

# Failure Sketches: A Better Way to Debug

Baris Kasikci, Cristiano Pereira, Gilles Pokam,  
Benjamin Schubert, Madan Musuvathi, George Candea

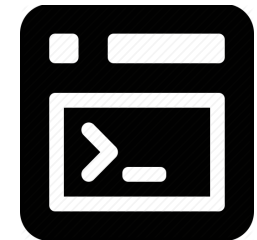
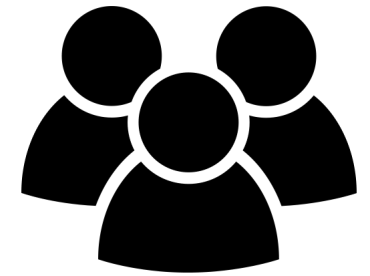


# Failure and Root Cause

- Failure
  - Violation of a program specification
  - Memory errors, hangs, etc
- Root cause
  - “The real reason” behind the failure
  - When removed from the program, the failure does not recur

# Debugging In-Production Software Failures Today

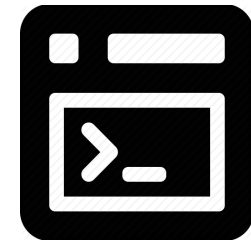
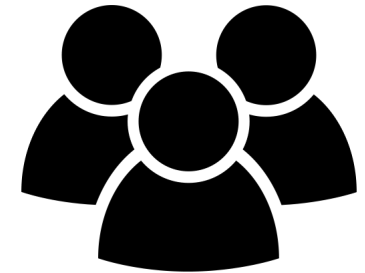
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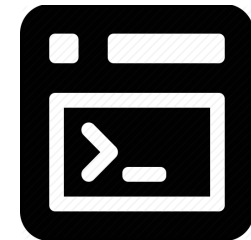
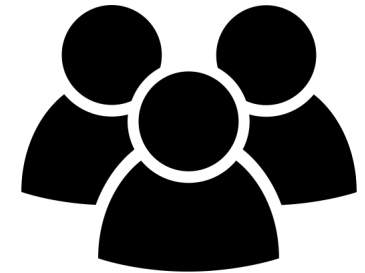


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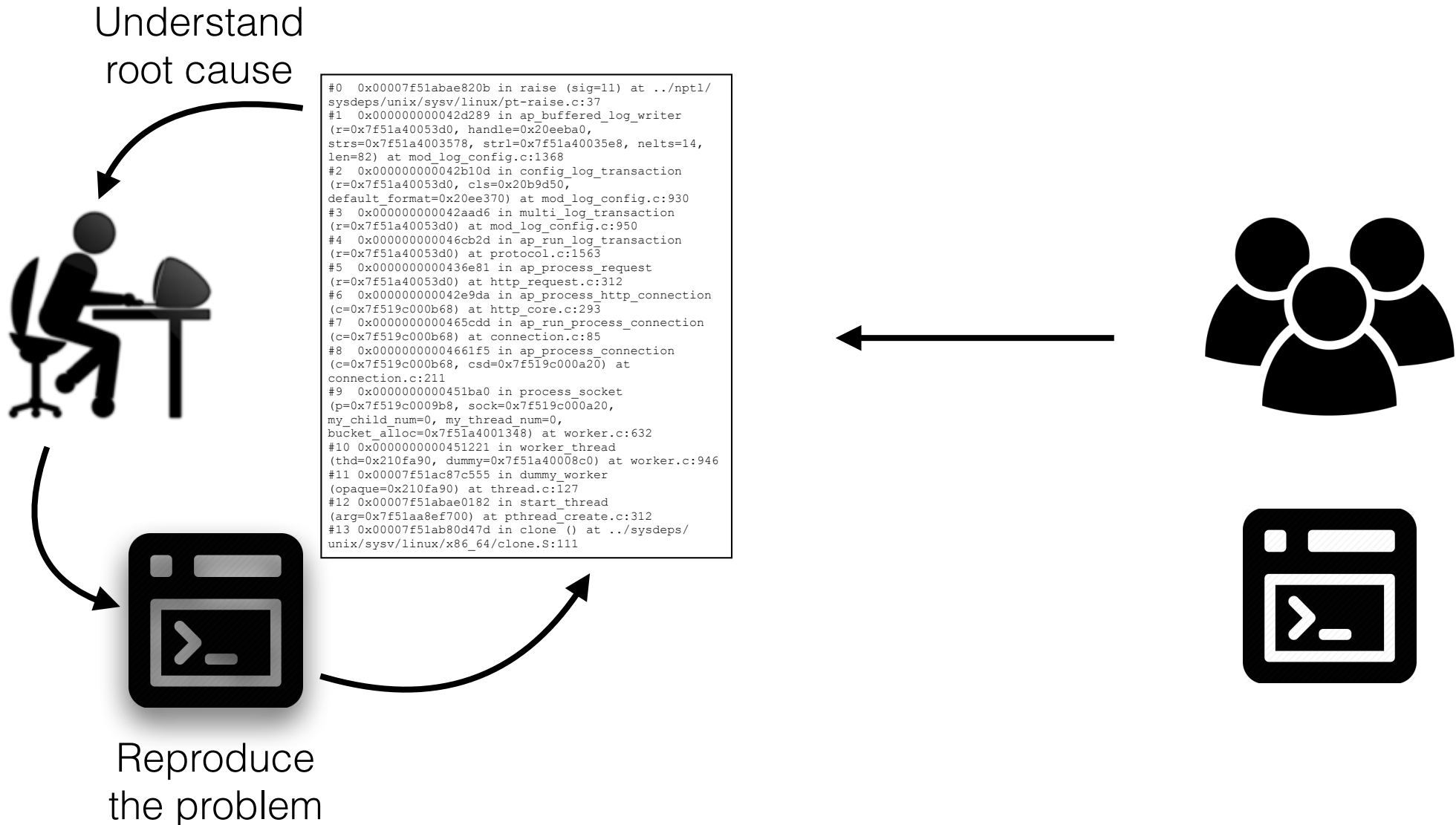
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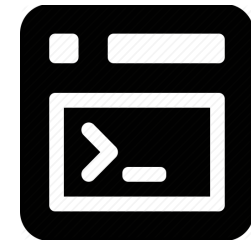
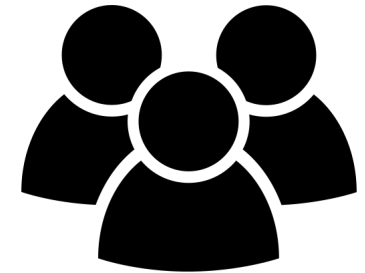


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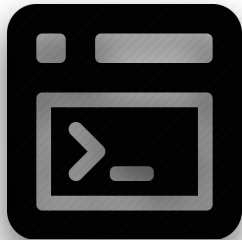
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Reproduce  
the problem





# Tackling the Debugging Challenge

- Record/replay
- Special runtime support<sup>1</sup>
  - VM checkpointing
- Custom hardware<sup>2</sup>
  - Not widely available

<sup>1</sup>J. Tucek et al., Triage: Diagnosing Production Run Failures at the User's Site, SOSP 2007

<sup>2</sup>G. Pokam et al., QuickRec: prototyping an intel architecture extension for record and replay of multithreaded programs, ISCA 2013

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**Existing tools don't help debugging  
in-production failures<sup>3</sup>**

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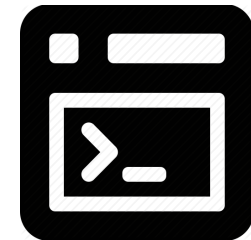
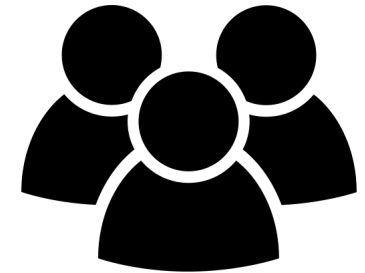
<sup>3</sup> C. Sadowski et al. ,How developers use data race detection tools, Workshop on Evaluation and Usability of Programming Languages and Tools 2014

