

DEVELOPER PRODUCTIVITY  
ENGINEERING SUMMIT 2023

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<https://dpesummit.com/>

# Moving Fast While Delivering High Quality Code



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← Back to Newsroom

Meta

# Update on Meta's Year of Efficiency

March 14, 2023

*Mark Zuckerberg just shared the following with Meta employees:*

Meta is building the future of human connection, and today I want to share some updates on our Year of Efficiency that will help us do that. The goals of this work are: (1) to make us a better technology company and (2) to improve our financial performance in a difficult environment so we can execute our long term vision.

Our efficiency work has several parallel workstreams to improve organizational efficiency, dramatically increase developer productivity and tooling, optimize distributed work, garbage collect unnecessary processes, and more. I've tried to be open about all the work that's underway, and while I know many of you are energized by this, I also recognize that the idea of upcoming org changes creates uncertainty and stress. My hope is to make these org changes as soon as possible in the year so we can get past this period of uncertainty and focus on the critical work ahead.

One  
(out of many)  
trigger(s)



# MOVING FAST? HIGH QUALITY? PRODUCTIVITY?





# Agenda

1. Measuring Productivity
2. Drivers (developer POV)
  - a. Authoring Velocity
  - b. Reliability (incl. Quality)
  - c. Knowledge (incl. Readability)
3. What's Next?
4. Q&A

**HOW DO WE  
MEASURE  
PRODUCTIVITY?**



# HOW DO WE MEASURE PRODUCTIVITY?

Code review time  
Burnout  
Coding Time  
Amount of code written  
Meeting Time  
Build Runtime  
Number of code reviews  
Code Quality  
Number of wikis published  
Number of commits  
API Latency  
Deployment frequency  
Number of Meetings  
Deployment Time  
Words per minute  
Service uptime  
Time to fix bugs  
Test Runtime  
Time to resolve sevs  
Time to close ticket  
Satisfaction  
Number of bug fixes  
Time to fix bugs  
Tickets closed



# HOW DO WE MEASURE PRODUCTIVITY?

```
// Defined in MyClass
public async
function callTheFunction(string $my_string): string

public async function callTheFunction(string $my_string):
string {
    return "Yay!";
}

<<_Memoize>>
public async function
return await $this->callTheFunction(self::CONSTANT_VALUE); (you) • Lo

<<_Memoize>>
public async function callTheFunction(string $my_string): string {
    return "Yay!";
}
```

```
// Defined in MyClass
public async
function wrongFunction(string $my_string): string

public async function wrongFunction(string $my_string):
string {
    return "Oh No!";
}

<<_Memoize>>
public async function
return await $this->callTheFunction(self::CONSTANT_VALUE); (you) • Lo

<<_Memoize>>
public async function callTheFunction(string $my_string): string {
    return "Yay!";
}
```

# PRODUCTIVITY FRAMEWORKS

DevOps Research and Assessment

**D**

**O**

**R**

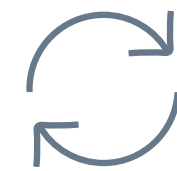
**A**



Deployment Frequency



Lead Time for  
Changes



Mean Time to  
Recovery (MTTR)



Change Failure Rate

# PRODUCTIVITY FRAMEWORKS

**S**

**P**

**A**

**C**

**E**



Satisfaction and  
Well-Being



Performance



Activity



Communication  
and Collaboration



Efficiency and Flow



# PRODUCTIVITY FRAMEWORKS



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Measuring, tracking, and benchmarking developer productivity has long been considered a black box. It doesn't have to be that way.



## Software Design: Tidy First?

INCENTIVES

### Measuring developer productivity? A response to McKinsey

Part 1 of 2



KENT BECK AND GERGELY OROSZ  
29 AUG 2023

111 16 10

Share



*The consultancy giant has devised a methodology it claims measures software developer productivity. They only measure activity, not productivity from a business perspective. And measuring activity comes with costs & risks they do not address. Here's how we think about measurement. Part 1. (Gergely's version of this post is [here](#).)*

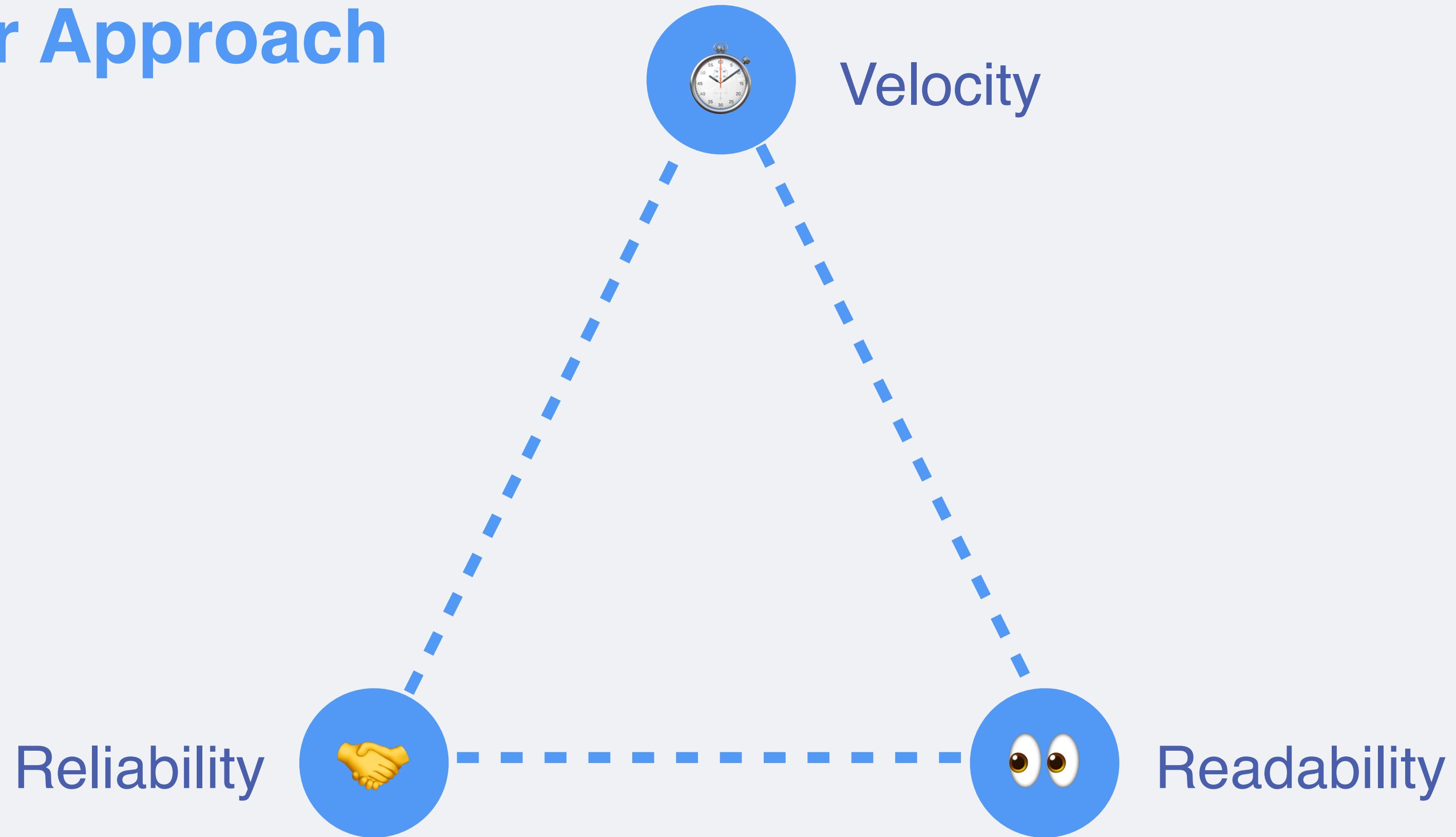
At Facebook we [Kent here] instituted the sorts of surveys McKinsey recommends. That was good for about a year. The surveys provided valuable feedback about the current state of developer sentiment.

