

# Rudra: Finding Memory Safety Bugs in Rust at the Ecosystem Scale

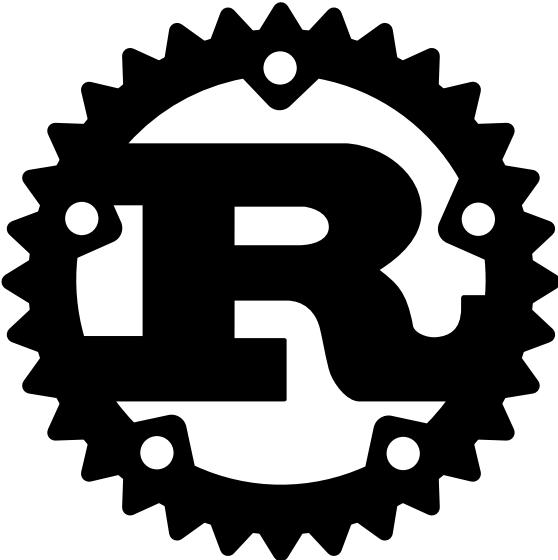
Yechan Bae, Youngsuk Kim, Ammar Askar, Jungwon Lim, Taesoo Kim

Georgia Tech Systems Software & Security Lab (SSLab)

SOSP 2021



# Rust for safe systems programming

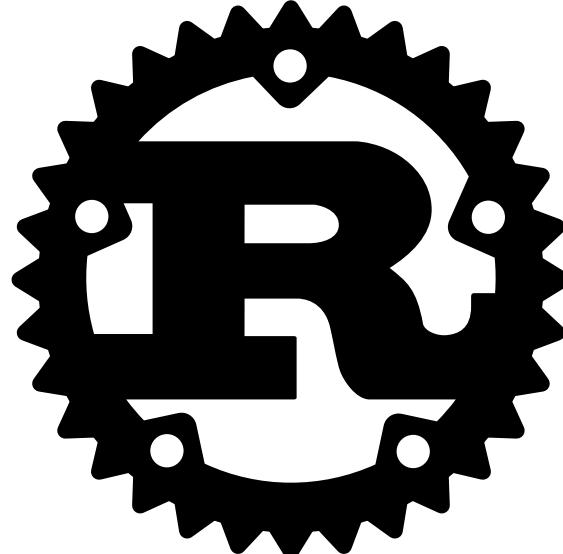


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Google

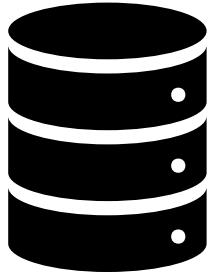
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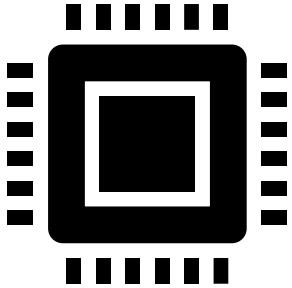


Discord

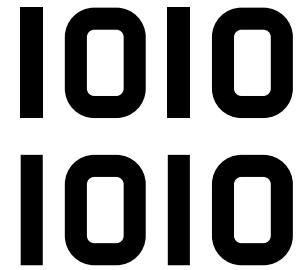
# Dilemma: Safety vs Control



Memory-mapped I/O

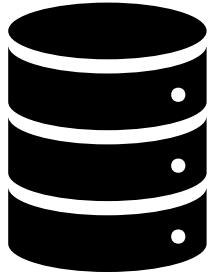


Hardware Abstraction

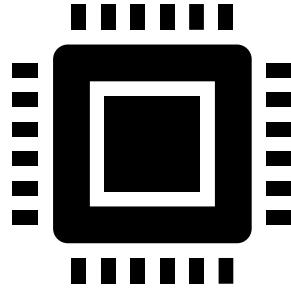


OS Interaction

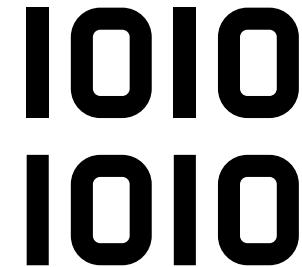
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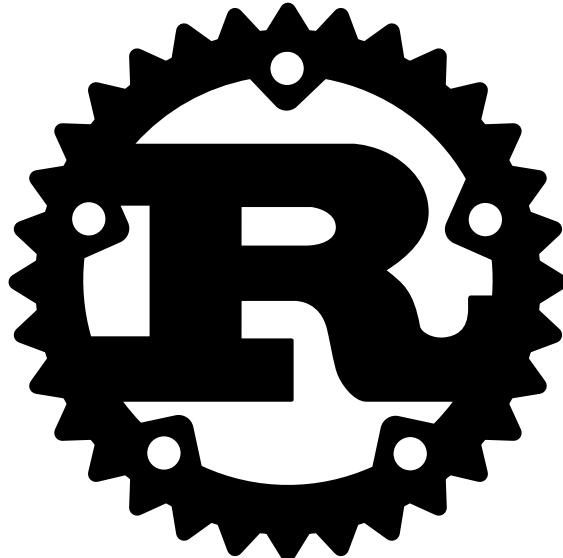
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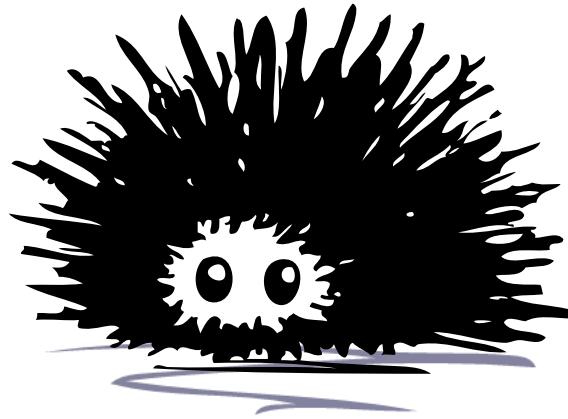
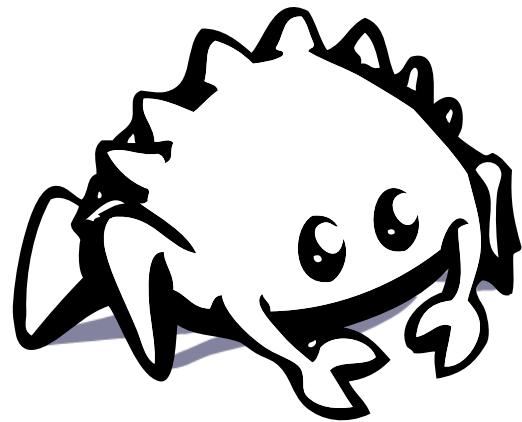
OS Interaction