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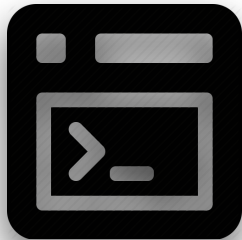
Understand  
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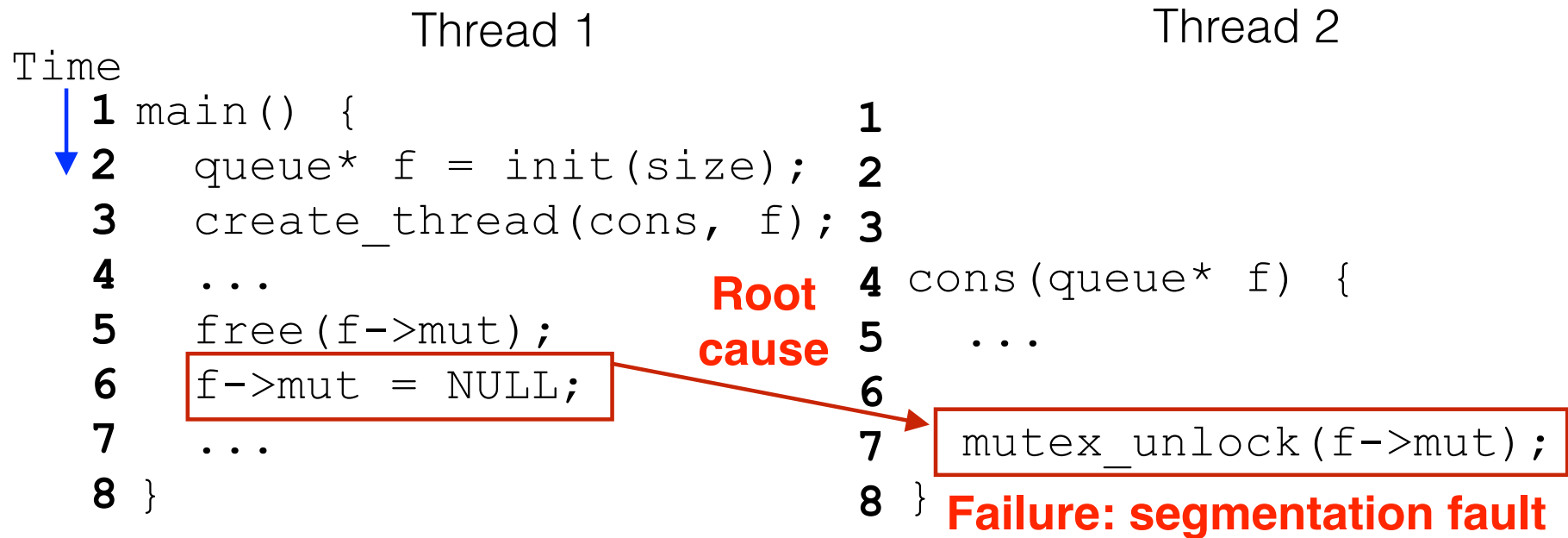
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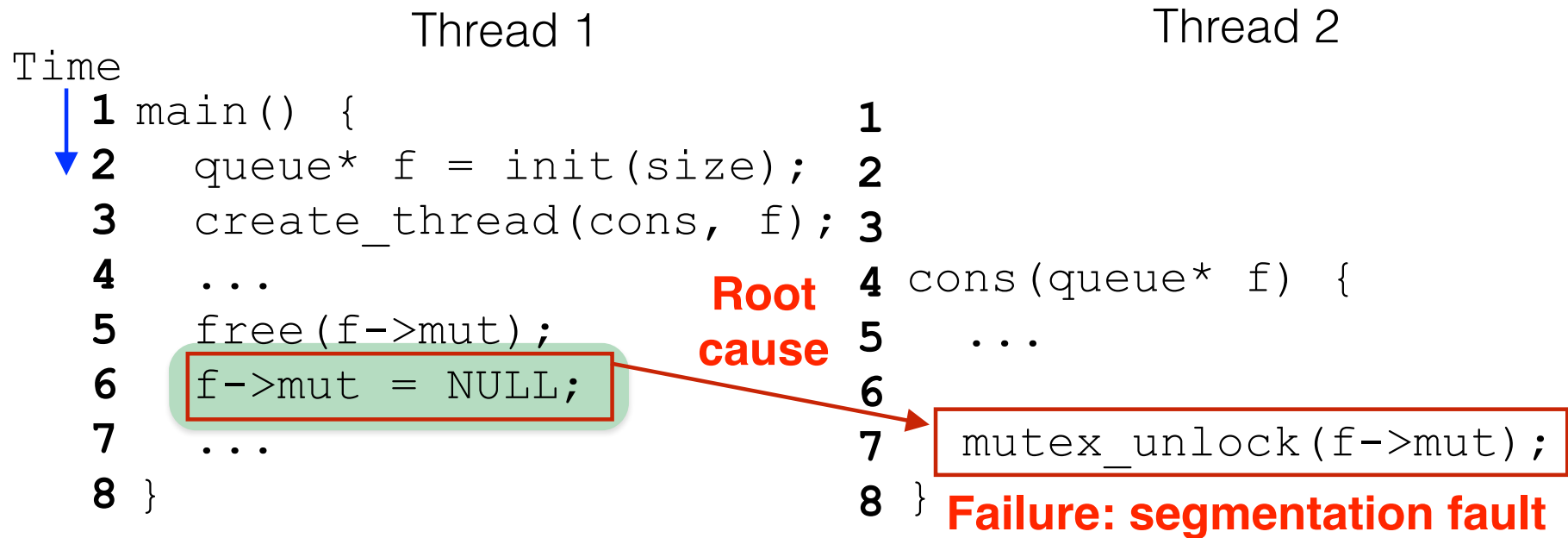
Reproduce  
the problem



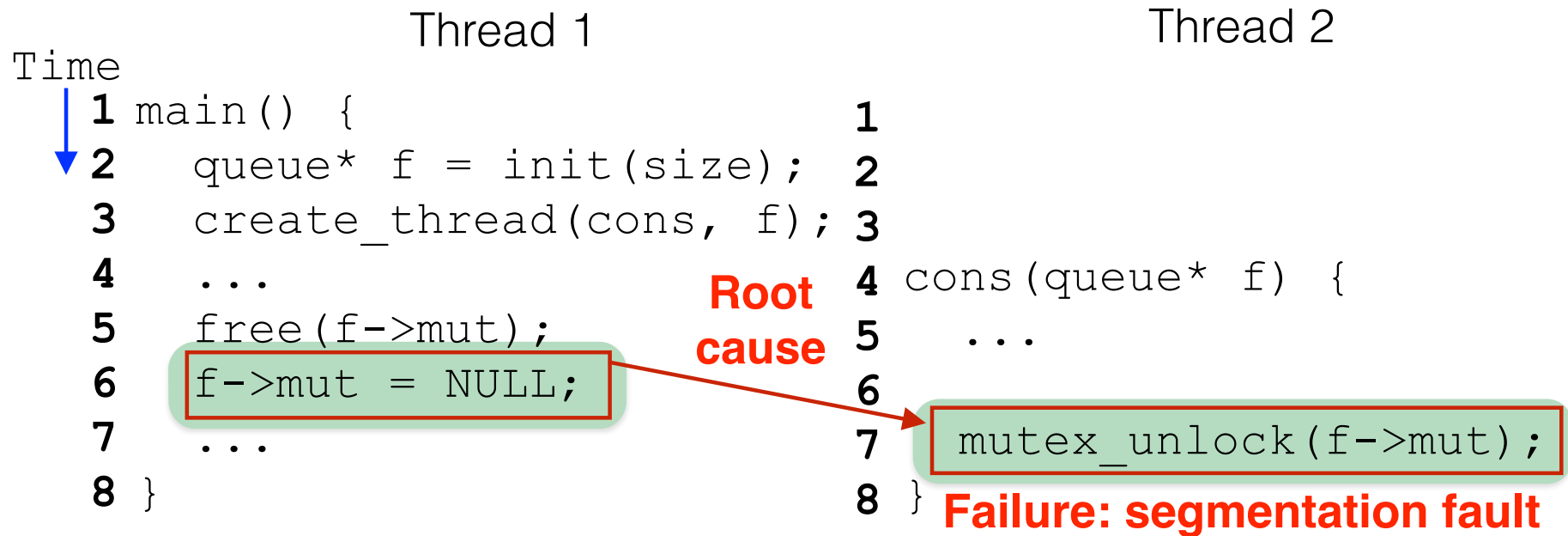
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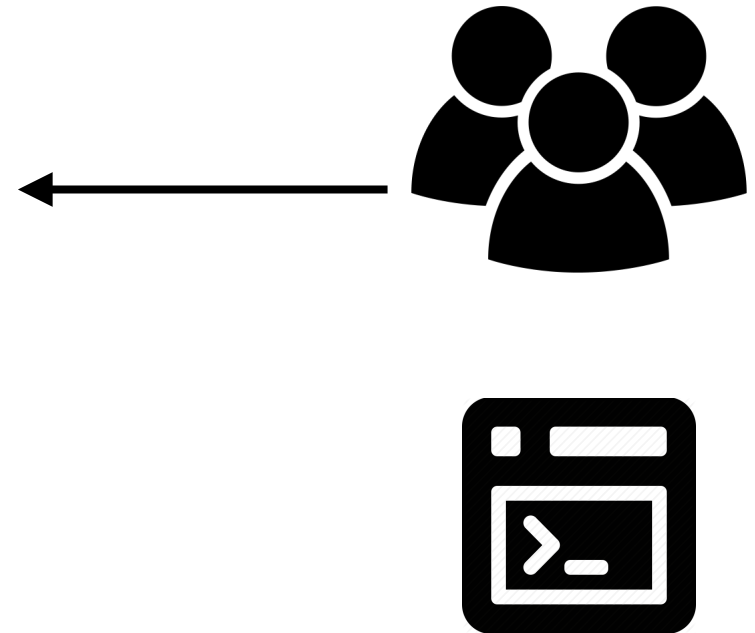
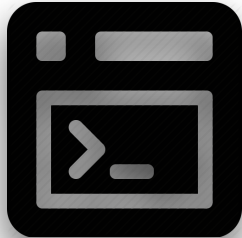
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Reproduce  
the problem



