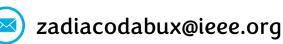


It Will Never Work in Theory April 2023

# Technical Debt in R Packages

## Zadia Codabux University of Saskatchewan, Canada



Øzadiacodabux



https://www.cs.usask.ca/faculty/zadiacodabux/

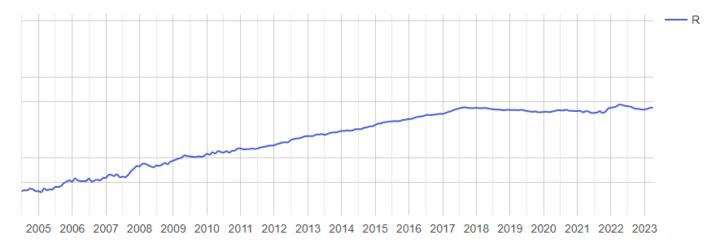


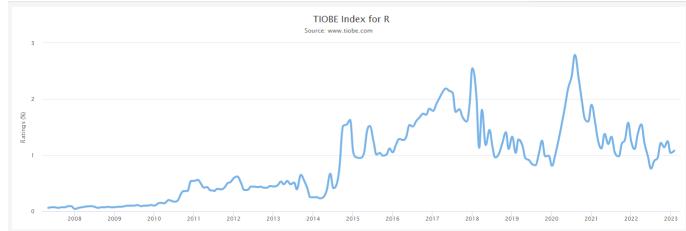
| Top Pr<br>Click a butte | - |       | ntly wei | -     | _    | es 2C | )22   |       |      |
|-------------------------|---|-------|----------|-------|------|-------|-------|-------|------|
| Python                  |   |       |          |       |      |       |       |       | 100  |
| C                       |   |       |          |       |      |       |       |       | 96.8 |
| C++                     |   |       |          |       |      |       |       | 88.58 |      |
| C#                      |   |       |          |       |      |       |       | 86.99 |      |
| Java                    |   |       |          |       |      |       | 70.22 |       |      |
| SQL                     |   |       |          |       | 47.3 | 7     |       |       |      |
| JavaScript              |   |       |          | 40.48 |      | •     |       |       |      |
| R                       |   | 18.92 |          |       |      |       |       |       |      |
|                         |   |       |          |       |      |       |       |       |      |
| HTML                    |   | 17.97 |          |       |      |       |       |       |      |
| TypeScript              |   | L6.99 |          |       |      |       |       |       |      |

IEEE Spectrum's Top Programming Languages 2022

| Feb 2023 | Feb 2022 | Change | Programming   | Programming Language |  |  |
|----------|----------|--------|---------------|----------------------|--|--|
| 1        | 1        |        | 🥐 Pyt         | thon                 |  |  |
| 2        | 2        |        | C c           |                      |  |  |
| 3        | 4        | ^      | C+-           | +                    |  |  |
| 4        | 3        | *      | 🤹 Jav         | /a                   |  |  |
| 5        | 5        |        | <b>C</b> #    |                      |  |  |
| 6        | 6        |        | VB Vis        | ual Basic            |  |  |
| 7        | 7        |        | JS Jav        | vaScript             |  |  |
| 8        | 10       | ^      | sql sq        | L                    |  |  |
| 9        | 9        |        | ASM ASS       | sembly language      |  |  |
| 10       | 8        | *      | Php PH        | Ρ                    |  |  |
| 11       | 11       |        | <b>-60</b> Go |                      |  |  |
| 12       | 13       | ^      | R R           |                      |  |  |

#### PYPL PopularitY of Programming Language





https://www.tiobe.com/tiobe-index/ https://pypl.github.io/PYPL.html https://spectrum.ieee.org/top-programming-languages-2022 2021 IEEE/ACM 18th International Conference on Mining Software Repositories (MSR)

