

# Static Automated Program Repair for Heap Properties

by Rijnard van Tonder and Claire le Goues

# Problem statement



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- What if a tool could also *automatically* **fix** the bugs it finds?



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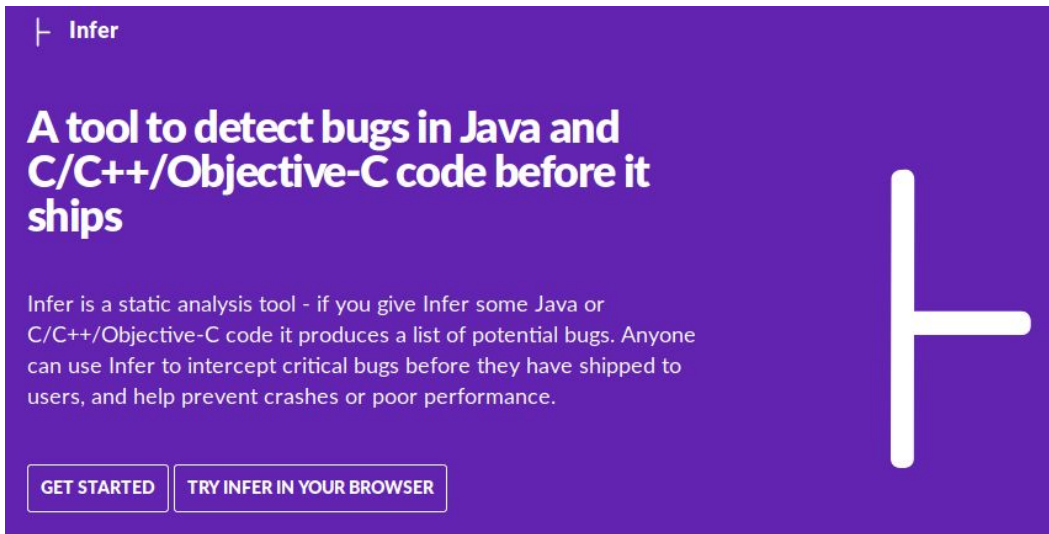
- Programs have bugs!
- Static analysis tools can **find** and **report** certain kinds of bugs
- What if a tool could also *automatically* **fix** the bugs it finds?
  - Automated Program Repair



# Background: Infer

- Static analysis tool by Facebook
- Extensible
- Works by converting source code to an Intermediate Language:

Smallfoot Intermediate Language (SIL)

A purple banner for the Infer static analysis tool. In the top left corner is the Infer logo, a white stylized 'I' with a horizontal bar. The main text is in white. The title 'A tool to detect bugs in Java and C/C++/Objective-C code before it ships' is in a large, bold font. Below it is a paragraph of text. At the bottom are two white buttons with black text. On the right side of the banner is a large white stylized 'I' with a horizontal bar, matching the logo.

Infer

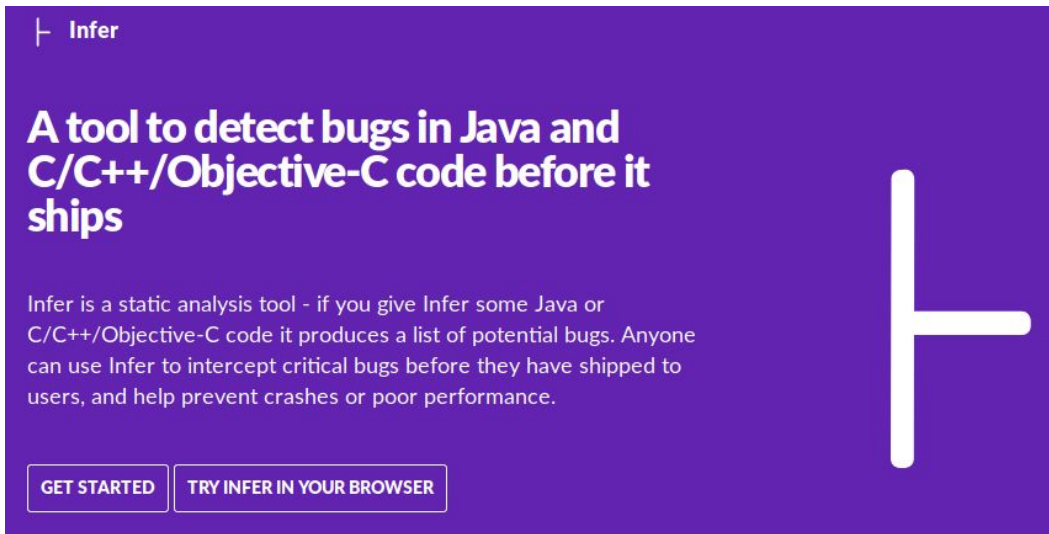
## A tool to detect bugs in Java and C/C++/Objective-C code before it ships