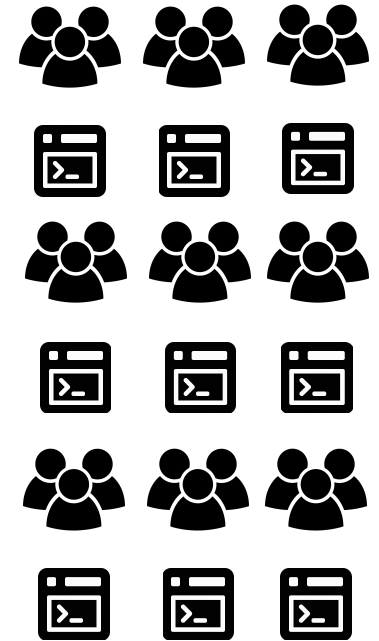
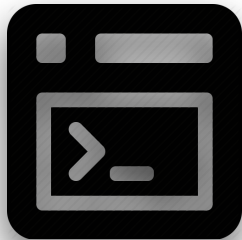
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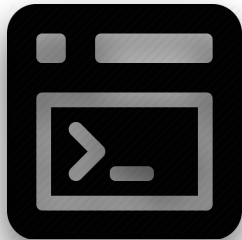
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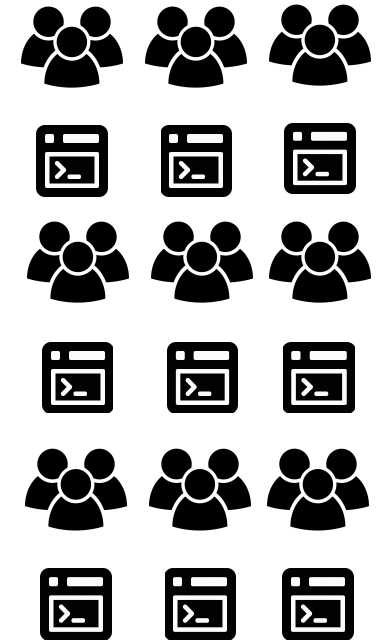


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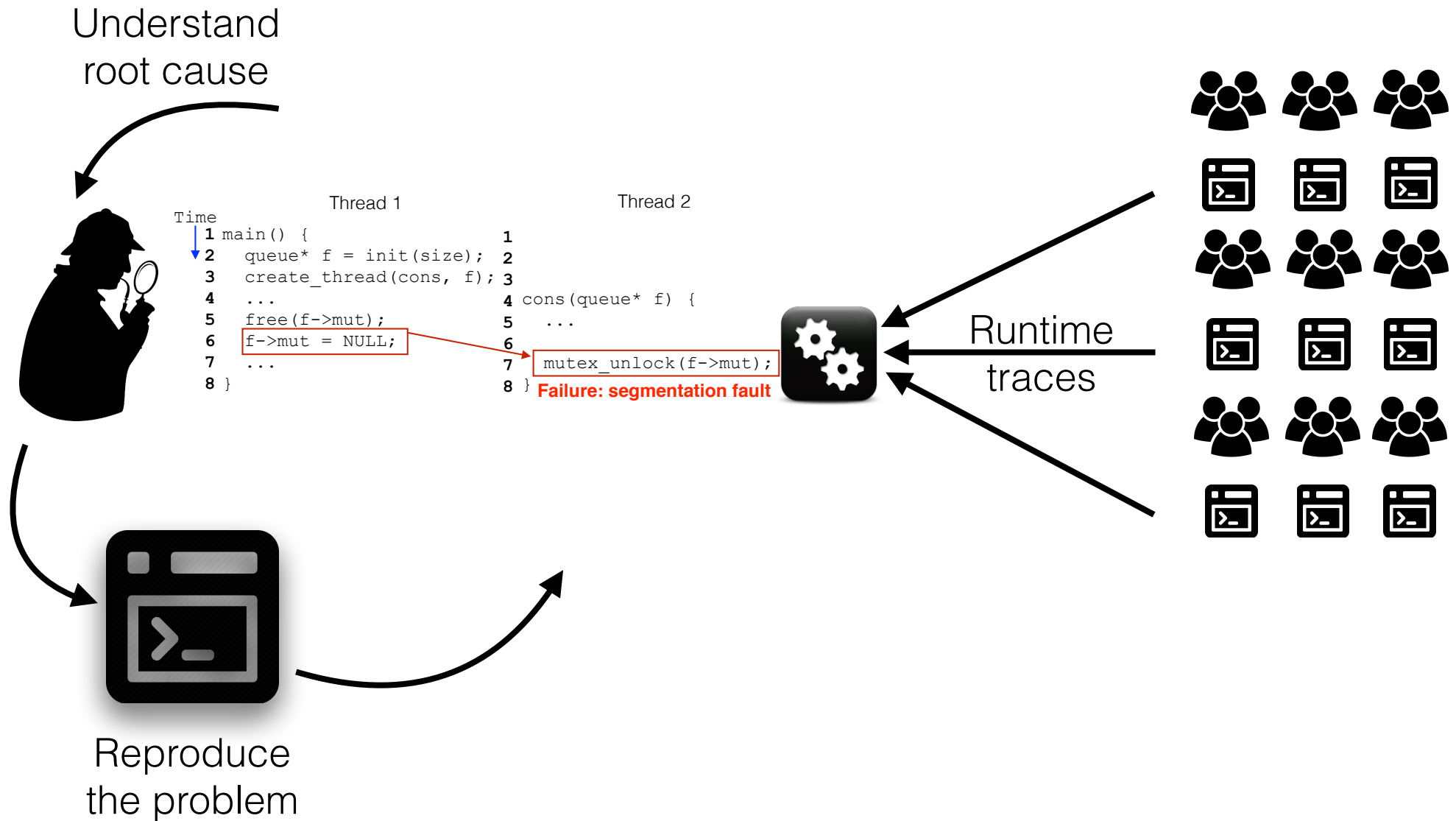
Reproduce  
the problem



Runtime  
traces



# Failure Sketch Use Case



# Failure Sketch Use Case

Understand  
root cause



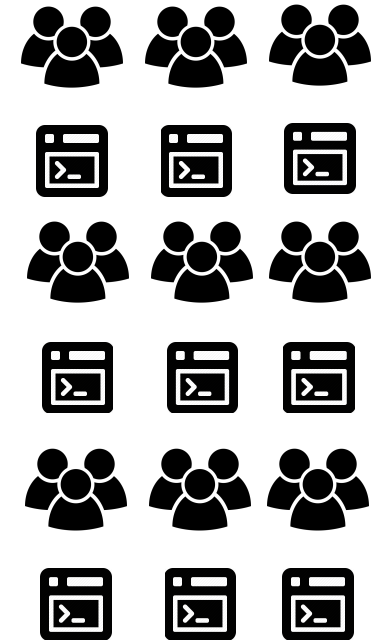
```
Time
↓
1 main() {
2   queue* f = init(size);
3   create_thread(cons, f);
4   ...
5   free(f->mut);
6   f->mut = NULL;
7   ...
8 }

Thread 1

Thread 2
1
2
3
4 cons(queue* f) {
5   ...
6
7   mutex_unlock(f->mut);
8 } Failure: segmentation fault
```



