



# Bidirectional Paper-Repository Tracing in Software Engineering

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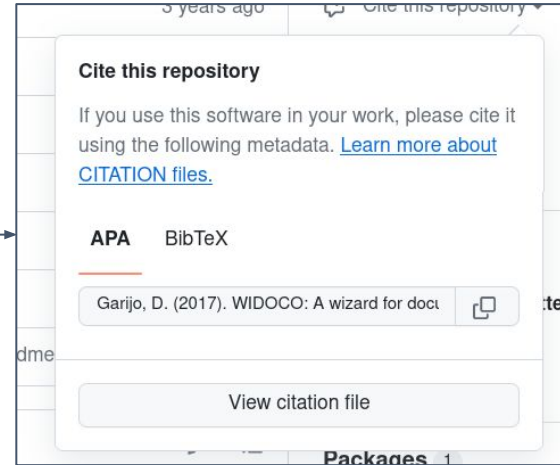
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🐦 [@dgarijov](https://twitter.com/dgarijov)

## citation file format

```
cff-version: 1.2.0
message: "If you use this software, please cite it as below."
authors:
  - family-names: Druskat
    given-names: Stephan
    orcid: https://orcid.org/1234-5678-9101-1121
title: "My Research Software"
version: 2.0.4
identifiers:
  - type: doi
    value: 10.5281/zenodo.1234
date-released: 2021-08-11
```

## GitHub



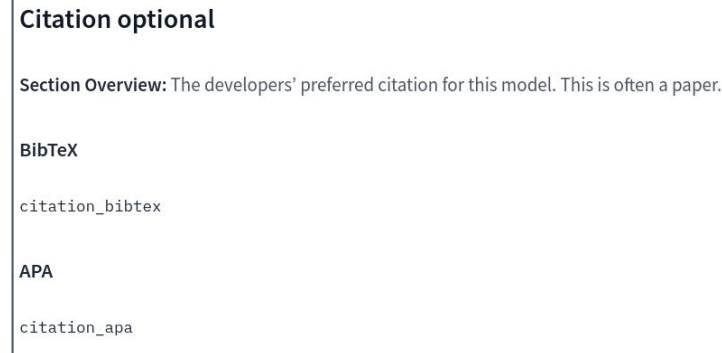
The screenshot shows the 'Cite this repository' dialog box on GitHub. It contains the following text: 'Cite this repository', 'If you use this software in your work, please cite it using the following metadata. [Learn more about CITATION files.](#)', and two citation format options: 'APA' (selected) and 'BibTeX'. Below these options is a text box containing the citation: 'Garijo, D. (2017). WIDOCO: A wizard for doct'. A 'View citation file' button is located at the bottom of the dialog.

## Software citation principles



The screenshot shows the PeerJ article page for 'Software citation principles'. The article is by Arfon M. Smith, Daniel S. Katz, and Kyle E. Niemeyer, published on September 19, 2016. The page includes a 'View 294 posts' button and a 'Post to Authors on X' button. The article is categorized under 'Research article', 'Digital Libraries', and 'Software Engineering'.

## Others: Model Cards, PwC



The screenshot shows the 'Citation optional' section for Model Cards and PwC. It includes a 'Section Overview' stating: 'The developers' preferred citation for this model. This is often a paper.' Below this, there are two citation format options: 'BibTeX' with the citation 'citation\_bibtex' and 'APA' with the citation 'citation\_apa'.

- Find **the software implementation(s)** associated with a paper
- Find how authors adopt **citation practices** in their tool implementations
- Assess current software metadata practices (**FAIR principles**)

## - Main way in which software is cited:

- Footnotes
- Inline URLs
- Citations (as if it was a paper)