Then folks decided that they wanted to make the survey results more legible so they could track trends over time. They computed an overall score from the survey. A 4.5 became a 4. What happened? Very reasonable thing to do. That was good for another year

Then those scores started cropping up in performance reviews, just as a "and they are doing such a good job that their score is 4.5". That was good for another year.

Then those scores became goals. "Move from 4.2 to 4.5 during this performance

# Our Approach



# Drivers

1. Measuring Productivity
2. Drivers (developer POV)
  - a. Authoring Velocity
  - b. Reliability (incl. Quality)
  - c. Knowledge (incl. Readability)
3. What's Next?
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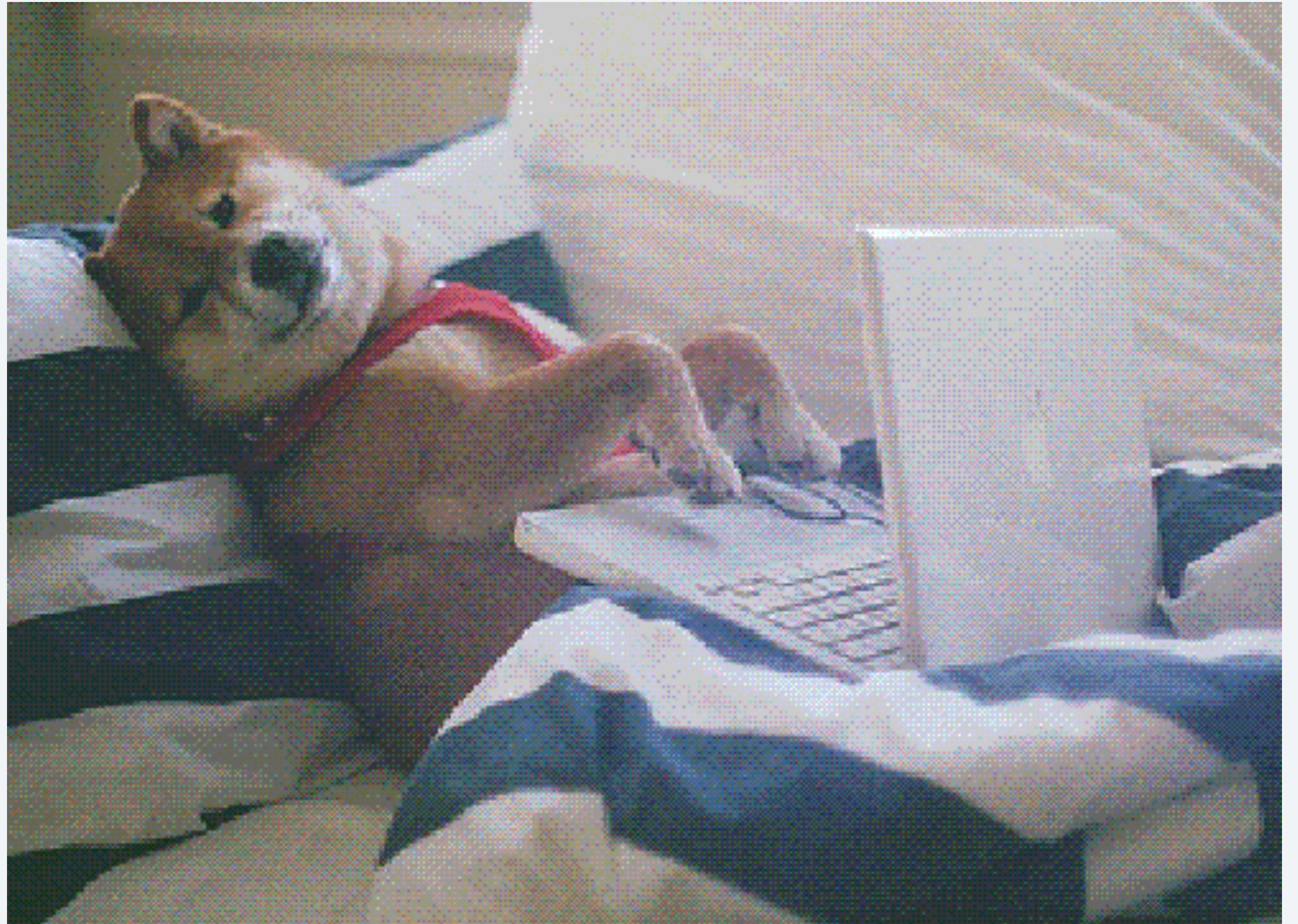
Credits to DALL-E.