# Technical Debt in the Peer-Review Documentation of R Packages: a rOpenSci Case Study

Zadia Codabux University of Saskatchewan zadiacodabux@ieee.org Melina Vidoni RMIT University melina.vidoni@rmit.edu.au Fatemeh H. Fard University of British Columbia fatemeh.fard@ubc.ca

# Goal: To investigate Technical Debt (TD) in the documentation of the peer-review process of R packages.



**TD** Types

TD Types Distribution

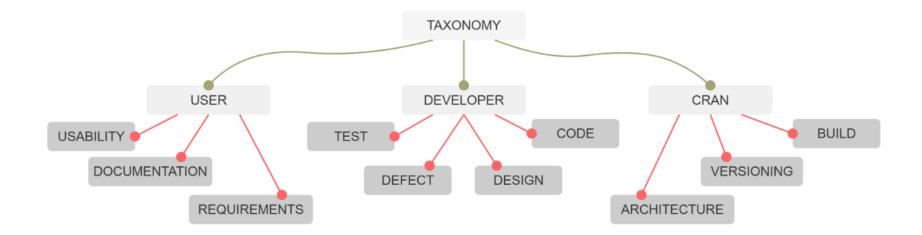


TD Types based on User Roles

Zadia Codabux, Melina Vidoni, Fatemeh H. Fard, Technical Debt in the Peer-Review Documentation of R Packages: a rOpenSci Case Study, Mining Software Repositories Conference, 2021

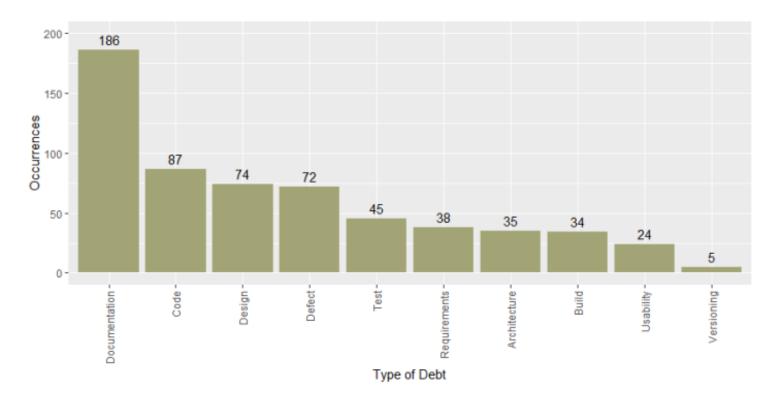
Results

#### **TD Types**



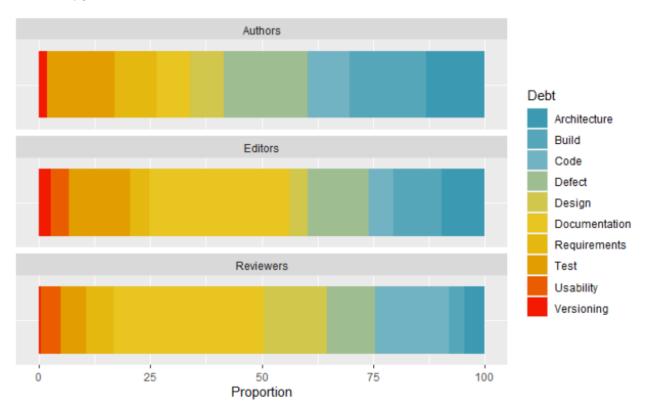
Zadia Codabux, Melina Vidoni, Fatemeh H. Fard, Technical Debt in the Peer-Review Documentation of R Packages: a rOpenSci Case Study, Mining Software Repositories Conference, 2021

#### **TD Types Distribution**



8

#### **TD Types based on User Roles**



Zadia Codabux, Melina Vidoni, Fatemeh H. Fard, Technical Debt in the Peer-Review Documentation of R Packages: a rOpenSci Case Study, Mining Software Repositories Conference, 2021

Automated Software Engineering (2022) 29:53 https://doi.org/10.1007/s10515-022-00358-6