Runtime  
traces



# Failure Sketch Use Case



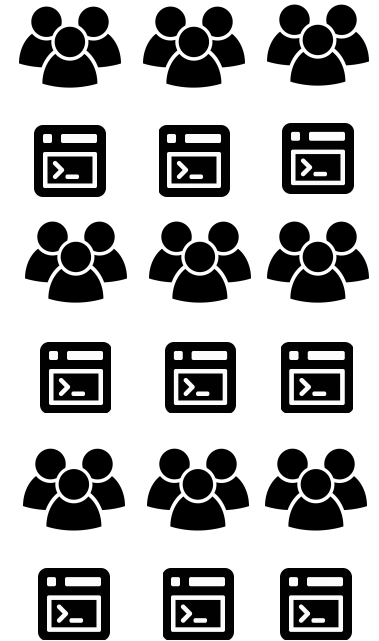
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8 }

Thread 1

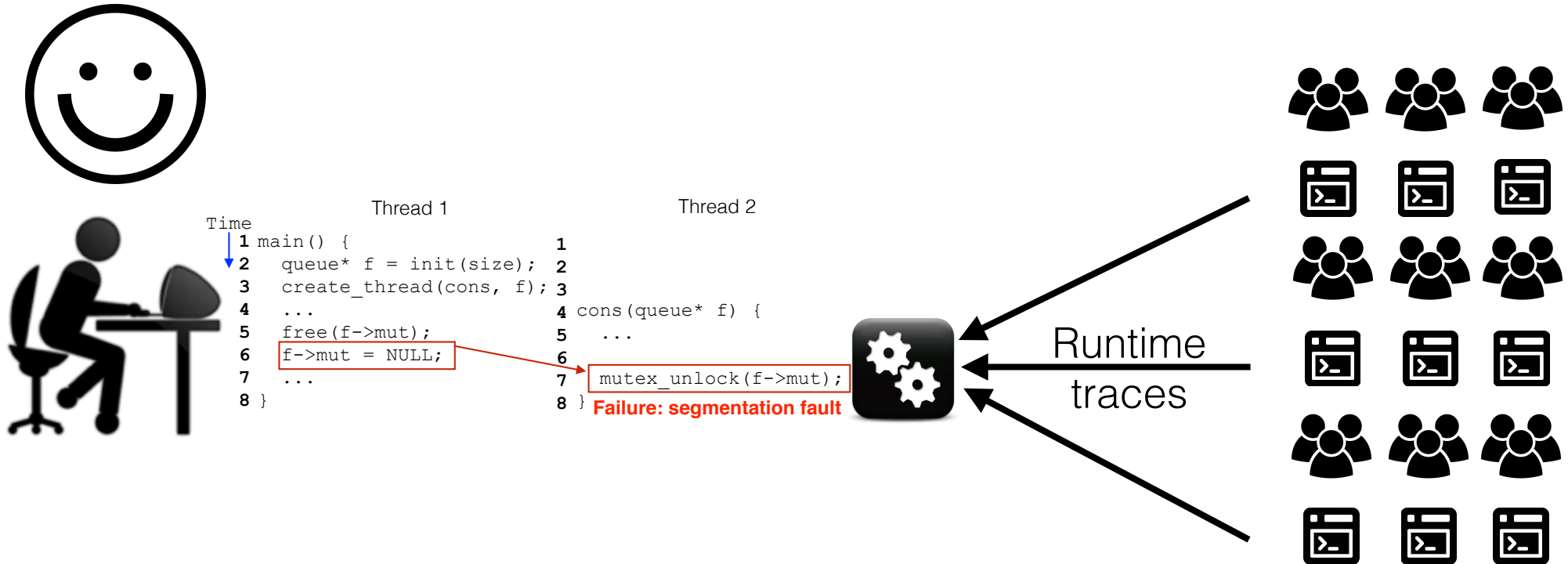
Thread 2
1
2
3
4 cons(queue* f) {
5   ...
6
7   mutex_unlock(f->mut);
8 } Failure: segmentation fault
```



Runtime traces



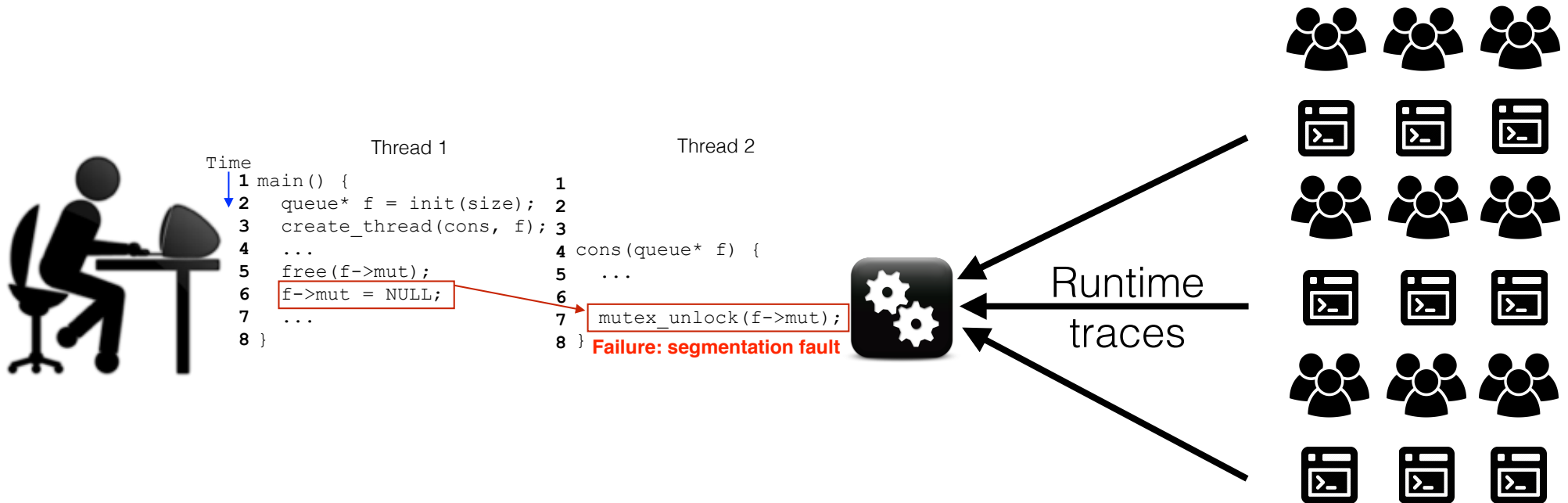