Infer is a static analysis tool - if you give Infer some Java or C/C++/Objective-C code it produces a list of potential bugs. Anyone can use Infer to intercept critical bugs before they have shipped to users, and help prevent crashes or poor performance.

[GET STARTED](#) [TRY INFER IN YOUR BROWSER](#)

# Background: Infer

- Static analysis tool by Facebook
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The banner features a purple background with a large white 'I' logo on the right. The text is in white and yellow. It includes a title, a description of the tool, and two call-to-action buttons.

**Infer**

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Infer is a static analysis tool - if you give Infer some Java or C/C++/Objective-C code it produces a list of potential bugs. Anyone can use Infer to intercept critical bugs before they have shipped to users, and help prevent crashes or poor performance.

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One of the tools mentioned in *“From Start-ups to Scale-ups: Opportunities and Open Problems for Static and Dynamic Program Analysis”*





# Background: Infer

Infer in action



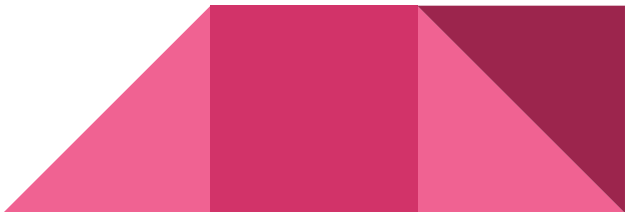
# Background: Separation Logic

- Infer works by using **Separation Logic** to extract **specifications** from each **command** in the source code, which can then be composed into **procedure summaries**.
  - Separation Logic: formal way to reason about a program's manipulation of its state (memory)
  - Specification: a triplet in the form:
    - $\{P\}C\{Q\}$  where  $P$  is the current heap state,  $C$  is the **command** being considered and  $Q$  is the heap state after  $C$  executes
  - Procedure summary: the summary of the combined effects of all of the procedure's commands.



## Background:

$$\frac{\{P\} C \{Q\}}{\{P * F\} C \{Q * F\}} \text{ FRAME RULE}$$

- The **Frame Rule** states that, given a heap H, the analysis of the command C with specification  $\{P\}C\{Q\}$  can proceed without considering the *unaffected* parts of H, namely the **frame** F.
  - This enables **local reasoning**: the ability to reason only over the affected heap parts and ignore the rest.
  - The process by which a frame F is found is called **frame inference**.
  - The *affected* part is called **footprint**.
- 

# Background: Example

{hmap⇒undefined, root⇒undefined}  
    hmap=sw\_malloc(...)  
{hmap⇒allocated, root⇒undefined}

$$\frac{\{P\} C \{Q\}}{\{P * F\} C \{Q * F\}} \text{ FRAME RULE}$$

```
1  swHashMap *hmap =  
2    sw_malloc(sizeof(swHashMap));  
3  if (!hmap) {  
4    swWarn("malloc[1] failed.");  
5    return NULL;  
6  }  
7  swHashMap_node *root =  
8    sw_malloc(sizeof(swHashMap_node));  
9  if (!root) {  
10    swWarn("malloc[2] failed.");  
11    return NULL; // returns, hmap not freed  
12  }
```

# Background: Example

{hmap⇒undefined, root⇒undefined}

hmap=sw\_malloc(...)