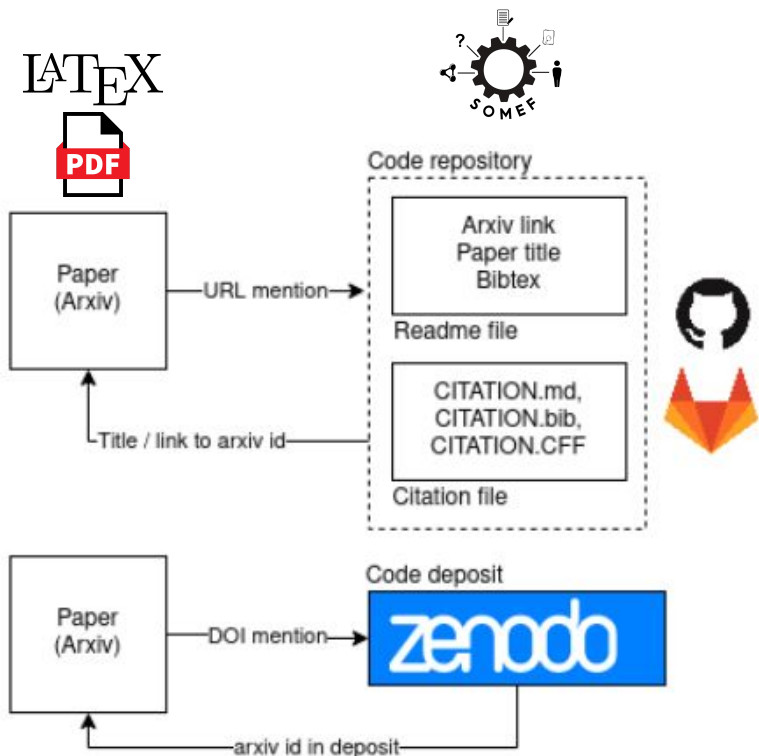
## - Cited artefacts:

- Zenodo DOIs
- GitHub repos
- Project sites



## - Additional challenges:

- Links in the pdf (which can be clicked) but no citation reference
- It may be impossible to discern from the context that the cited resource is the paper implementation
- Links to data, experiment evaluations and software code are provided **as code**
- Many, many tools that are **reused** in a paper (but not proposed) are cited
- Arxiv papers may link to implementations that are accepted in **conference papers**

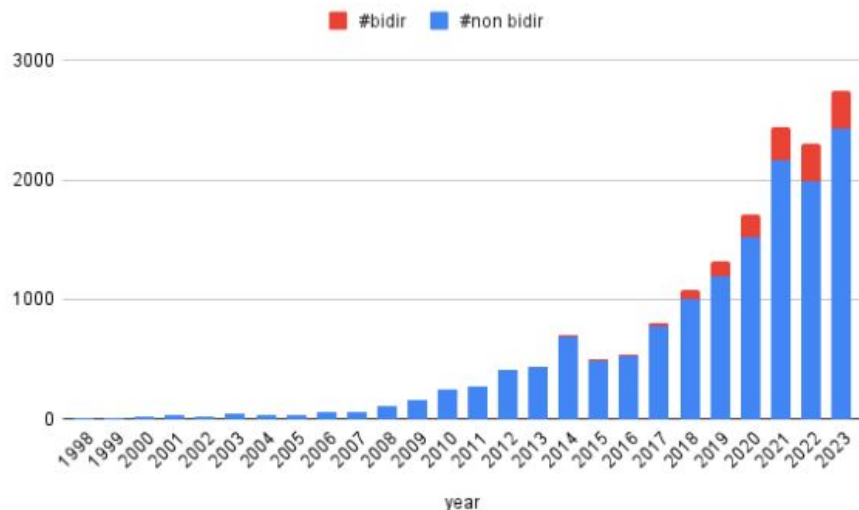


## Our method:

- Precise, robust method for **finding bidirectional paper-links**
  - Caveat: may miss unidirectional
- Explores Zenodo links that have a repository and link back to the paper
- Similarity based on DOI, mention references of paper title found in README.
- Validation over **150 papers**:
  - PDF: P: 1, R: 0.94, **F1: 0.97**
  - Latex: P:1, R: 0.7, **F1: 0.83**

<https://github.com/SoftwareUnderstanding/RSEF> (PDF)

[https://github.com/ctreude/SoftwareImpactHackathon2023\\_BiDirectional](https://github.com/ctreude/SoftwareImpactHackathon2023_BiDirectional) (Latex)



14760 PDFs and 10826 Latex files  
in **Cs.Se** category (Software Engineering)

Pipeline	GitLab	Zenodo	GitHub	Total
PDF	7	273	1159	1439
Latex	0	40	638	678

Citation practices	Description	Bibtex	CFF	Title
Bidirectional	759	307	49	353

Software citation is becoming **increasingly important**, but **best practices are not yet followed**

- Extracting software implementations from papers accurately **may be challenging**
  - Diverse cited artifacts
  - Diverse citation practices
  - Technical challenges
- Robust pipeline for **mining software implementations**
- Future work will address
  - **Unidirectional** paper-repositories
  - Other **domains**

- Ack:



**Data**

Corpus



Results



**Code**

PDF



Latex





# How are you asking others to cite your software?

## How do you cite other software in your work?

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