**Escape hatch: `unsafe` Rust**

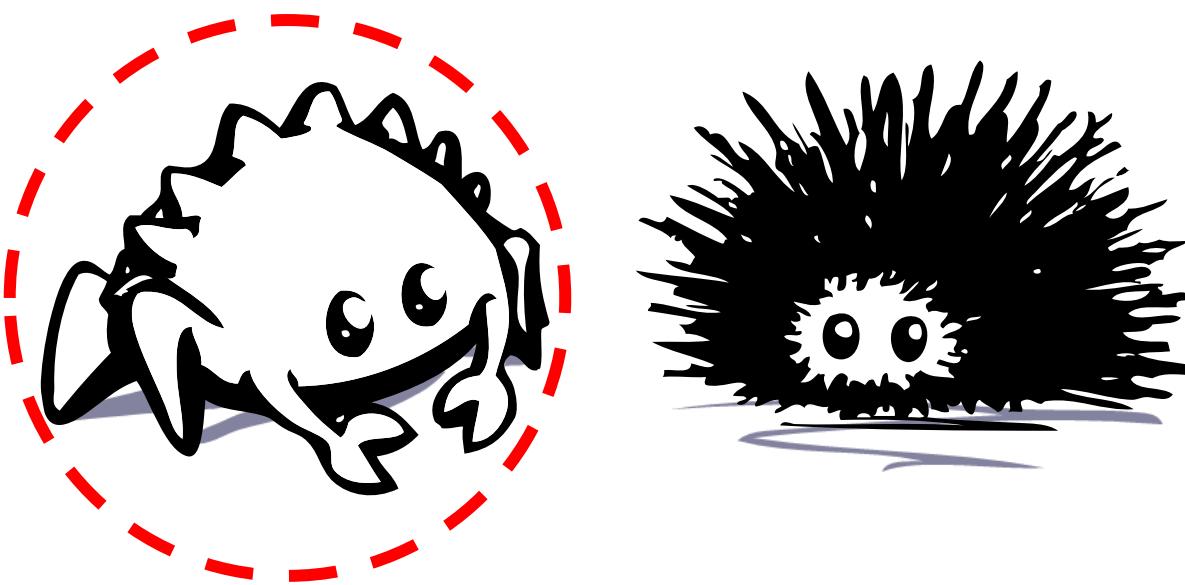
# Safe and Unsafe Rust



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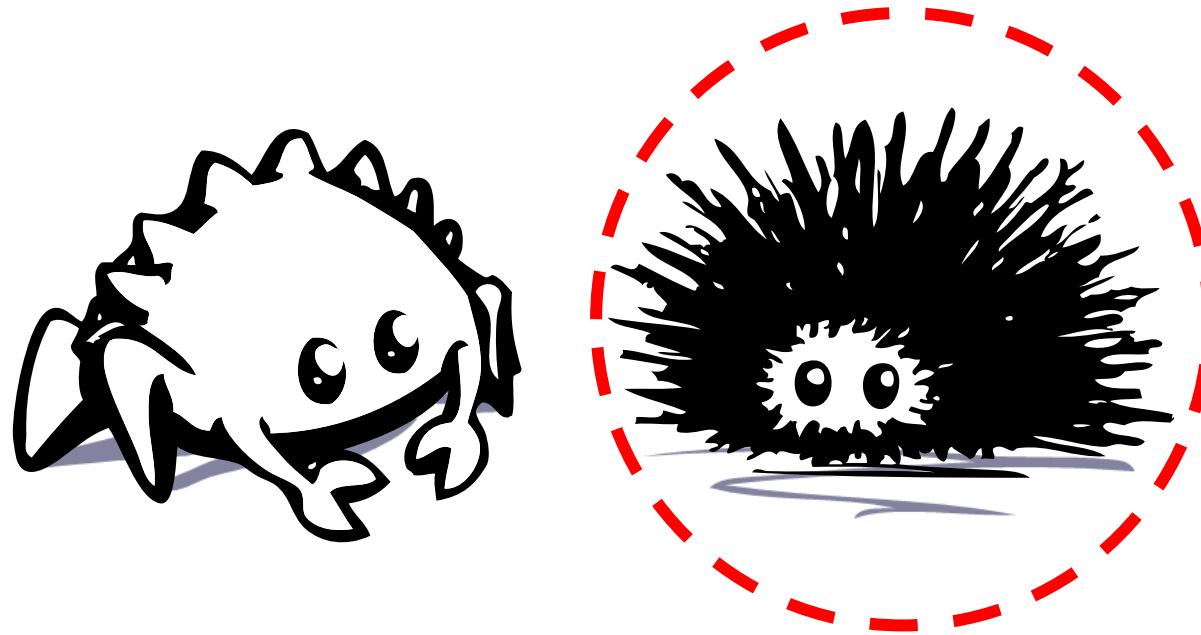


