



# BugSwarm

Enhancing an Infrastructure and Dataset to Support the Software Engineering Research Community



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## Overview

BugSwarm<sup>[1, 3]</sup> is a large-scale software defect dataset with its mining infrastructure. The BugSwarm dataset fulfills following desirable characteristics

**Scale** Large enough to get statistical significance on tool evaluations

**Realism** Reflects actual fixes made by real programmers to repair real bugs

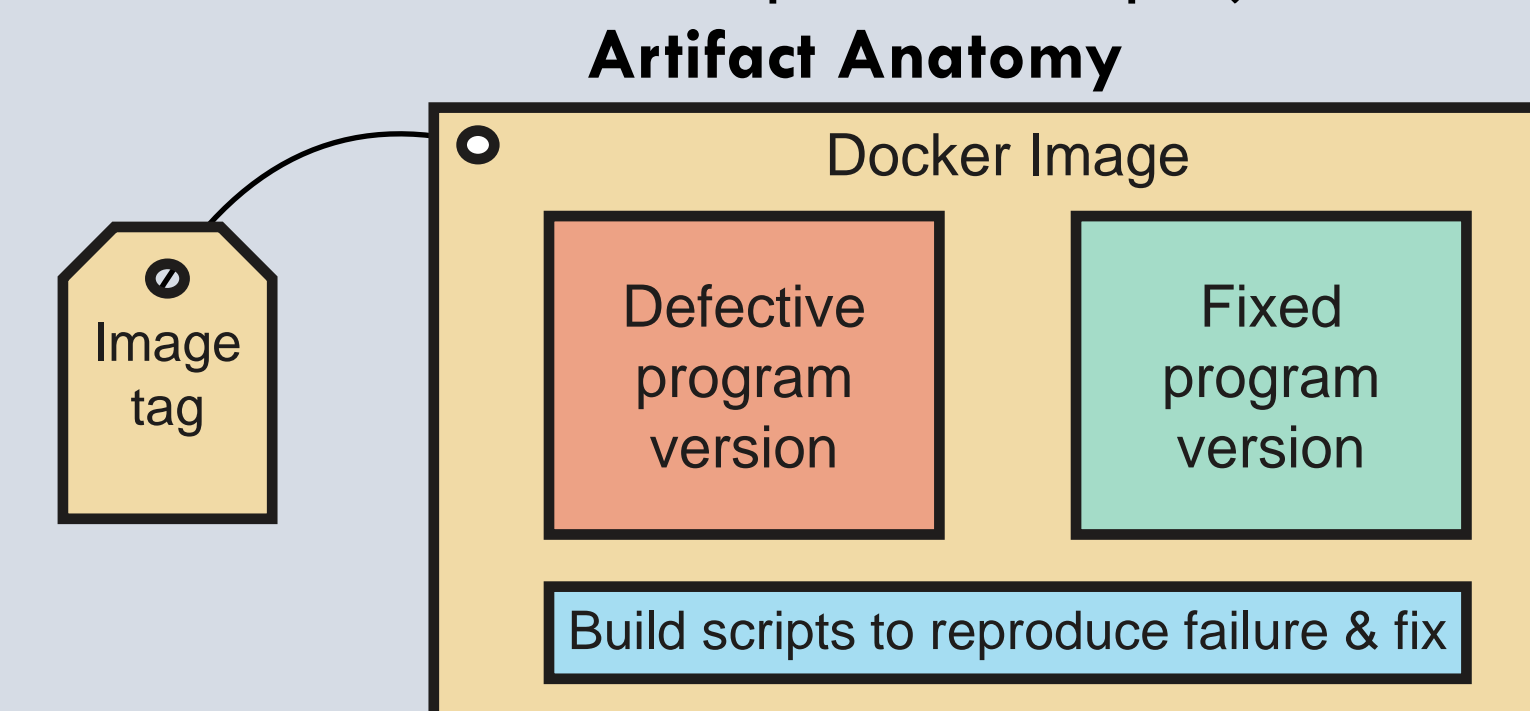
**Diversity** Enough variability in scale, maturity, domain, language, severity, etc.

**Currency** Continuously keep up latest languages, platforms and libraries

**Reproducibility** Failure & fix durably built, run and same results can be observed

## BugSwarm Dataset

BugSwarm includes more than 3000 Java and Python software defect artifacts mined from open-source projects.



<https://www.bugswarm.org/dataset/>

## Challenges for Growth & Sustainability

### Maintaining Long-Term Reproducibility [2]

- Reproducibility of software defect datasets decays after creation
  - We conducted a study on 5 state-of-the-art Java defect datasets
  - Reproducibility of software defect datasets was as low as 30%
  - BugSwarm was not an exception, artifacts broke frequently
- Reproducibility is primarily affected due to missing dependencies. We created 10 patches to fix reproducibility, but they induce high maintenance overhead
- We proposed dependency caching and artifact isolation to ensure long-term reproducibility with minimal maintenance effort
  - BugSwarm's reproducibility has remained higher than 95%

### Artifact Labeling

- Labels are critical not only for dataset usability but to guide the growth of the dataset
- Current labeling methodology is based on multiple criteria:
  - Exceptions raised in the failed build
  - Patch location: code files, test files and/or build files
  - Diff size, language, build system, number of tests run/failed
- Exploring other potential methodologies for labeling
  - Failure reproducibility is a big advantage over mining alone