{hmap⇒allocated, root⇒undefined}

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1  swHashMap *hmap =
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$$\frac{\{P\} C \{Q\}}{\{P * F\} C \{Q * F\}} \text{ FRAME RULE}$$

Frame (F): { root }

Footprint: { hmap }

# Background: Separation Logic

- Armed with Separation Logic, Infer finds bugs by looking in its symbolic representation of the program for certain problematic specifications
- For example, it can find the memory leak in the previous code snippet

Let's use the notation  $C_\ell, \sigma \rightsquigarrow \text{fault}$  to mean that the interpretation step  $\rightsquigarrow$  for instruction  $C$  at location  $\ell$  in symbolic state  $\sigma$  results in a `fault`



# Background: Example

$$C_\ell, \sigma \rightsquigarrow \text{fault}$$

- In this example, at the location **l=11**:

**$\text{return}_1, \{\text{hmap} \Rightarrow \text{allocated}\} \rightarrow \text{fault}$**

```
1  swHashMap *hmap =
2      sw_malloc(sizeof(swHashMap));
3  if (!hmap) {
4      swWarn("malloc[1] failed.");
5      return NULL;
6  }
7  swHashMap_node *root =
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12 }
```



# Background: Example

$$C_\ell, \sigma \rightsquigarrow \text{fault}$$

- In this example, at the location **l=11**:

**return<sub>1</sub>, {hmap⇒allocated} → fault**

At this point, Infer would report the bug. This is where FootPatch comes in.

```
1  swHashMap *hmap =
2      sw_malloc(sizeof(swHashMap));
3  if (!hmap) {
4      swWarn("malloc[1] failed.");
5      return NULL;
6  }
7  swHashMap_node *root =
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10     swWarn("malloc[2] failed.");
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12 }
```



# FootPatch

- FootPatch is an extension to the Infer tool, created by the authors of the paper
- It deals with three heap-based properties violations:
  - Null dereference
  - Resource leak
  - Memory leak
- **Once Infer finds a violation, FootPatch tries to repair it based on other similar snippets from elsewhere in the code.**



# What is a Repair

- A repair satisfies:

$$C_\ell, \mathbb{H}_{Bad} \rightsquigarrow \text{fault} \implies T_{\ell'}, \mathbb{H} \overset{*}{\rightsquigarrow} C_\ell, \mathbb{H}_{Good} \not\rightsquigarrow \text{fault}$$

Where  $T$  is an additive transformation in the form of a program fragment that avoids the fault state.



# Repair specification

$\{F\}C_R\{F'\}$  where:

- $F$ : error heap configuration
- $C_R$ : repair fragment
- $F'$ : fixed heap configuration



# Repair search

$$\begin{array}{l} ?C_{\ell'}, \{\text{map} \Rightarrow \text{allocated}\} \leadsto \text{return}_{\ell}, \{\text{map} \Rightarrow \text{freed}\} \not\leadsto \text{fault} \quad (1) \\ \vdots \\ \text{-----} \vdots \\ \{\text{pvar} \Rightarrow \text{allocated}\} ?C \{\text{pvar} \Rightarrow \text{freed}\} \quad (2) \end{array}$$

**Figure 4: Modeling repair search.**



# Repair queries

$$\{ pvar \Rightarrow \text{Null} \} ?C \{ \_ \Rightarrow \text{Exn } e \} \quad (5)$$

$$\{ pvar \Rightarrow \langle \text{File}, \text{Acquired} \rangle \} ?C \{ pvar \Rightarrow \langle \text{File}, \text{Release} \rangle \} \quad (6)$$

$$\{ pvar \Rightarrow \langle \text{Memory}, \text{Acquired} \rangle \} ?C \{ pvar \Rightarrow \langle \text{Memory}, \text{Release} \rangle \} \quad (7)$$

**Figure 5: Repair Specifications.**



# Repair queries


- A key insight from the paper is that the queries can be relaxed to capture extra semantic effects by applying **frame inference** on the pre- and post-conditions to candidate repair fragments.



