876c1
 As JSON object via API

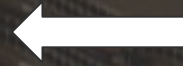
[Edit Metadata](#) [View History](#)



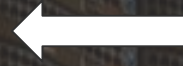
Download full text



Identifier linking



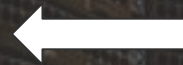
Registries lookup



Version linking



JSON API



Record Editing

<https://fatcat.wiki/>

IIPC WAC 2019



Known Files and URLs

application/pdf 1.8 MB
sha1:5cabcf84414e92221f0...

web.archive.org (webarchive)
web.archive.org (webarchive)
www.plosone.org (web)
journals.plos.org (publisher)
web.archive.org (webarchive)
+ 5 more URLs

References

This release citing other releases

1. Hiberlink (2014) Available: <http://hiberlink.org/>. Accessed: 2014 November 1.
2. Resolve a DOI Name (2014) Available: <http://dx.doi.org>. Accessed: 2014 November 1.
3. LOCKSS (2014) Available: <http://lockss.org/>. Accessed: 2014 November 1.
4. CLOCKSS (2014) Available: <http://www.clockss.org/>. Accessed: 2014 November 1.
5. Portico - A Digital Preservation and Electronic Archiving Service (2014) Available: <http://www.portico.org/>. Accessed: 2014 November 1.
6. The Keepers Registry (2014) Available: <http://thekeepers.org/>. Accessed: 2014 November 1.
7. Wavelab and reproducible research Wavelets and Statistics.199555 (DOI: [10.1007/978-1-4612-2544-7_5](https://doi.org/10.1007/978-1-4612-2544-7_5))
8. Berners-Lee T (1998) Cool URLs don't change. Available: <http://www.w3.org/Provider/Style/URI.html>. Accessed: 2014 November 26.
9. Web Page Change and Persistence - A Four-Year Longitudinal Study Journal of the American Society for Information Science and Technology.2002162 (DOI: [10.1002/asi.10018](https://doi.org/10.1002/asi.10018))
10. The Chesapeake Digital Preservation Group (2013) "Link Rot" and Legal Resources on the Web: A 2013 Analysis by the Chesapeake Digital Preservation Group.
11. Perma: Scoping and addressing the problem of link and reference rot in legal citations Harvard Law Review Forum.2014
12. 404 not found: the stability and persistence of urls published in medline Bioinformatics.2004668 (DOI: [10.1093/bioinformatics/btg465](https://doi.org/10.1093/bioinformatics/btg465))
13. Url decay in medlinea 4-year follow-up study Bioinformatics.20081381 (DOI: [10.1093/bioinformatics/btn127](https://doi.org/10.1093/bioinformatics/btn127))
14. Ecology in the information age: patterns of use and attrition rates of internet-based citations in esa journals, 1997-2005 Frontiers in Ecology and the Environment.2008145 (DOI: [10.1890/070022](https://doi.org/10.1890/070022))

← **Wayback(!) and live web URLs + mime, size, checksum**

← **Extracted citations (interlinked to other fatcat records and wayback URLs for web references)**

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+ contribs: [ ... ],
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      }
    ],
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  }
}
}

```

← The API, which has additional metadata not in the user interface

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FatMLCat Goals

Build classifiers that:

- Identify scholarly articles in web archives
- Identify whether online scholarly publications are being well archived (improve if not)
- Identify unknown online scholarly publications not being archived (and archive them)
- Apply fatcat process to these resources for improved discovery and distribution

FatMLCat Specifics

- **Is this PDF/HTML a scholarly article?**
 - **Signals: host name or URL string; doc format or layout; analyze & compare metadata, login page and “partial copy” detectors**
- **Is this online scholarly publication “well archived”?**
 - **Signals: estimate correct capture frequency, size, number; model content type, flags for variance**
- **How can we find and archive online long-tail scholarly sites we don’t know about**
 - **Signals: link graph, citation graph**

FatMLCat Outcomes

- **Technicals: Using Spark MLlib, scikit-learn, with most code in Scala or Python**
- **Improvement of existing open source tools tools in the fatcat/fatMLcat workflow (GROBID, etc)**
- **All training sets, classifiers, and code will be released open source in early 2020**
- **Will also release cost models on the costs (per TB) to run similar jobs, local or cloud**

FatMLCat to the Future

- Run classifiers on multiple ccTLD full domain crawls
- Run classifiers on multiple university *.edu crawls in Archive-It
- *[Thanks partners! Others welcome!]*
- Services for IDing and MDing scholarship in domain/host crawls
- Services to deliver these subsets or relevant off-domain/host subsets to partners for local use/preservation
- Computational research services



Further Thoughts & Light Reading

Thoughts:

- Leverage WA methods for all preservation/access stuff
- Better knowledge/discovery of what's in web archives
- Delivery of relevant subsets into web archives / IRs

Readings:

- “Andrew W. Mellon Foundation Awards Grant to the Internet Archive for Long Tail Journal Preservation”
 - <https://blog.archive.org/> (search “[mellon](#)”)
- “Personal Pods and Fatcat,” DSHR blog
 - <https://blog.dshr.org/2019/04/personal-pods-and-fatcat.html>
- Fatcat announcements upcoming on IA blog

THANKS! CONTACT IF INTERESTED!

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Director, Web Archiving & Data Services

Maria Praetzellis, maria@archive.org
Program Manager, Web Archiving & Data Services

Credits: Bryan Newbold (FatCat Open Data Engineer)
Volunteers: David Rosenthal, Vicky Reich
Partial Funding: Mellon Foundation

Internet Archive
Archive-It

<https://archive.org>
<https://archive->



<https://fatcat.wiki>