## SWE's CHORES

- Split mega-classes into component classes
- Fix architectural design flaws
- Remove unused variables
- Migrate to the latest frameworks
- Update your dependencies
- Upgrade tooling
- Write scripts to automate common work
- Improve documentation
- Fix bugs
- Fix papercuts
- ...



# HOW DO WE MEASURE EASE OF AUTHORING CODE?





# AUTHORING CODE's WORKFLOW @ Meta

The image shows a GitHub pull request interface with several callouts highlighting key components of the workflow:

- Test Plan:** A callout pointing to the 'Test Plan' section of the pull request.
- Pull Request Summary:** A callout pointing to the 'Pull Request Summary' section.
- Assigned Reviewers:** A callout pointing to the 'Assigned Reviewers' section.
- Comments and Activity:** A callout pointing to the 'Comments and Activity' section.

A detailed view of the 'Comments and Activity' section is shown on the right, featuring two comments:

- Comment 1:** "I'd also suggest, limiting to 'relevant' people only (similar to tasks), i.e. only show reviewers and subscribers." (Posted Yesterday at 5:07 PM)
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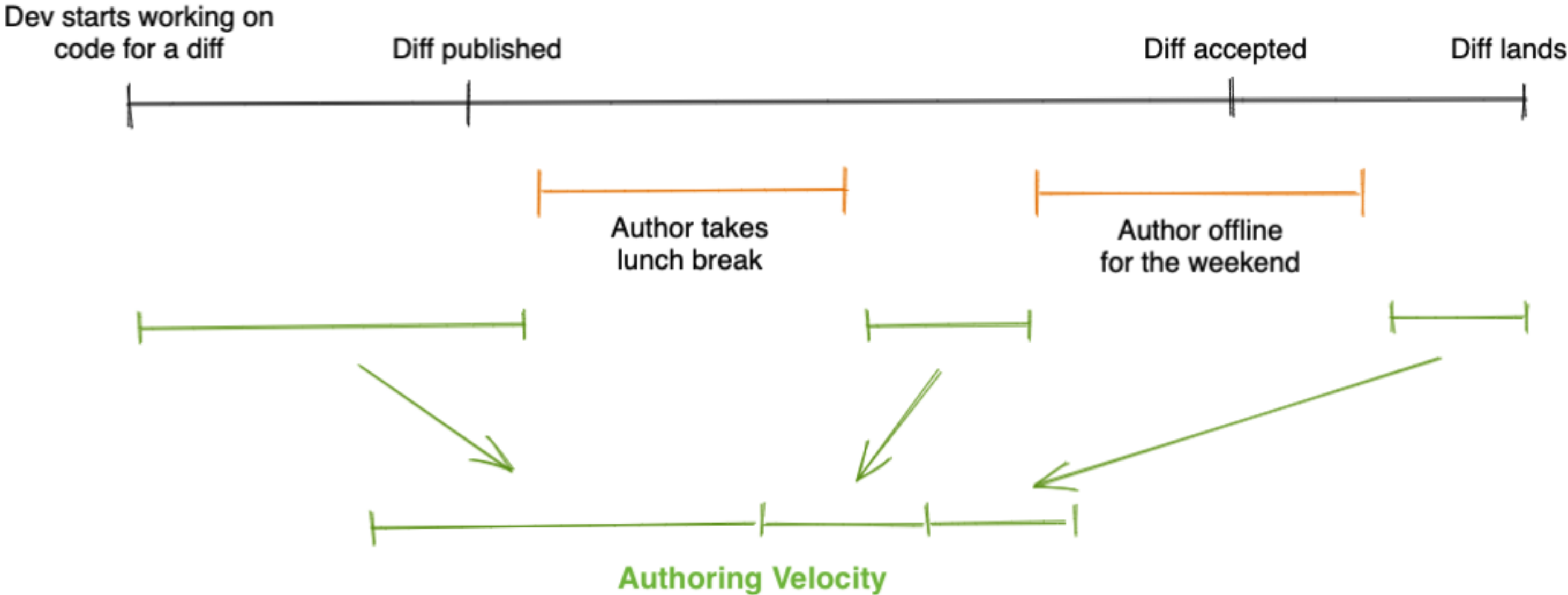


# Velocity

1. Measuring Productivity
2. Drivers (developer POV)
  - a. Authoring Velocity
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# AUTHORING VELOCITY (AV)

How many working hours does it take to write and land a diff?