### Large-Scale Mining & Reproduction

- Big opportunity for dataset growth
- We mine 215 new reproducible artifacts in a month with single server
  - 1M GitHub Actions from 824 repositories in a month period
  - 25K initial fail-pass pairs ⇒ 12K fail-pass pairs after filtering
  - Attempted reproduction of 3K fail-pass pairs
  - Resulted in 467 reproducible artifacts ⇒ 215 isolated

<https://www.bugswarm.org/statistics/>

### References

- [1] D.A. Tomassi, N. Dmeiri, Y. Wang, A. Bhowmick, Y.-C. Liu, P.T. Devanbu, B. Vasilescu, C. Rubio-González, "BugSwarm: Mining and Continuously Growing a Dataset of Reproducible Failures and Fixes," in ICSE 2019.  
 [2] H.-N. Zhu, C. Rubio-González, "On the Reproducibility of Software Defect Datasets," in ICSE 2023.  
 [3] H.-N. Zhu, K.Z. Guan, R.M. Furth, C. Rubio-González, "ActionsRemaker: Reproducing GitHub Actions," in ICSE-Companion 2023.

## BugSwarm Infrastructure

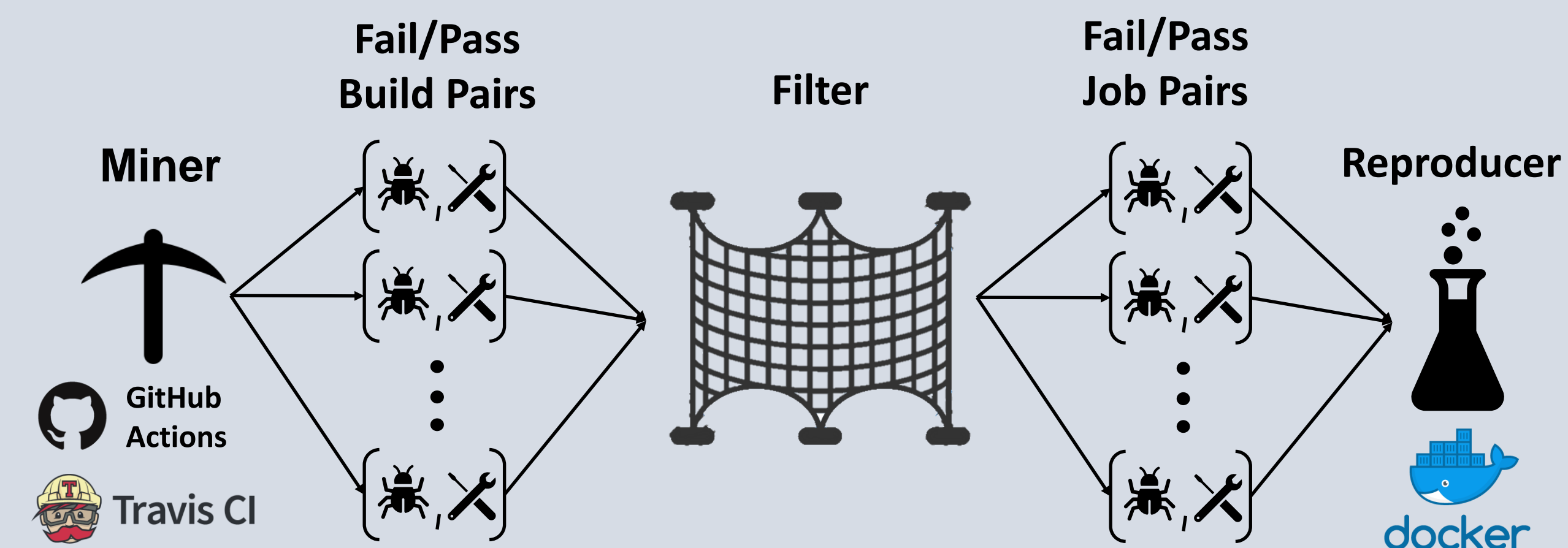
**Pair Miner** Mines consecutive fail-pass build pairs from CI services such as Travis-CI or GitHub Actions

- Scans pairs of builds in chronological order
- Extracts consecutive fail-pass build pairs

**Pair Filter** Applies filtering rules to discard unsuitable fail-pass pairs

**Reproducer** Reproduces the fail-pass pairs

- Checks out fail-pass commits to generate build scripts
- Runs build scripts to reproduce failure and fix
- Analyzes build logs to verify reproducibility



<https://github.com/bugswarm/bugswarm>

## Artifact Metadata

**Project** GitHub slug, primary language, build system, etc.

**Reproducibility** Number of attempts/successful attempts to reproduce

**Labels** Exceptions observed and patch location

**Pull Request** Pull request ID and branch

**CI Job** Build & job ID, trigger commit, failed tests (if any)

**Image Tag** Unique identifier for an artifact

## Supporting Tools

Dataset visualization  
<http://www.bugswarm.org/dataset/>

BugSwarm API to query metadata  
<https://www.bugswarm.org/docs/toolset/bugswarm-rest-api/>

BugSwarm CLI to download and run an artifact interactively  
<https://www.bugswarm.org/docs/toolset/bugswarm-cli/>