# Failure Sketch Use Case



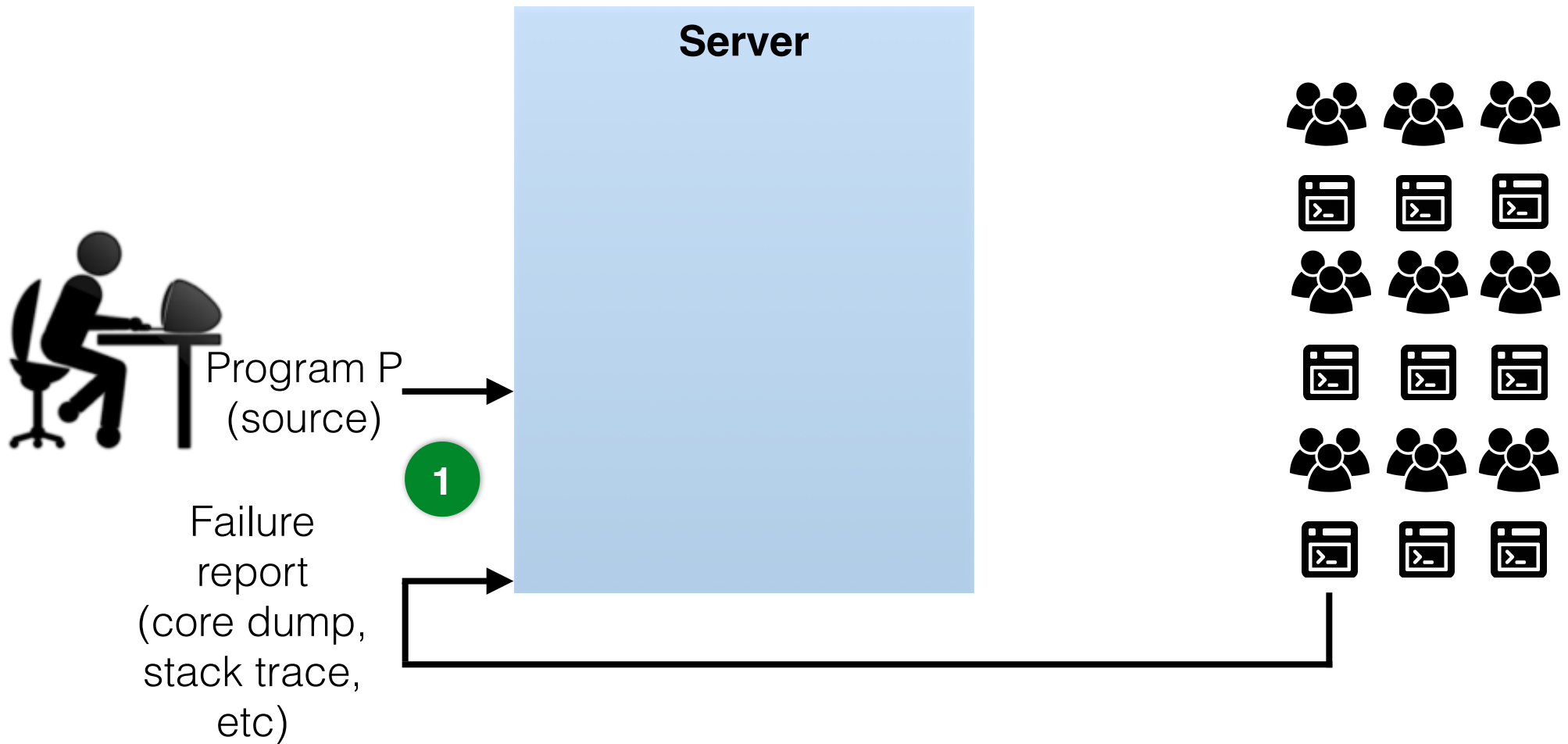
# Research Challenges

- Hard-to-reproduce failures
  - Recur only a few times in production
- Accuracy of failure sketches
  - No extraneous elements in the failure sketch
- Latency of failure sketch computation
  - Developers can't wait forever for failure sketches