# IMPACT OF TOOLING ON AUTHOR VELOCITY

POSTED ON APRIL 6, 2023 TO DEVINFRA, OPEN SOURCE

## Build faster with Buck2: Our open source build system

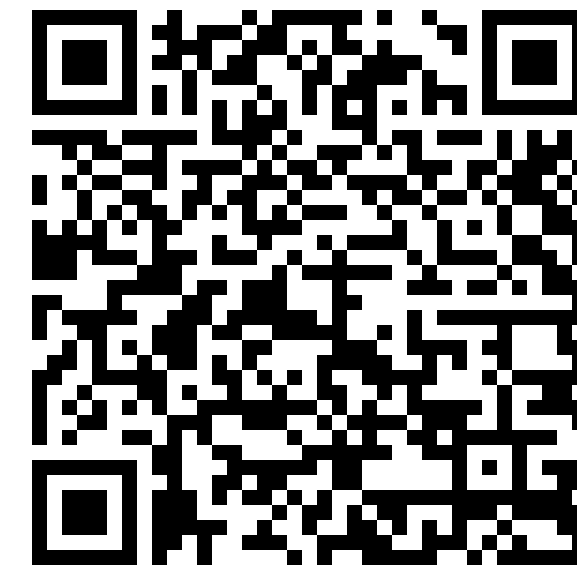


By Chris Hopman, Neil Mitchell



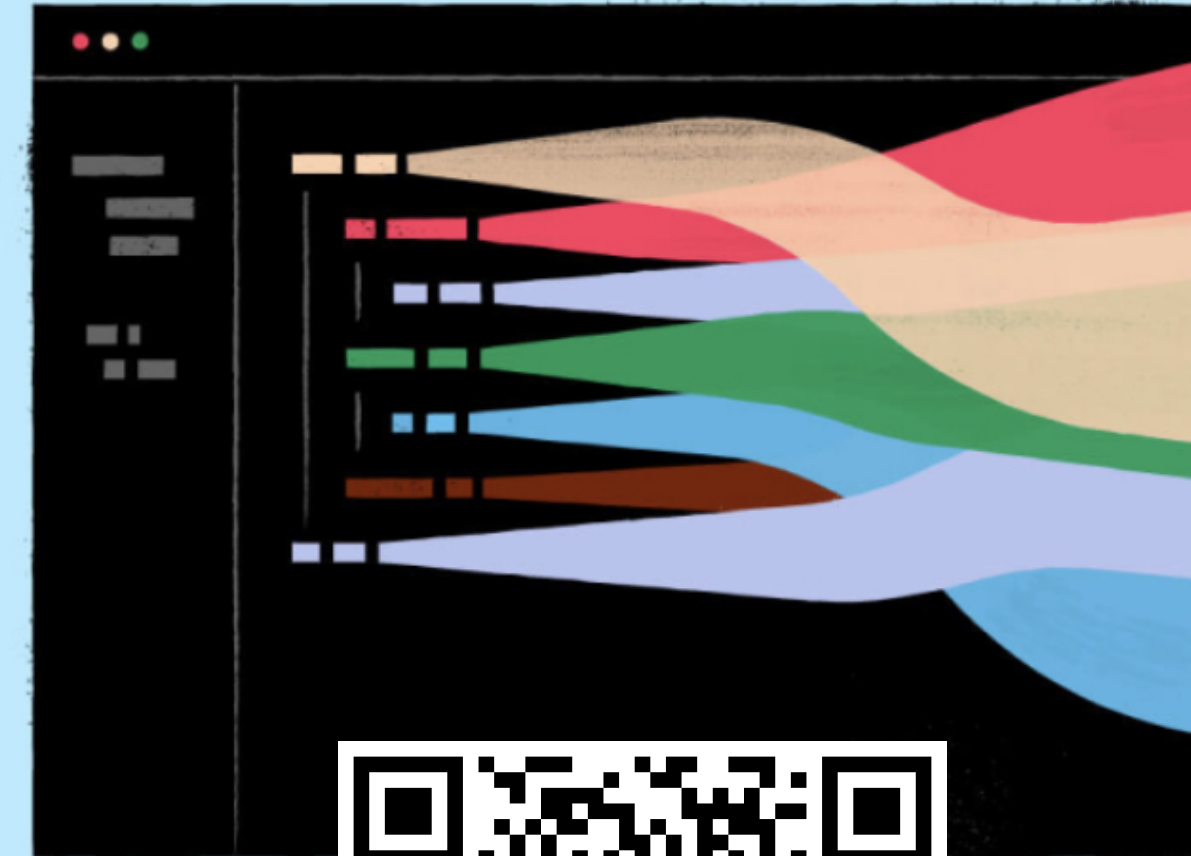
- Buck2, our [new open source, large-scale build system](#), is now available on GitHub.
- Buck2 is an extensible and performant build system written in Rust and designed to make your build experience faster and more efficient.
- In our internal tests at Meta, we observed that Buck2 completed builds 2x as fast as Buck1.