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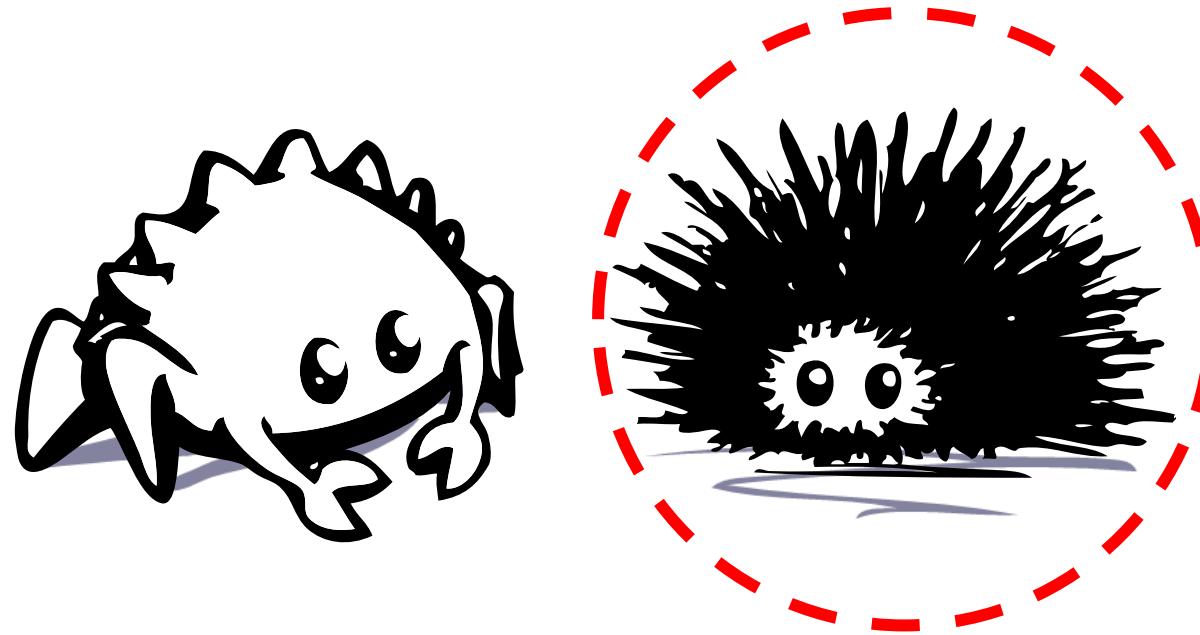
If a program is written entirely in safe Rust,  
the Rust compiler automatically guarantees the memory safety

# Safe and Unsafe Rust



If a program contains unsafe Rust,  
the programmer needs to guarantee the memory safety

# Safe and Unsafe Rust



Memory safety of a Rust program depends on  
the correctness of all **unsafe** code it contains

# Two Ways of Using Unsafe Rust

```
unsafe fn access_unchecked(index: usize) {  
    ...  
}
```

## 1. Unsafe API can be directly exposed to users

- Caller is responsible for providing a correct argument (e.g., in-bound index)

```
fn access(index: usize) {  
    assert!(index < self.len());  
    unsafe { access_unchecked(index); }  
}
```

## 2. Unsafe API can be encapsulated in safe API

- API designer guarantees that this API never causes memory safety bugs

# Two Ways of Using Unsafe Rust

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unsafe fn access_unchecked(index: usize) {  
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# Rudra: A Static Analyzer for Unsafe Rust

- We identified three common bug patterns in unsafe Rust
- We devised two new algorithms to detect them
- We implemented a static analyzer named Rudra, that can scale to the entire Rust ecosystem (43k packages / 6.5 hours)
- Found more than half of the memory safety bugs known to the Rust security advisory database (RustSec)
  - 76 CVEs and 112 RustSec advisories
  - Including two memory safety bugs in the Rust standard library