### Self-admitted technical debt in R: detection and causes

Rishab Sharma<sup>1</sup> · Ramin Shahbazi<sup>1</sup> · Fatemeh H. Fard<sup>1</sup> · Zadia Codabux<sup>2</sup> Melina Vidoni<sup>3</sup> Goal: Automatic detection and causes of Self Admitted TD (SATD) in R Packages





Best Performing Model: SATD & SATD Types Detection

**Causes of SATD** 

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#### **SATD Detection**

| Approach | SATD (%)  |           |            |               |  |  |  |
|----------|-----------|-----------|------------|---------------|--|--|--|
|          | $P^{avg}$ | $R^{avg}$ | $F1^{avg}$ | Training time |  |  |  |
| ME       | 78.88     | 74.02     | 76.36      | 1 min 52s     |  |  |  |
| SVM      | 64.62     | 70.05     | 67.22      | 1 min 20s     |  |  |  |
| LR       | 61.04     | 72.74     | 66.37      | 0 min 16s     |  |  |  |
| CNN      | 83.92     | 76.29     | 79.89      | 3 min 18s     |  |  |  |
| ALBERT   | 87.62     | 85.03     | 86.21      | 52 min 6s     |  |  |  |
| RoBERTa  | 85.91     | 86.27     | 86.09      | 48 min 58s    |  |  |  |

#### Results

#### **SATD Types Detection**

| SATD Type     | $F1^{avg}$ (%) |       |              |       |           |           |         |  |  |
|---------------|----------------|-------|--------------|-------|-----------|-----------|---------|--|--|
|               | ME             | SVM   | LR           | CNN   | ALBERT-10 | ALBERT-30 | RoBERTa |  |  |
| Testing       | 83.24          | 82.42 | 84.07        | 84.68 | 87.42     | 87.81     | 86.88   |  |  |
| Code          | <u>65.96</u>   | 54.91 | 53.15        | 63.42 | 67.53     | 67.99     | 68.56   |  |  |
| Versioning    | 44.76          | 46.43 | <u>51.75</u> | 48.00 | 38.23     | 41.42     | 61.43   |  |  |
| Architecture  | <u>47.50</u>   | 39.51 | 41.77        | 50.04 | 53.61     | 57.80     | 58.14   |  |  |
| Defect        | 49.28          | 46.70 | 49.30        | 49.76 | 56.34     | 58.27     | 57.66   |  |  |
| Build         | 48.22          | 46.39 | 41.94        | 46.47 | 38.69     | 43.35     | 52.06   |  |  |
| Documentation | <u>49.76</u>   | 32.32 | 39.15        | 0     | 21.05     | 45.97     | 51.26   |  |  |
| Requirements  | 37.86          | 38.17 | <u>39.82</u> | 35.92 | 42.40     | 40.27     | 46.62   |  |  |
| Design        | 44.46          | 34.47 | 37.74        | 33.27 | 30.87     | 31.69     | 45.37   |  |  |
| Usability     | <u>38.56</u>   | 35.30 | 32.56        | 23.77 | 36.58     | 37.63     | 43.06   |  |  |
| People        | <u>34.68</u>   | 7.34  | 10.6         | 0     | <u>0</u>  | 52.82     | 42.29   |  |  |
| Algorithm     | <u>28.48</u>   | 23.58 | 25.27        | 23.09 | 24.78     | 24.02     | 31.30   |  |  |
| Non-SATD      | <u>79.18</u>   | 75.64 | 76.27        | 82.18 | 88.26     | 88.12     | 87.76   |  |  |
| Micro-avg     | 65.64          | 59.19 | 58.93        | 64.21 | 68.58     | 69.40     | 70.94   |  |  |
| Macro-avg     | <u>50.15</u>   | 43.32 | 44.77        | 41.58 | 45.04     | 52.09     | 56.34   |  |  |

### Takeaways

- Documentation debt is the most recurrent, yet the least valued
- Not all users give the same importance to the different debt types
- Challenging debt types to detect: Requirement & Algorithm