**SCAN ME**

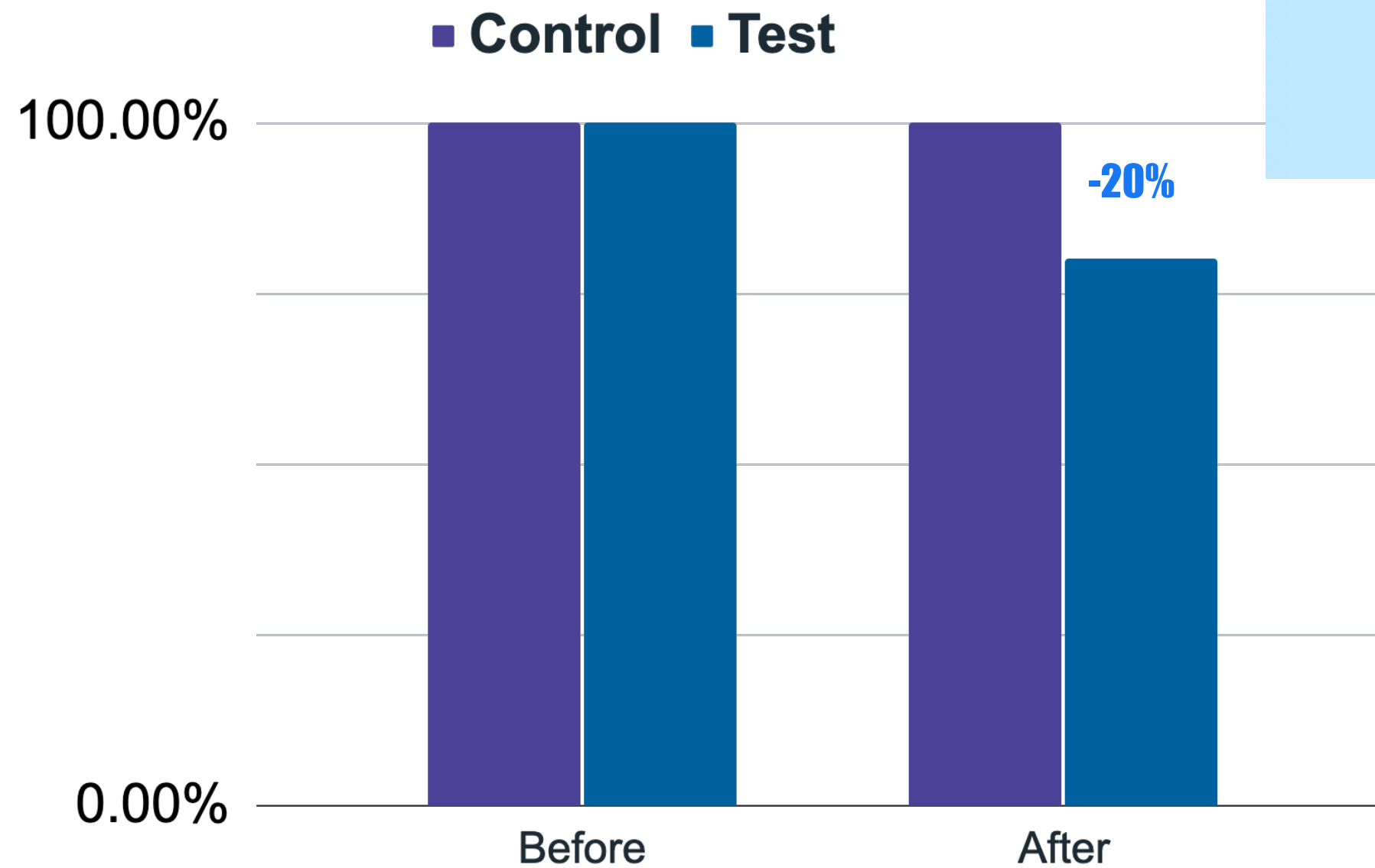


# AUTHORING VELOCITY & WASABI

Enabling  
Faster Python Authoring  
With Wasabi

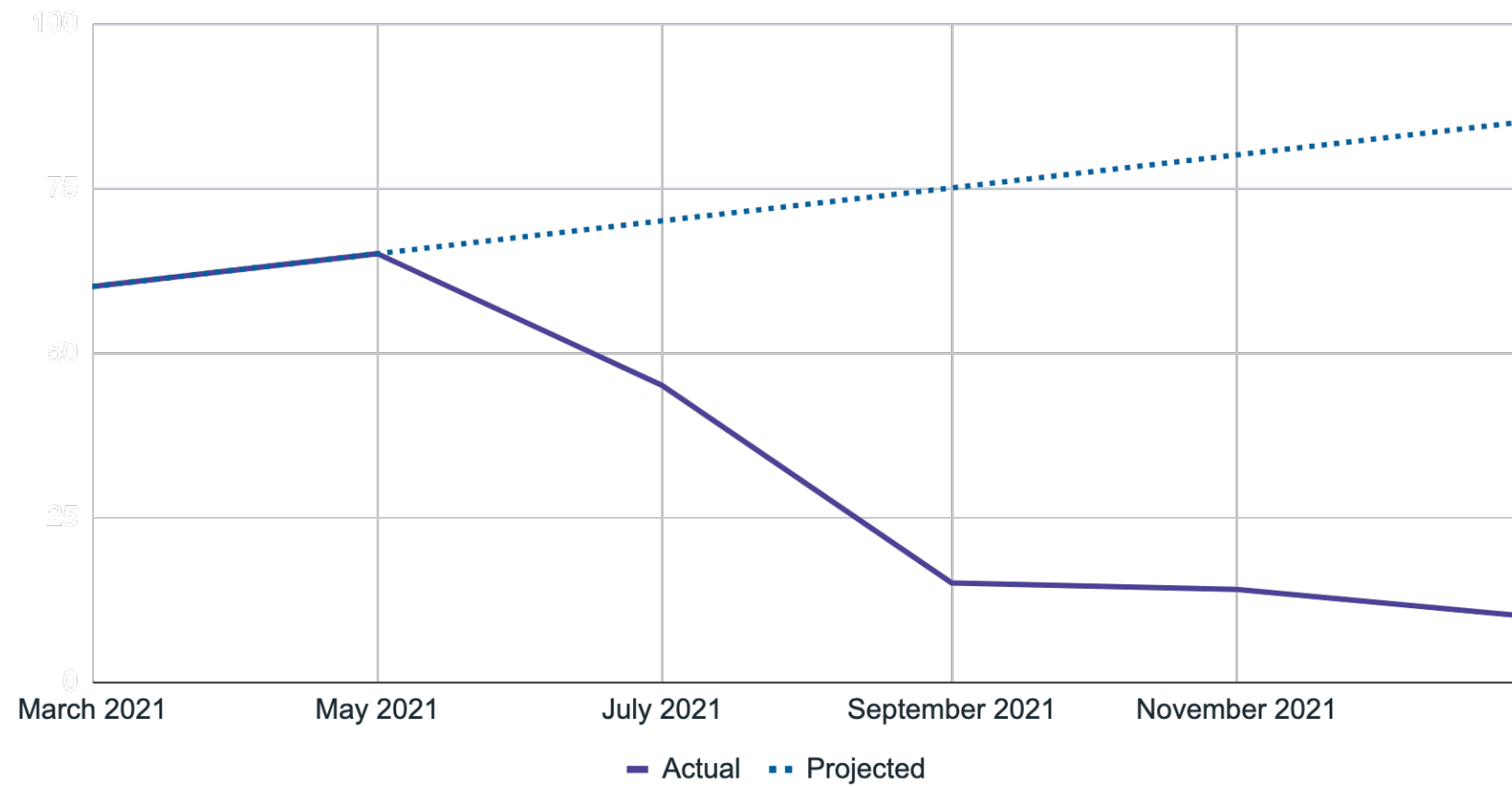


SCAN ME



# AUTHORING VELOCITY & CODE COMPLEXITY

## Code Complexity



**60% reduction in complexity**

**42% reduction in Authoring Velocity**

## Author Velocity

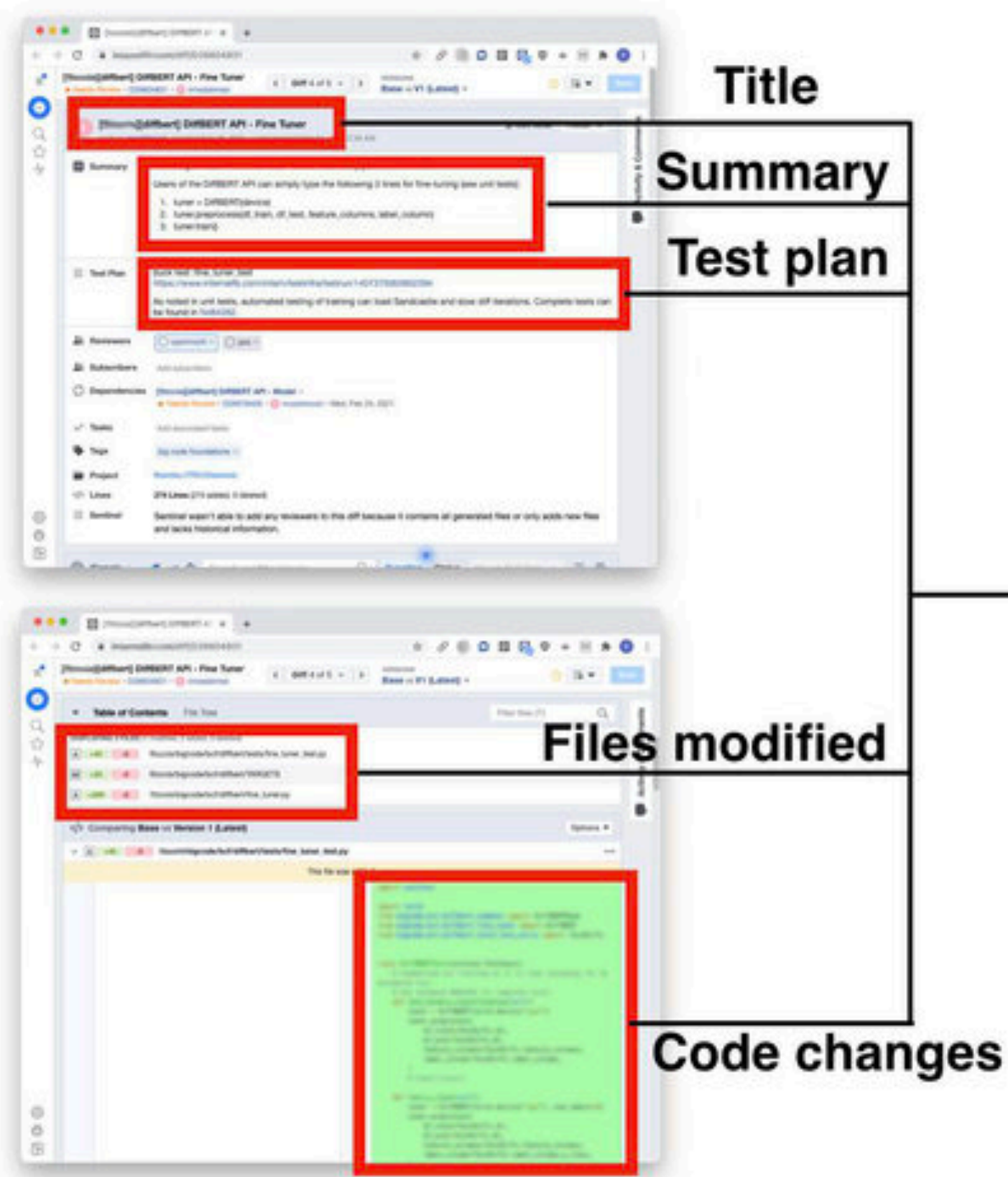




# Reliability

1. Measuring Productivity
2. Drivers (developer POV)
  - a. Authoring Velocity
  - b. Reliability (incl. Quality)**
  - c. Knowledge (incl. Readability)
3. What's Next?
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# DIFF INTENT WITH DIFFBERT/LLM



[-1.1451401710510254,  
1.3620548248291016,  
-2.7420852184295654,  
-2.5980613231658936,  
5.120920181274414,  
-3.0651018619537354,  
-0.4263494610786438,  
0.5120811462402344,  
1.0371060371398926,