# The Three Bug Patterns

## **1. Panic safety bug**

- Incorrect resource deallocation in compiler-inserted invisible code paths

## **2. Higher-order invariant bug**

- Unchecked assumptions on user-provided higher-order values

## **3. Send/Sync variance bug**

- Incorrect condition for manual thread safety assertions

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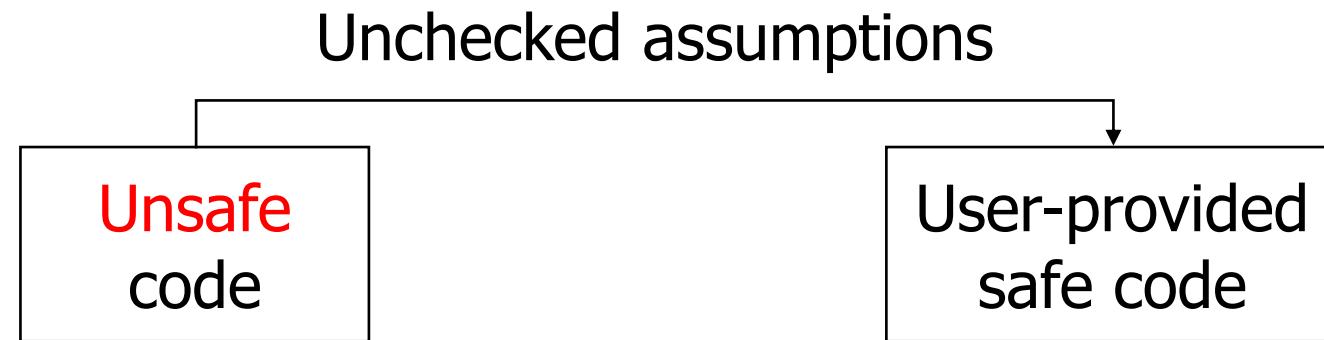
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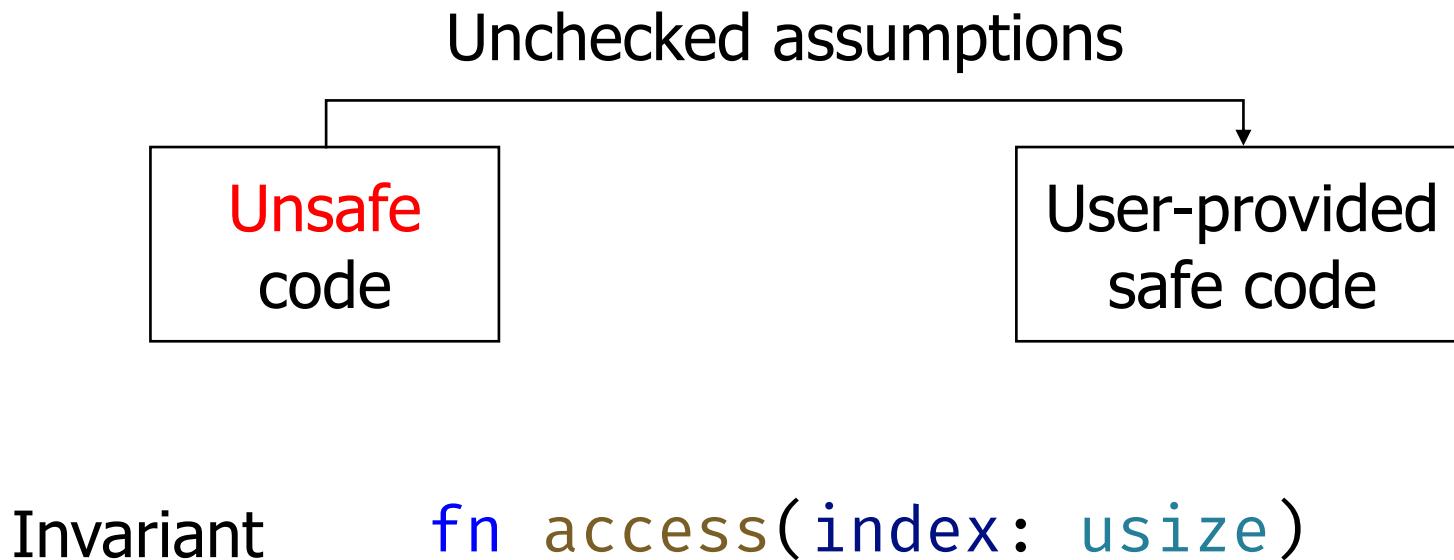
# Higher-Order Invariant Bug

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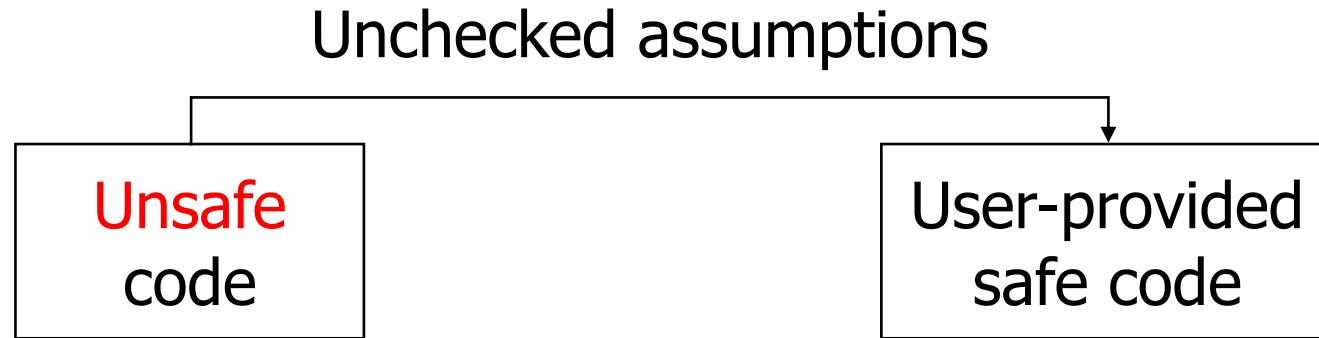
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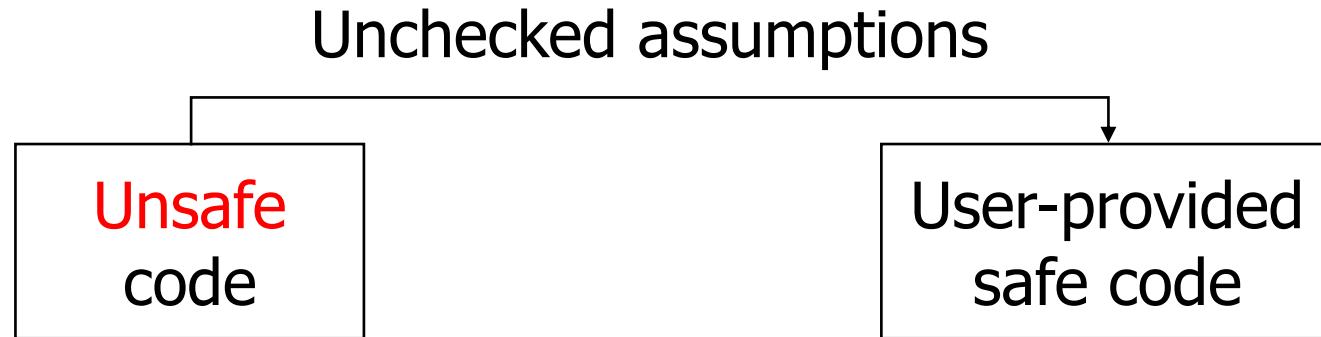