# System Architecture

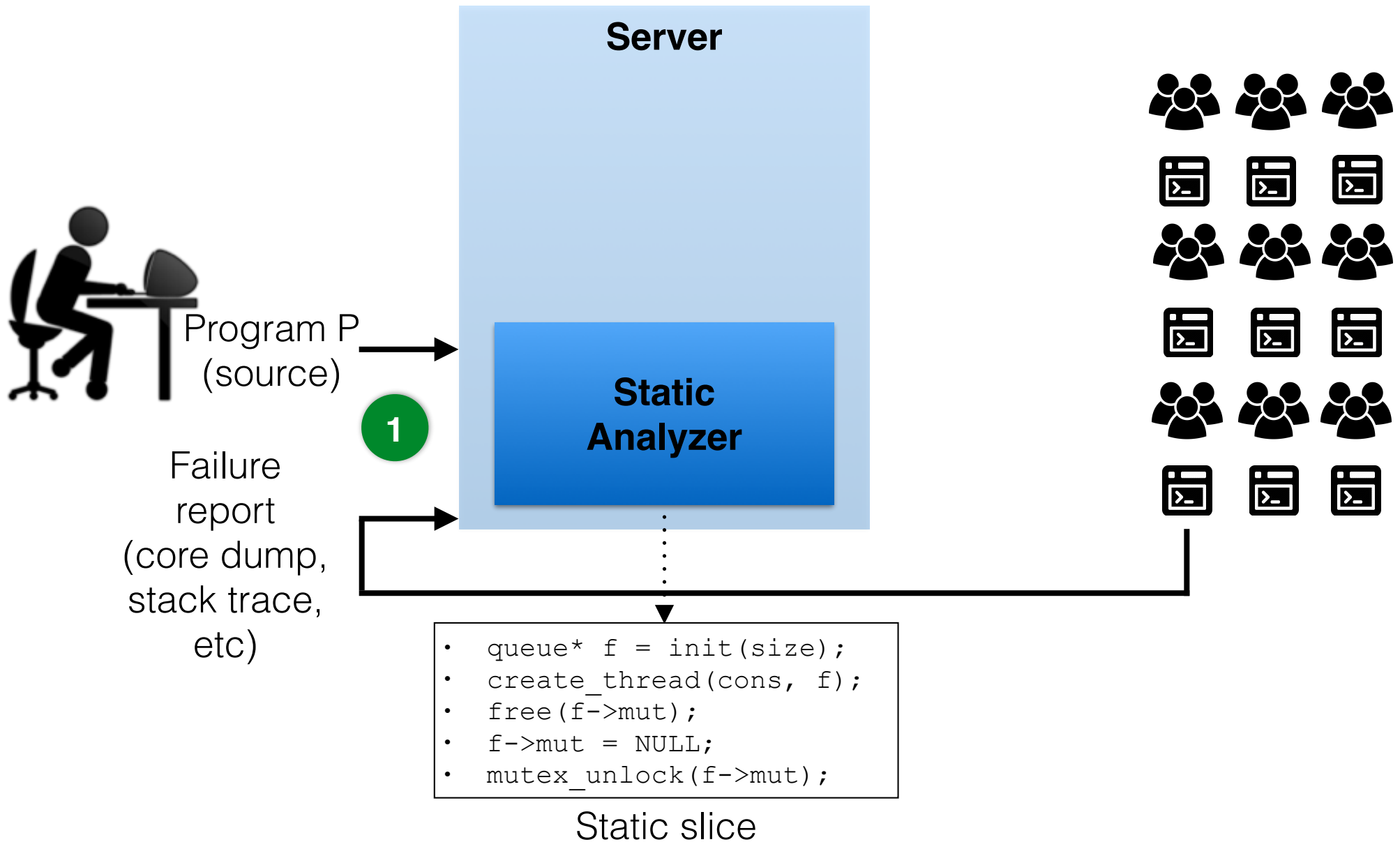


# System Architecture

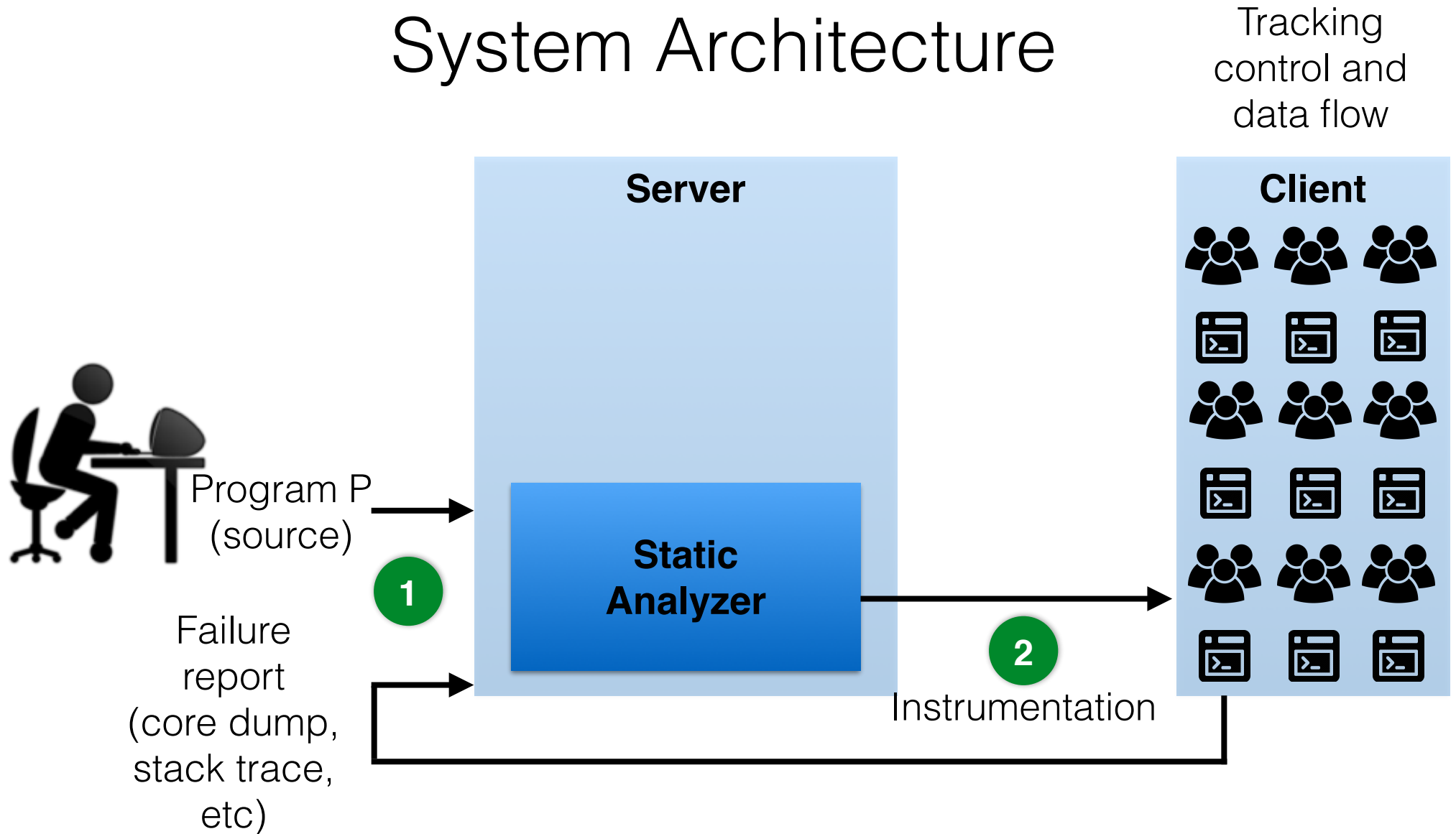




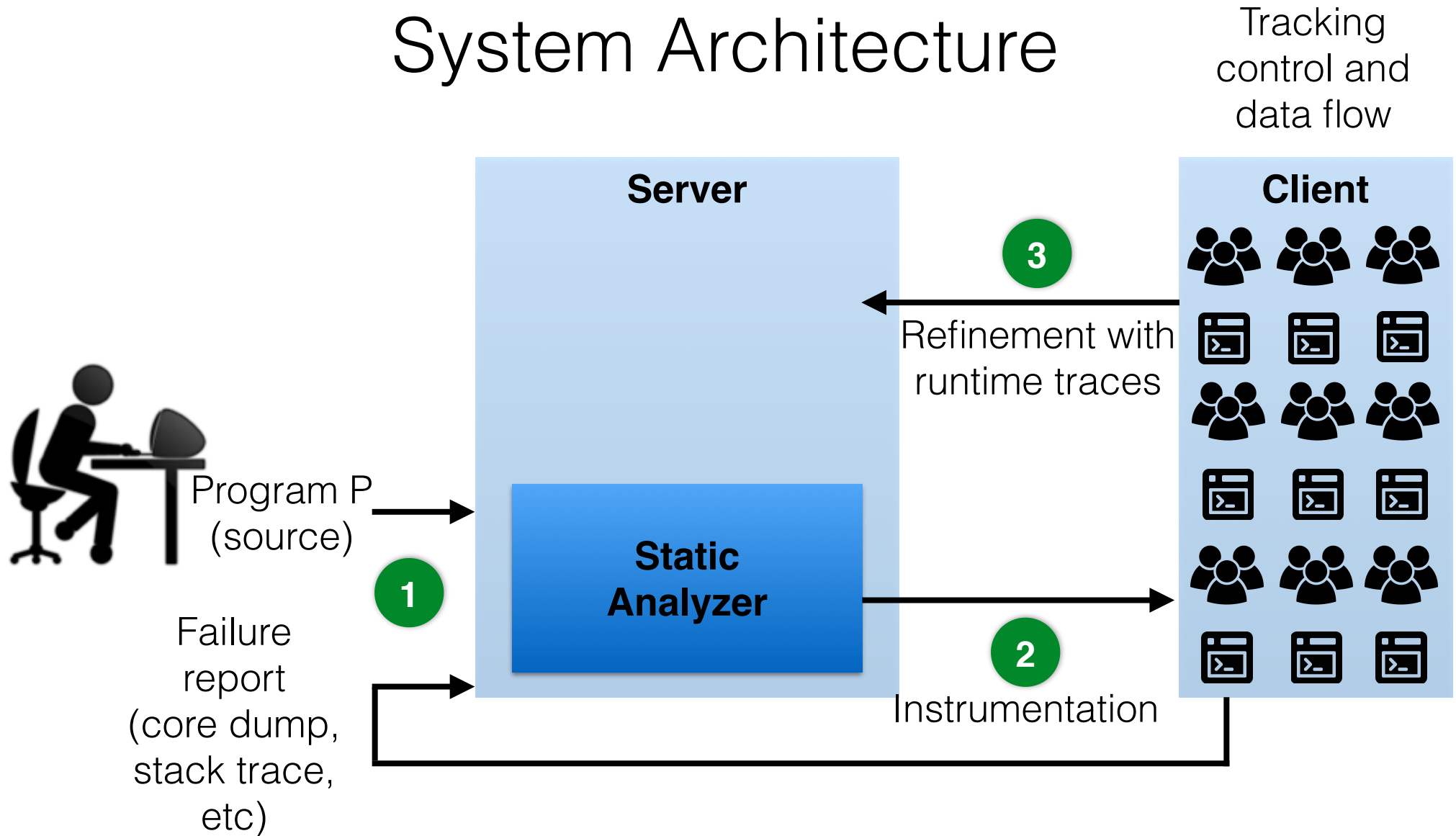
# System Architecture



# System Architecture



# System Architecture



# System Architecture

Tracking control and data flow

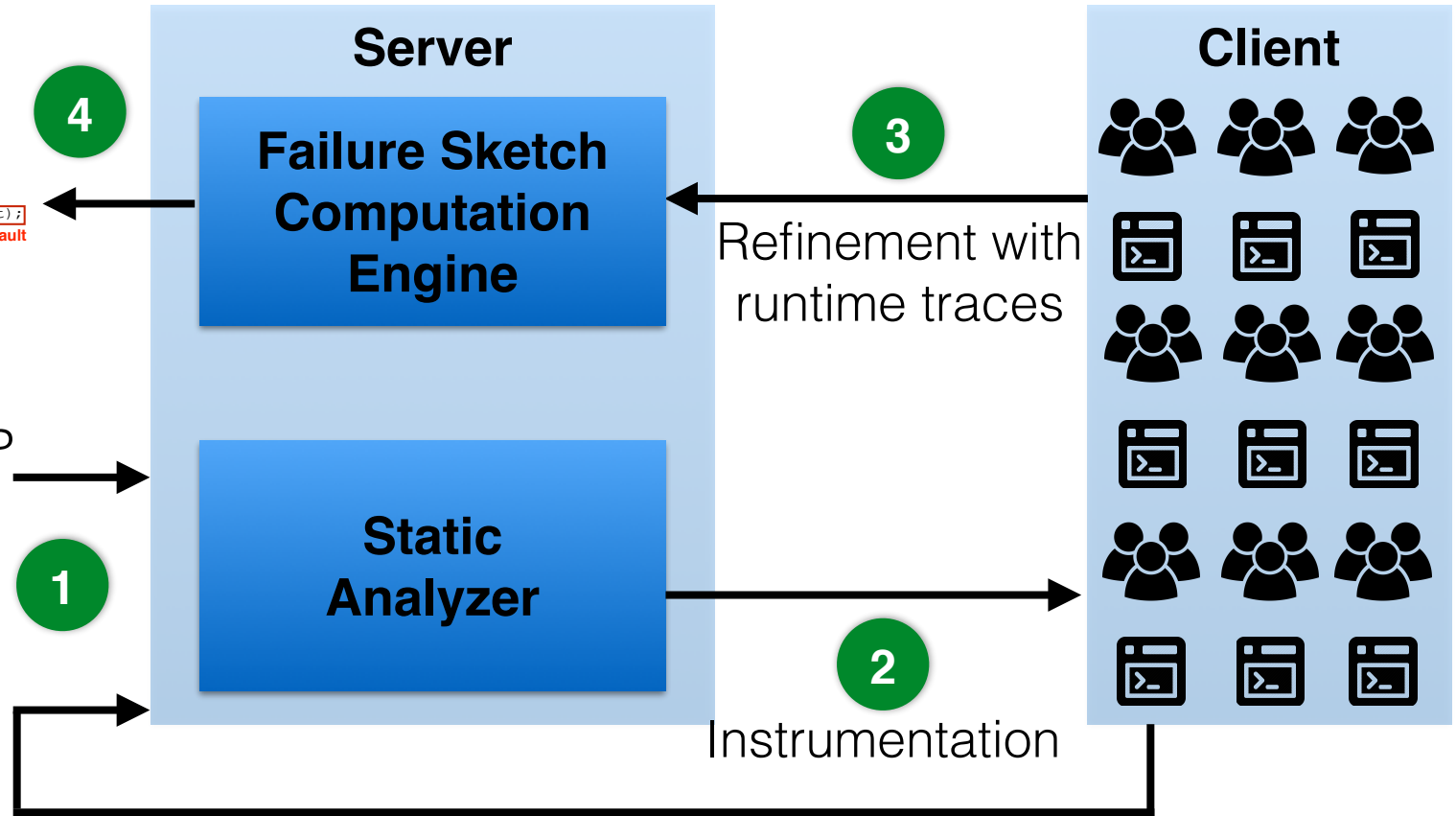
## Failure Sketch