**Diff embedding**

# DIFF INTENT vs. AV vs. RELIABILITY



File	Bug Fixes	Features
fileB.py	2	0
fileA.py	1	0
fileC.py	0	1

# TEST PLAN QUALITY vs. RELIABILITY



Prob



*High quality test plans help improving review quality and engagement*



Mod



*NLP-based techniques are well suited for predicting test plan quality*



*Technique is useful to inform improvements in developer tools and experiences.*



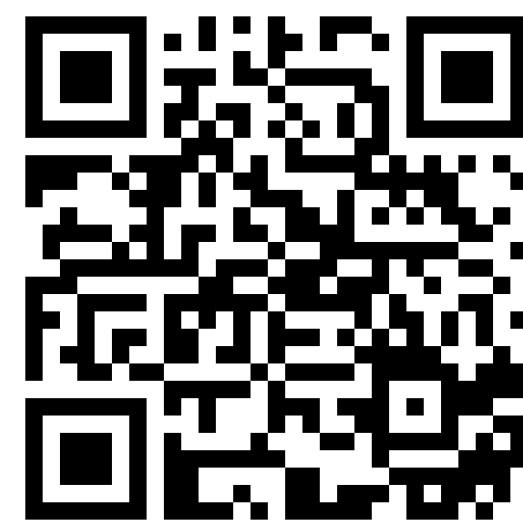
**Pull requests with high quality test plans are observed to:**

- ✓ be involved in fewer outages,
- ✓ be reverted fewer times,
- ✓ have more reviewer engagement.

DECISION TREE

RoBERTa + CLASSIFIER

RoBERTa + MATCHING NETWORK



ails in ).



# DEAD CODE REMOVAL













## Dead Code Removal at Meta: Automatically Deleting Millions of Lines of Code and Petabytes of Deprecated Data

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### ACM Reference Format:

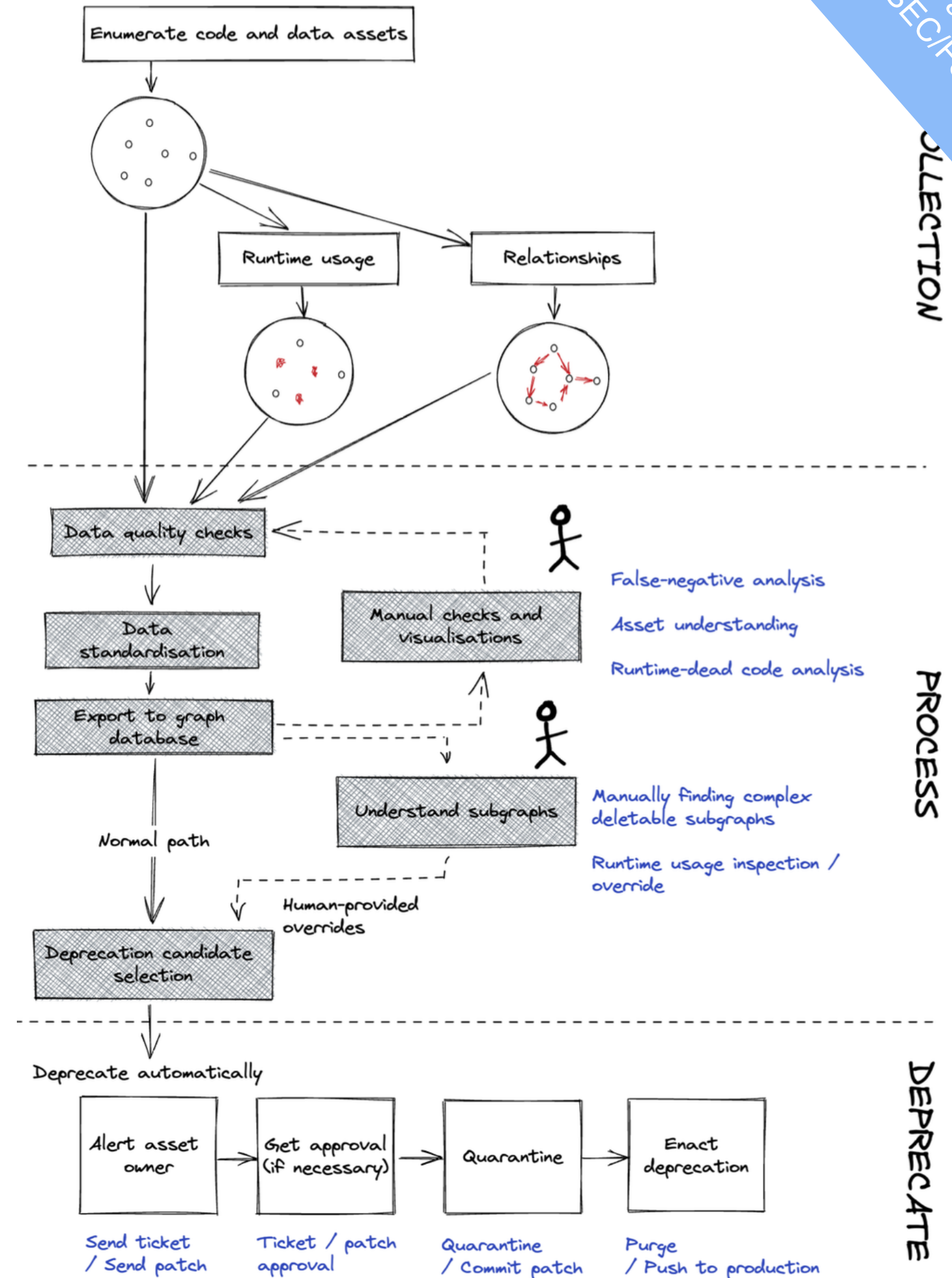
Will Shackleton , Katriel Cohn-Gordon , Peter C. Rigby , Rui Abreu , James Gill , Nachiappan Nagappan , Karim Nakad , Ioannis Papagiannis , Luke Petre , Giorgi Megreli , Patrick Riggs , and James Saindon . 2023. Dead Code Removal at Meta: Automatically Deleting Millions of Lines of Code and Petabytes of Deprecated Data. In *Proceedings of the 31st ACM Joint European Software Engineering Conference and Symposium on the Foundations of Software Engineering (ESEC/FSE '23)*, December 3–9, 2023, San Francisco, CA, USA. ACM, New York, NY, USA, 11 pages. <https://doi.org/10.1145/3611643.3613871>

### 1 INTRODUCTION

Software rapidly evolves to meet users' changing needs. As it does, some features become unnecessary, and the associated *code* and *data* need to be removed. In this paper, we introduce SCARF, a system which safely removes both dead code and data at scale.

Users expect organisations to only store their data when there is a clear need and purpose, and achieving this goal is necessary for every product that respects users' privacy expectations. One important aspect of this expectation is to prevent storing data for which no purpose exists at all. At first, storing unused data for

## Dead Code Removal at Meta: Automatically Deleting Millions of Lines of Code and Petabytes of Deprecated Data, to appear at ESEC/FSE 2023



to appear at  
ESEC/FSE 2023

COLLECTION

PROCESS

DEPRECATE



# Knowledge

1. Measuring Productivity
2. Drivers (developer POV)
  - a. Authoring Velocity
  - b. Reliability (incl. Quality)
  - c. Knowledge (Readability)
3. What's Next?
4. Q&A

# MODELLING CENTRALITY OF DEVELOPER OUTPUT

— knowlege —

## Modeling the Centrality of Developer Output with Software Supply Chains

to appear at  
ESEC/FSE 2023

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### ABSTRACT

Raw developer output, as measured by the number of changes a developer makes to the system, is simplistic and potentially misleading measure of productivity as new developers tend to work on peripheral and experienced developers on more central parts of the system. In this work, we use Software Supply Chain (SSC) networks and Katz centrality and PageRank on these networks to suggest a more nuanced measure of developer productivity. Our SSC is a network that represents the relationships between developers and artifacts that make up a system. We combine author-to-file, co-changing files, call hierarchies, and reporting structure into a single SSC and calculate the centrality of each node. The measures of centrality can be used to better understand variations in the impact of developer output at Meta. We start by partially replicating prior work and show that the raw number of developer commits plateaus over a project-specific period. However, the centrality of developer work grows for the entire period of study, but the growth slows after one year. This implies that while raw output might plateau, more experienced developers work on more central parts of the system. Finally, we investigate the incremental contribution of SSC attributes in modeling developer output. We find that local attributes such as the number of reports and the specific project do not explain much variation ( $R^2 = 5.8\%$ ). In contrast, adding Katz centrality or PageRank produces a model with an  $R^2$  above 20%. SSCs and their centrality provide valuable insights into the

### ACM Reference Format:

Audris Mockus, Peter C. Rigby, Rui Abreu, Parth Suresh, Yifen Chen, and Nachiappan Nagappan. 2023. Modeling the Centrality of Developer Output with Software Supply Chains. In *Proceedings of the 31st ACM Joint European Software Engineering Conference and Symposium on the Foundations of Software Engineering (ESEC/FSE '23)*, December 3–9, 2023, San Francisco, CA, USA. ACM, New York, NY, USA, 11 pages. <https://doi.org/10.1145/3611643.3613873>

### 1 INTRODUCTION

Improving and measuring software productivity is difficult and many researchers and practitioners have simply measured output as the number of pull requests, modification requests, or commits a developer has produced. In this work, we hypothesize that the work context can be partly characterized via structural properties of a network representing explicit and implicit relationships among software artifacts and people. Software supply chains (SSCs) represent the relationships between developers and artifacts in a software project. For example, one common SSC is the network of files that change together in a commit, with a node being a file and edges between files in the same commit. Investigating how the structural properties of SSCs explain the variations in developer output has significant scientific and practical value. In this work, we aim to a) construct software supply chains within a large and diverse (in terms of programming languages, project size, and ap-

# WHAT TO DO WITH CENTRALITY/KNOWLEDGE AND INTENT?

The image shows a GitHub pull request interface with several callouts highlighting key components:

- Test Plan:** A callout box pointing to the 'Test Plan' section of the pull request.
- Pull Request Summary:** A callout box pointing to the main summary text of the pull request.
- Assigned Reviewers:** A callout box pointing to the 'Reviewers' section, which lists 'Debbie' and 'Recommended reviewers: Shrek'.
- Comments and Activity:** A callout box pointing to the 'Comments and Activity' section on the right side of the page.