Invariant

`fn access(index: usize)`

# Higher-Order Invariant Bug

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Invariant

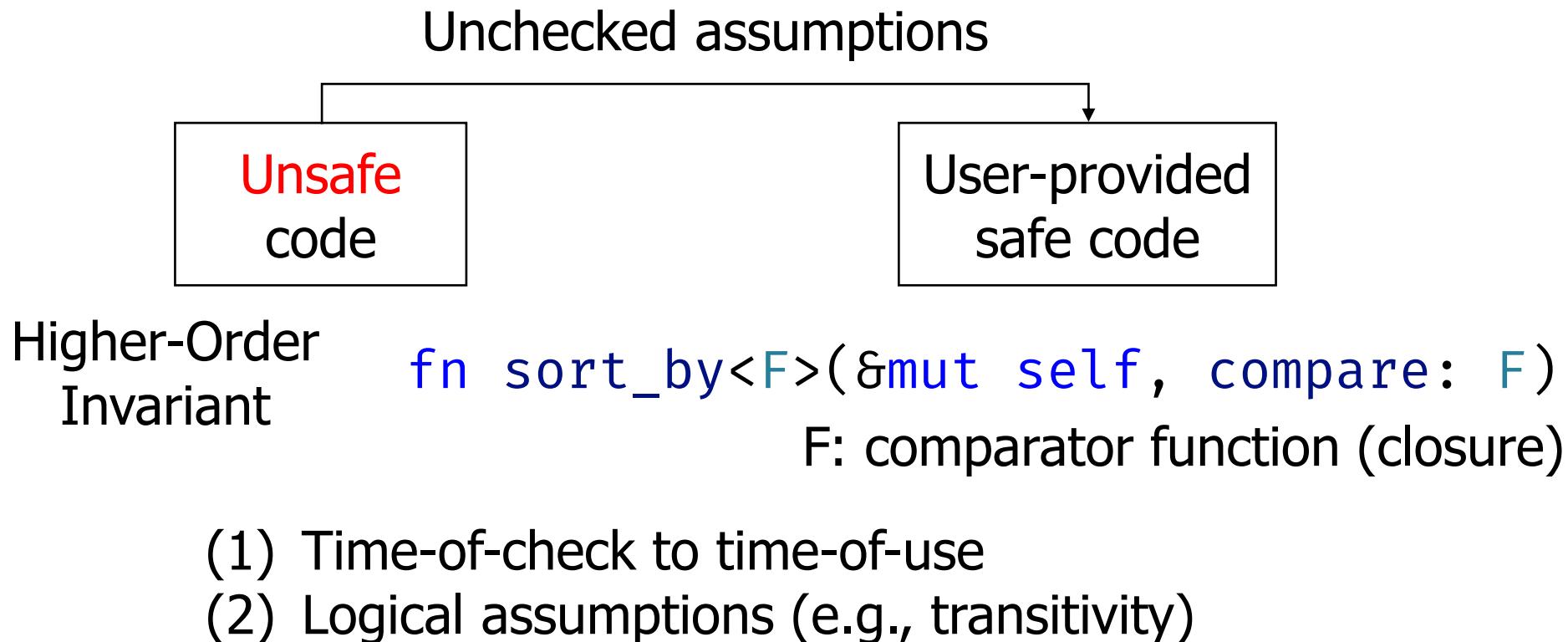
```
fn access(index: usize)
```

Higher-Order  
Invariant

```
fn sort_by<F>(&mut self, compare: F)  
F: comparator function (closure)
```