# Repair location

- Few locations possible

```
1  swHashMap *hmap =
2      sw_malloc(sizeof(swHashMap));
3  if (!hmap) {
4      swWarn("malloc[1] failed.");
5      return NULL;
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7  swHashMap_node *root =
8      sw_malloc(sizeof(swHashMap_node));
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# Repair location

- Few locations possible
- In this example, the fix could be applied either before line 10 or before line 11
- FootPatch chooses the line immediately before the fault-causing statement
- In this case, between lines 10 and 11.

```
1  swHashMap *hmap =
2      sw_malloc(sizeof(swHashMap));
3  if (!hmap) {
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# Generating the patch

- Infer's Smallfoot Intermediate Language (SIL) carries type information in its symbolic statements
- Therefore, FootPatch can use that type information to decide which repair to use
- In this case, `sw_free` is used instead of `free`, since `hmap` is of type `swHashMap`

```
1  swHashMap *hmap =
2      sw_malloc(sizeof(swHashMap));
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```

# Finding more bugs

```
1      fp = fopen(rdbfilename,"r");
2      ...
3      if (memcmp(buf,"REDIS",5) != 0) {
4          rdbCheckError("Wrong signature trying to load
5              +         DB from file");
6          fclose(fp);
7          return 1;
8      }
9      rdbver = atoi(buf+5);
10     if (rdbver < 1 || rdbver > RDB_VERSION) {
11         rdbCheckError("Can't handle RDB format
12             +         version %d",rdbver);
13         fclose(fp);
14         return 1;
15     }
16     ...
```

# Correctness

How to verify that a patch was successful:

- Apply it and run Infer again: should result in the bug not being found
- Run the project's test suite



# Results

Project	Lang	kLOC	Time (s)	$\Delta$ GL	Bug Type	Bugs	Max Cands	$\Delta$ GL	Fixes	$\Delta$ GL	FP	$\Delta$ GL
Swoole	C	44.5	20	+83	Res. Leak <sup>†</sup>	7	1	+6	1	+2	0	+0
					Mem. Leak <sup>†</sup>	20	3	+0	6	+0	3	+0
lxc	C	63.0	51	-	Res. Leak	3	5	-	1	-	0	-
					Mem. Leak	8	13	-	0	-	1	-
Apktool	Java	15.0	584	+92	Res. Leak <sup>†</sup>	19	3	+2	1	+0	0	+0
dablocks	C	1.2	9	+0	Res. Leak <sup>†</sup>	7	2	+0	7	+0	0	+0
php-cp	C	9.0	20	+5	Res. Leak <sup>†</sup>	4	3	+1	1	+0	0	+0
armake	C	16.0	10	+13	Res. Leak <sup>†</sup>	5	7	+4	4	+0	0	+0
sysstat	C	24.9	28	+10	Res. Leak	1	10	+0	1	+0	0	+0
redis	C	115.0	79	+121	Res. Leak <sup>†</sup>	8	8	+10	6	+0	0	+0
rappel	C	2.1	7	+3	Mem. Leak <sup>†</sup>	1	6	+0	1	+0	0	+0
error-prone	Java	149.0	262	+602	Null Deref	11	66	+0	2	+0	0	+0
jfreechart	Java	282.7	1,268	-	Null Deref	53	221	-	22	-	0	-

**Table 1: Bugs repaired with FOOTPATCH.** “Bugs” is the number of bugs detected by Infer’s static analysis. “Max Cands” is the maximum number of IL repair candidates for the bug (pre-compatibility check). “Fixes” are the number of unique patches fixing unique bugs (post check). <sup>†</sup> indicates one or more fixes for previously undiscovered bugs. “ $\Delta$ GL” is the change in associated column when using the global search space.



Thank you!