A zoomed-in view of the 'Comments and Activity' section is shown on the right, featuring two comments:

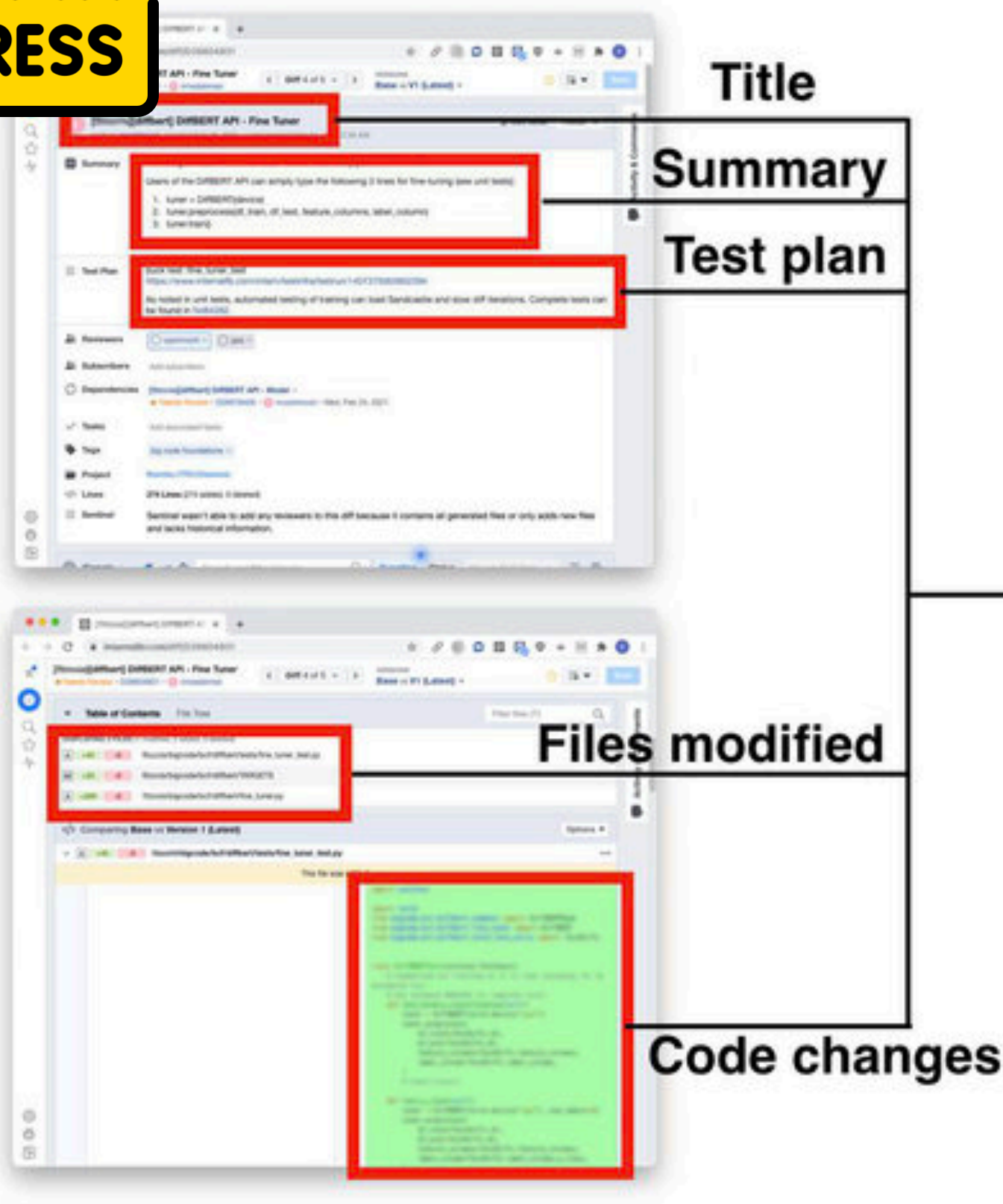
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# CODE READABILITY

Can we build such a model?  
What's readable code?



```
[-1.1451401710510254,
 1.3620548248291016,
 -2.7420852184295654,
 -2.5980613231658936,
 5.120920181274414,
 -3.0651018619537354,
 -0.4263494610786438,
 0.5120811462402344,
 1.0371060371398926,
```

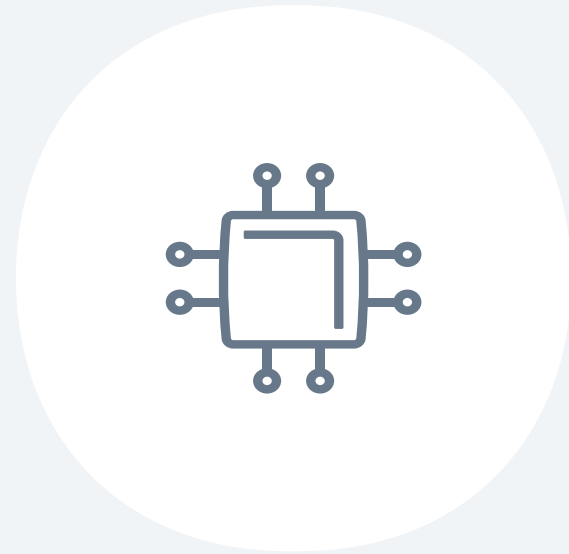
**Diff embedding**

# What's Next?

1. Measuring Productivity
2. Debbie the developer
  - a. Authoring Velocity
  - b. Reliability (incl. Quality)
  - c. Knowledge (incl. Reliability)
3. What's Next?
4. Q&A



# WHAT'S NEXT?



Predictions



Integrations

# Q&A

1. Measuring Productivity
2. Drivers (developer POV)
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