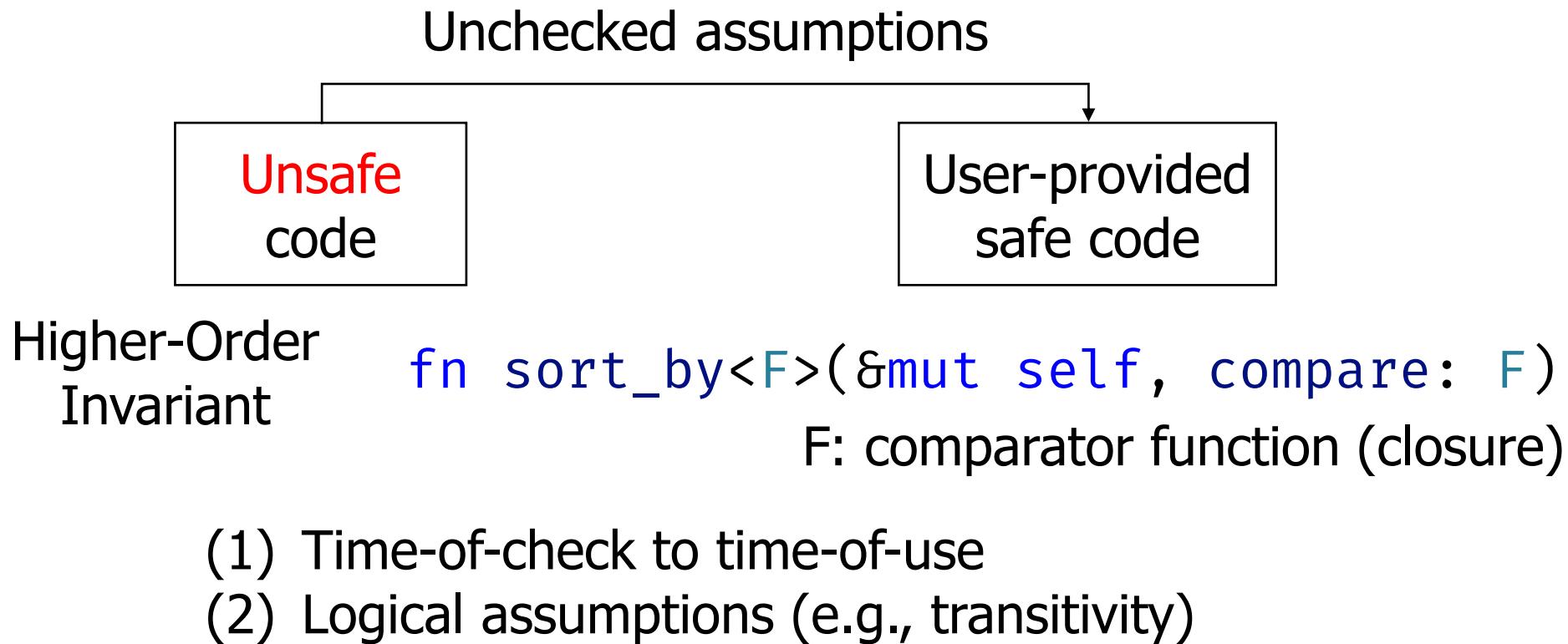
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# Higher-Order Invariant Bug

Unchecked assumptions on user-provided higher-order values



**Example:** CVE-2020-36323, a higher-order invariant bug in string join()  
Found by Rudra in [the Rust standard library](#)

# Bug Example

```
// join(&["a", "b", "c"], "|") => "a|b|c"
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    // code that handles array.len() == 0 or 1
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    let len = sep.len() * (array.len() - 1)
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CVE-2020-36323

A higher-order invariant bug in string join()  
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(Code simplified and renamed for presentation)

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# Bug Example