```
Time
↓
1 main() {
2   queue* f = init(size);
3   create_thread(cons, f);
4   ...
5   free(f->mut);
6   f->mut = NULL;
7   ...
8 }
Thread 1
1
2
3
4
5
6
7
8
Thread 2
1
2
3 cons(queue* f) {
4   ...
5   ...
6   ...
7   mutex_unlock(f->mut);
8 }
Failure: segmentation fault
```

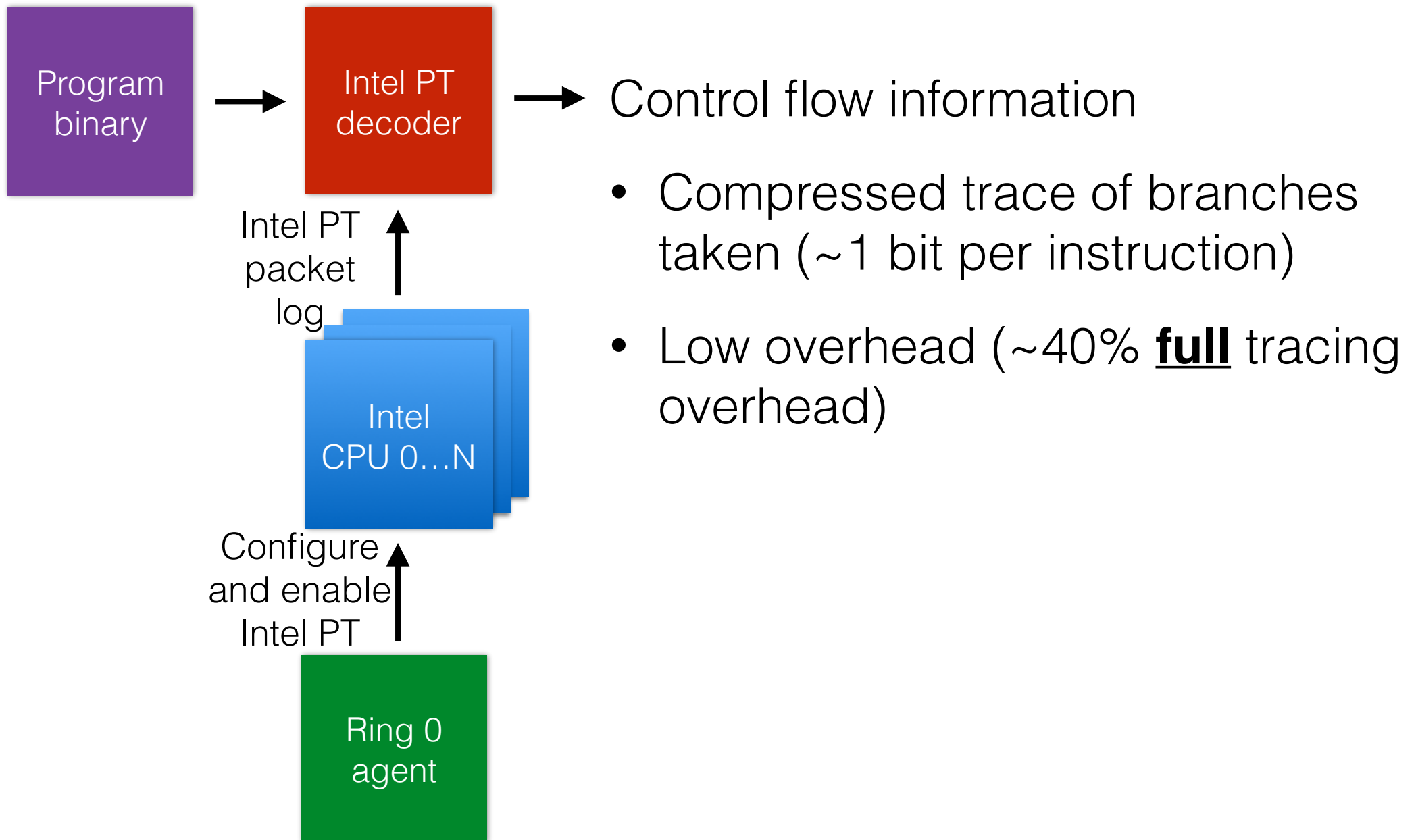


Program P (source)

Failure report (core dump, stack trace, etc)



# Intel Processor Trace (Intel PT)



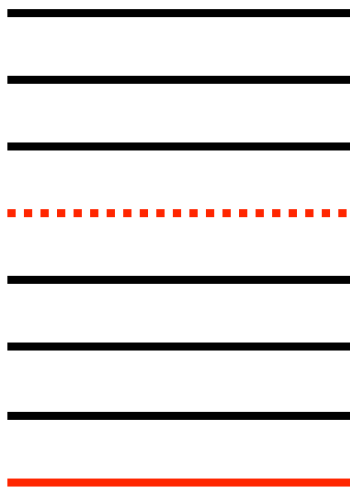
# Tracking Control Flow Using Intel PT

# Tracking Control Flow Using Intel PT

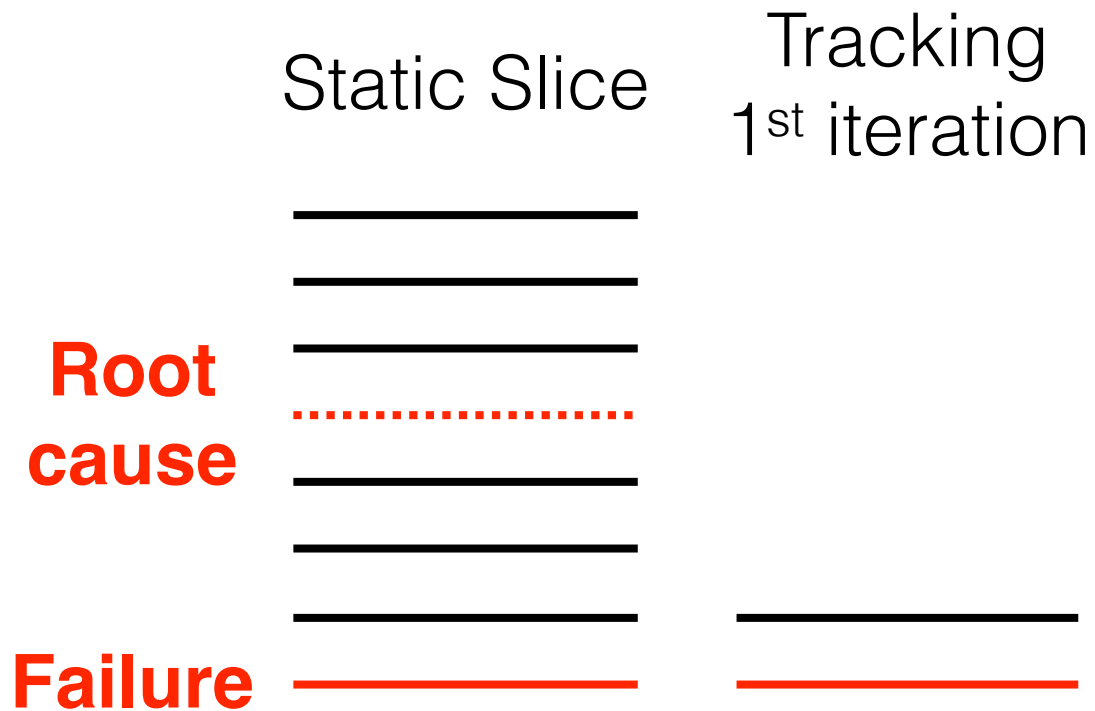
Static Slice

**Root  
cause**

**Failure**

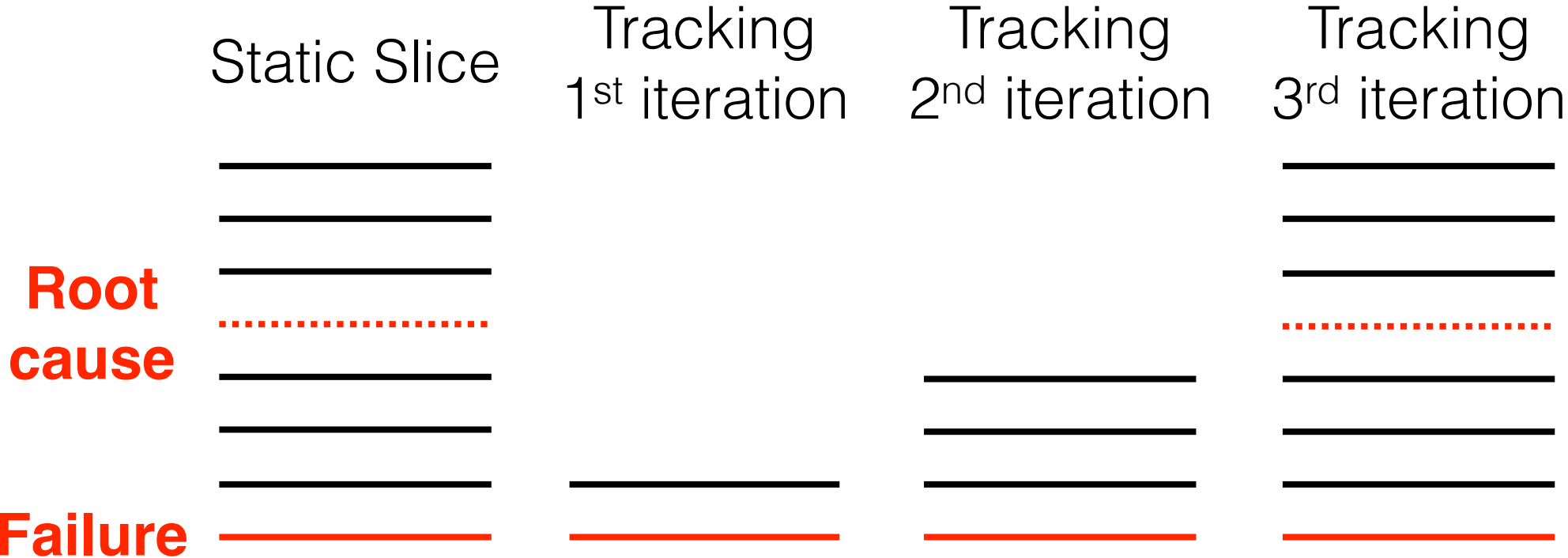


# Tracking Control Flow Using Intel PT

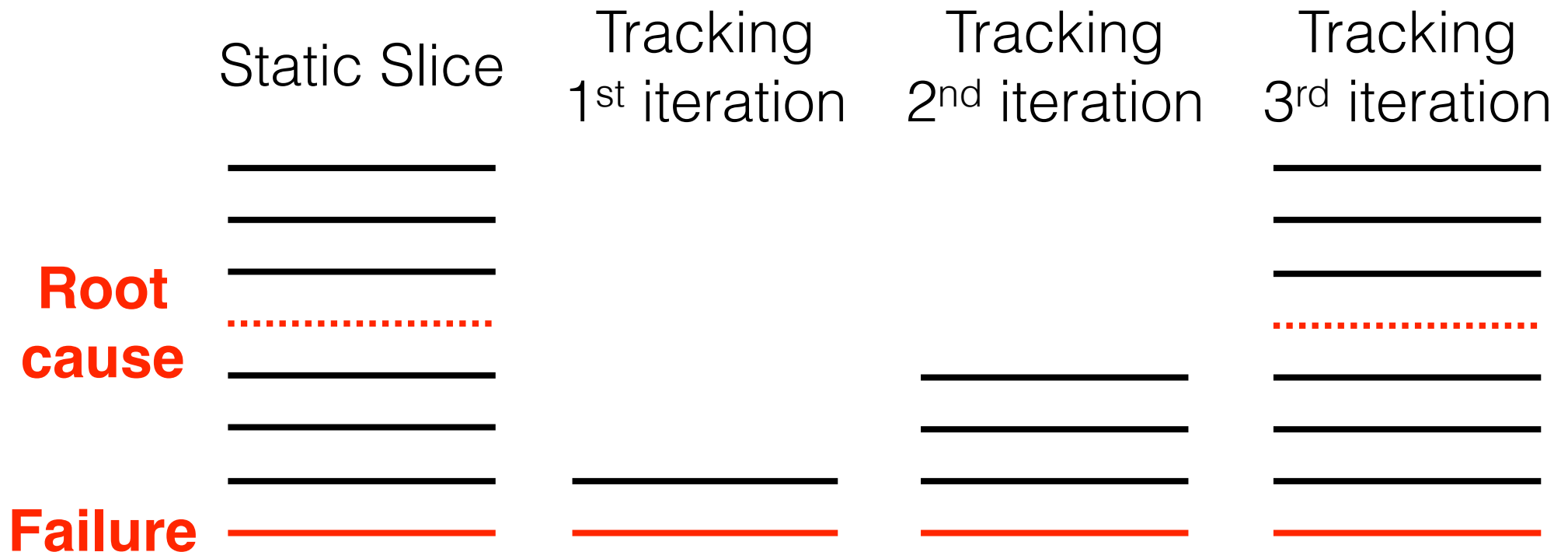




# Tracking Control Flow Using Intel PT



# Tracking Control Flow Using Intel PT



**Monitoring small portions of a slice works well because most failures have