```
// Custom convert implementation
fn convert(&self) -> &str {
    if self.first_time() {
        "123456"
    } else {
        "0"
}
```

CVE-2020-36323

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Found by Rudra in the Rust standard library

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1. Incomplete definitions
2. Some information is not available in later compiler stages

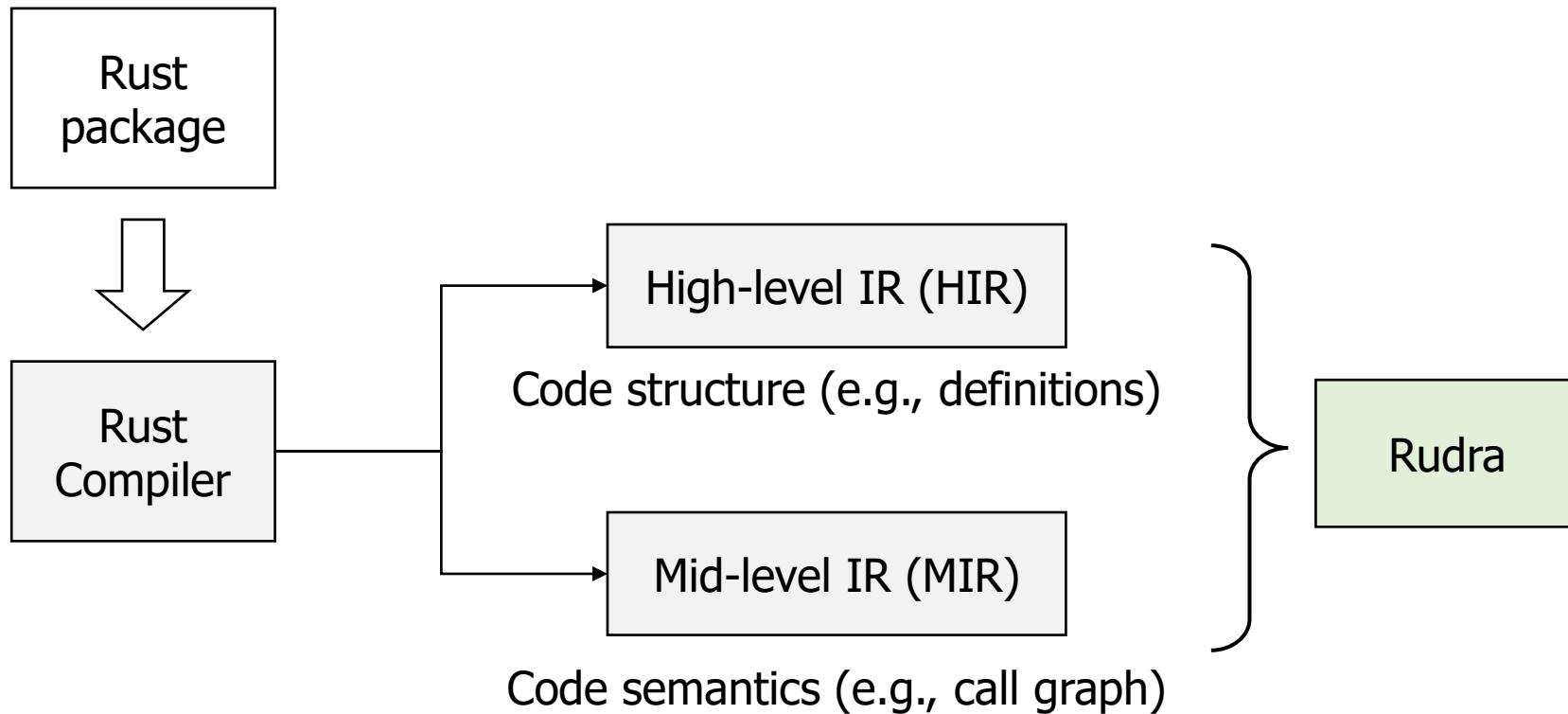
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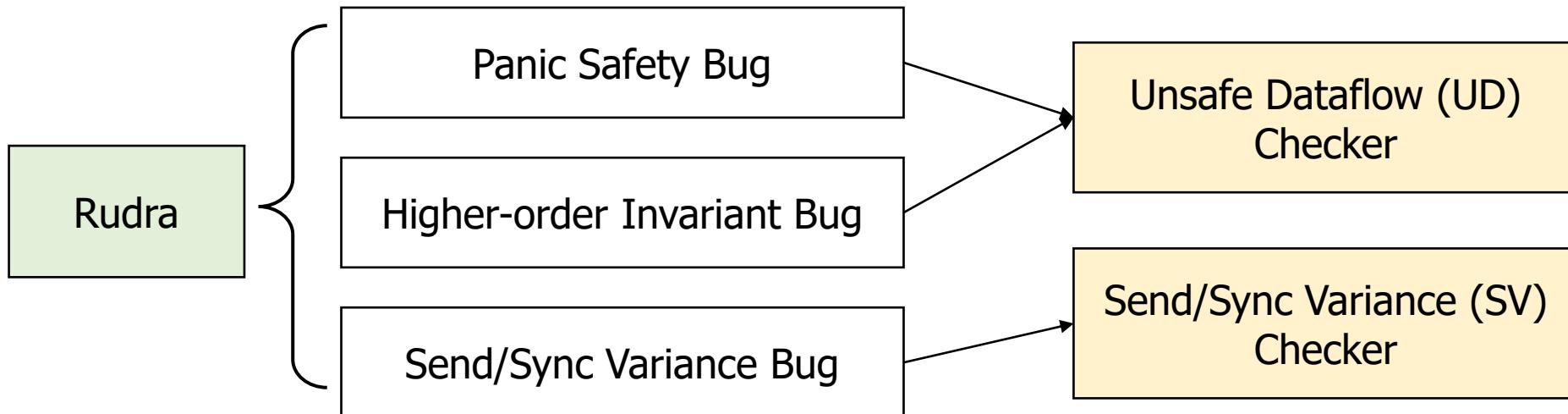
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→ Flow-based heuristics that intermixes IRs at different compiler stages

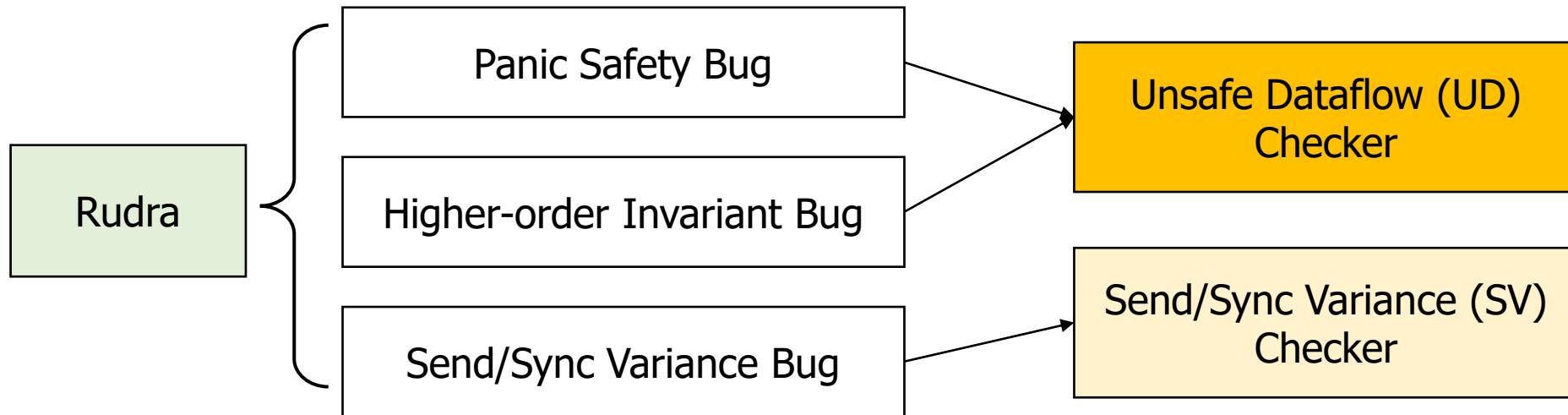
# Rudra's Design



# Rudra's Design



# Rudra's Design



- Uninitialized
- Ownership Duplicate
- Overwrite
- Buffer Copy
- Transmute
- Raw pointer conversion

Safety bypass  $\longleftrightarrow$  Implicit assumptions

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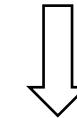
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# UD Checker Example

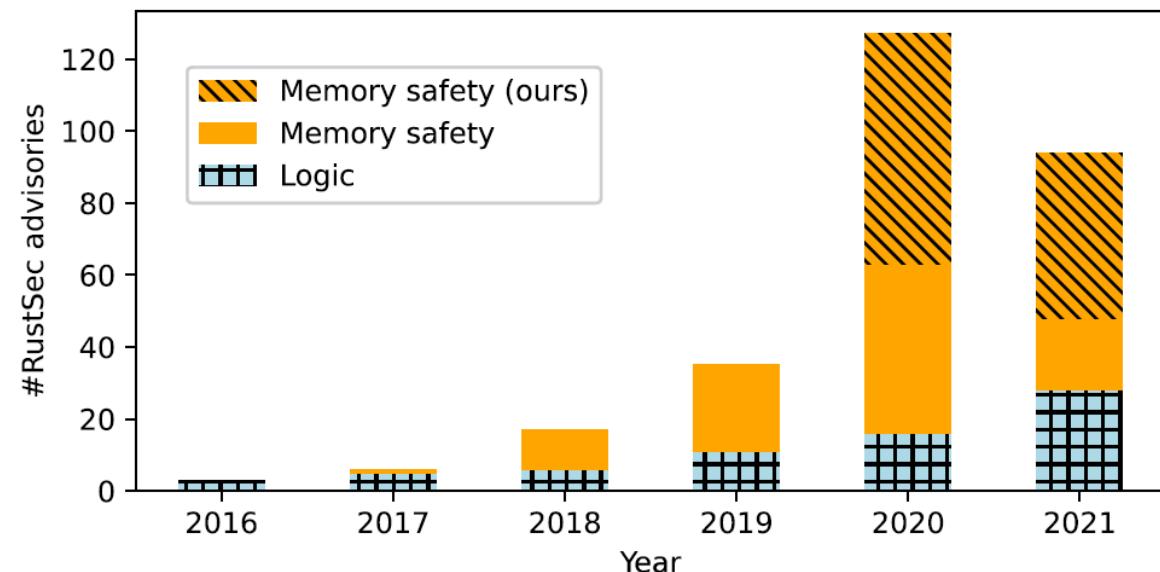
Safety bypass



Implicit assumptions

# Evaluation: Bugs

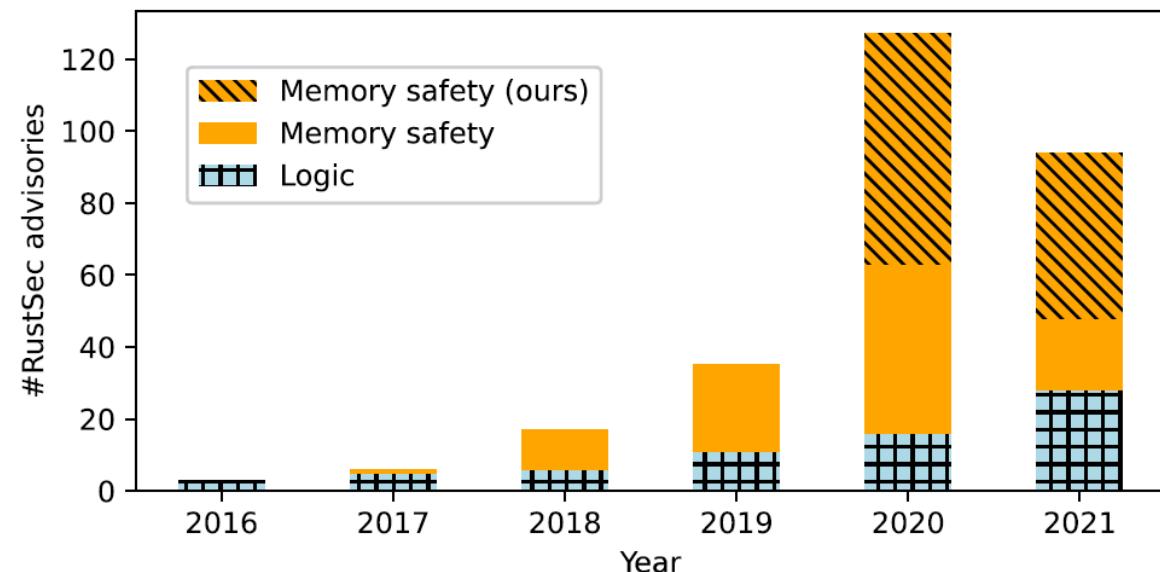
- Analyzed all 43k packages uploaded to Rust's main package repository
- 264 unknown memory safety bugs throughout the Rust ecosystem
  - 2 bugs in the Rust standard library
  - 1 bug in the official futures package for asynchronous programming
  - 1 design issue in the Rust compiler
- 112 RustSec advisory
- 76 CVEs



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→ Rudra can find subtle and non-trivial bugs



# Evaluation: Comparison

- Compared Rudra with dynamic analyzers: Fuzzers and Miri [1]
- Compared Rudra with a static analyzer: UAFChecker [2]
- **Result**
  - None of the bugs found by Rudra are detected by these methods
  - Miri found additional bugs not covered by Rudra's algorithms

[1] Ralf Jung, et al. **Stacked borrows: an aliasing model for Rust.**  
Proceedings of the ACM on Programming Languages 4. POPL (2019): 1-32.

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    - Miri found additional bugs not covered by Rudra's algorithms
- Rudra can find unique bugs

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# Limitation

- 1. Not exhaustive**
- 2. False positive rate**
  - Around 50% at high precision mode, 80% at low precision mode
- 3. Bugs are found at the definition site**

# Rudra: A Static Analyzer for Unsafe Rust

- We identified three common bug patterns in unsafe Rust
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<https://github.com/sslab-gatech/Rudra>