nearby root causes<sup>1,2</sup>**

<sup>1</sup>W. Zhang et al., ConSeq: Detecting concurrency bugs through sequential errors. ASPLOS 2011

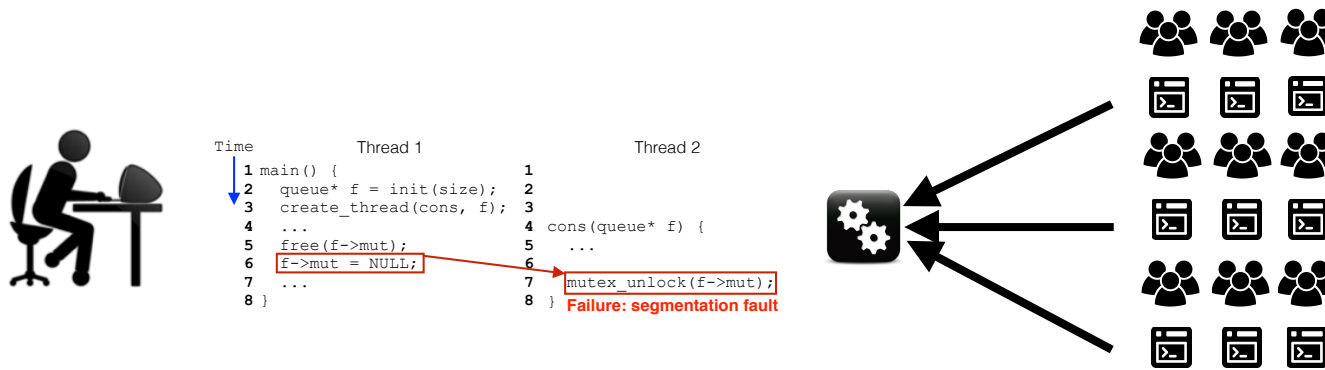
<sup>2</sup>F. Qin et al., Rx: Treating bugs as allergies a safe method to survive software failures. SOSP 2005

# Discussion

- Intrusiveness
  - Currently, we do static instrumentation
  - Dynamic instrumentation is less intrusive
- Privacy
  - Use anonymization
  - Forgo data monitoring when privacy requirements are very strict

# Future Work

- Diagnosing performance problems
  - Correlating control flow with slowdowns
- Speeding up program analysis
  - Use control flow information to tackle path explosion
- Using failure sketches for test case generation



- Failure sketches
  - Summary explaining failure root causes
- Application of hardware-based monitoring
  - Enabler for building failure sketches
  - Many potential use cases