#### **Automated Code Repair**

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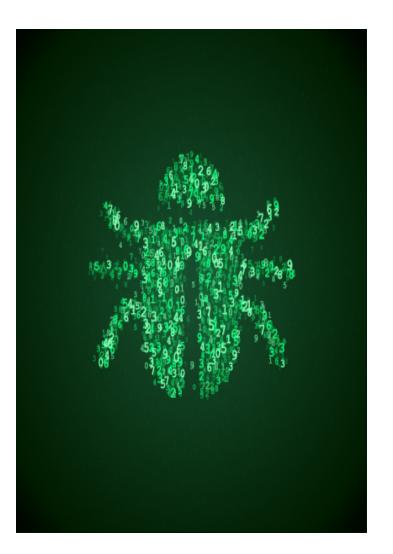
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# **Automated Code Repair – Motivation**





Software vulnerabilities constitute a major threat

- A majority arise from common coding errors
- Shown by experience from source code analysis labs at CERT and DoD

Static analysis tools help, but:

- Typically are used late in the development process
- Produce an enormous number of warnings
- The volume of true positives often overwhelms the ability of the development team to fix the code

#### Huge amount of code in use by DoD

- Billions of lines of C code
- Unknown number of security vulnerabilities

## **Integer Overflow**



This past year (FY16), we developed techniques for automated repair of **integer overflows** that lead to **memory corruption** 

Integers in C are represented by a fixed number of bits N (e.g., 32 or 64).

- Overflow occurs when the result cannot fit in N bits
- Modular arithmetic: Only the least significant N bits are kept

How does integer overflow lead to memory corruption?

- 1. Memory allocation: malloc(·).
- 2. Bounds checks for an array

Example: Android Stagefright bugs (July 2015)

### **Benefits to DoD**



Eliminate security vulnerabilities at a much lower cost than manual repair

Integer overflows are a very common type of bug

• In CERT SCALe audits, about 80% of findings were related to fixed-width integers

Our technique:

- Will not break working code, provided *inferred specification* is correct (Next slide)
- Typically total slowdown < 5% (Based on theoretical model)
- False positives: Flagged operations that cannot actually overflow
  - Then our 'repair' just adds a little unnecessary overhead

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## **Premises for Automated Repair**



- 1. Many security bugs follow common patterns
  - E.g., "p = malloc(n \* sizeof(T))" where n is attacker-controlled
  - Integer overflow  $\Rightarrow$  too little memory gets allocated
- 2. By recognizing such a pattern, it is possible to make a reasonable guess of the developer's intention (the *inferred specification*)
  - E.g., "Try to allocate enough memory to hold *n* objects of type *T*"
- 3. It is possible to repair the code to satisfy this inferred specification
  - Check if overflow occurs; if so, simulate malloc failing with ENOMEM

## **Experimental Results**



	Overflows (as reported by Kint)	Overflows that are <i>sensitive</i>	Overflows fully repaired	Semi-repair	Unrepaired
OpenSSL (1.0.2g)	969	233	180	28	25
Jasper	481	101	53	32	16

An overflow is **sensitive** if it involves variables that are associated with array indices or bounds

Note: Some of the above "repairs" are actually false positives (i.e., operation never overflows). Others are known vulnerabilities with CVEs and patches.







Inferred specification: **inequality comparisons** involving array indices or bounds should behave as if normal arithmetic (not modular arithmetic) were used

- Includes malloc
- Excludes crypto and hashing functions

Repair: General case is intractable (with bounded memory)

Special case that we handle: non-negative integers with only addition or multiplication (no subtraction or division)

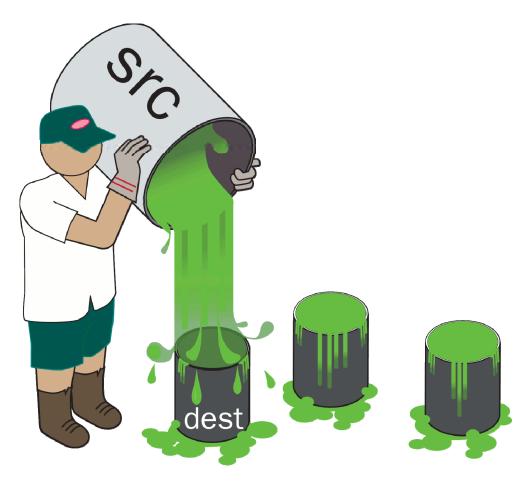
- The value is monotonically non-decreasing (except for multiplication by zero)
- Normal arithmetic can be emulated using **saturation arithmetic**:
  - Replace an overflowed value with the greatest representable value (SIZE\_MAX)
- If the declared types of variables are smaller than size\_t, they are promoted up

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# Arithmetic for Checking Bounds of an Array

Example: copy *n* bytes from *src* to *dest*, starting at index *start* of *dest*.

```
Repair: UADD(start, n) /* defined on next slide */
if (start + n <= dest_size) {
    memcpy(&dest[start], src, n);
} else {
    return -EINVAL;
}</pre>
```





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## wrappers.h



- 2. size\_t result;
- 3. bool flag = \_\_builtin\_add\_overflow(lop, rop, &result);

5. return result;

```
6. }
```

}

```
Repair: UADD(start, n)
```

```
if (start + n <= dest_size) {
    memcpy(&dest[start], src, n);</pre>
```

```
} else {
```

```
return -EINVAL;
```

- What if dest\_size is SIZE\_MAX?
- What if both sides of inequality overflow?
- What if overflow reaches a non-comparison sink?



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## Semi-Repair



#### **Example adapted from CVE-2015-8370:** unsigned cur\_len = 0; 1. 2. while (1) { key = grub\_getkey(); 3. 4. if (key == '\b') { semi-repair handling code here. \*/ 8. cur\_len--; 9. grub\_printf("\b"); 10. continue; 11. if (cur\_len + 2 < buf\_size) {</pre> 12. 13. buf[cur\_len++] = key; 14. grub\_printf("%c", key);

If a potentially overflowed value is used to index into an array, do a semi-repair.

Tool inserts check for overflow. User writes error-handling code.

15.

16. }

## **Future Directions**



#### In FY17, we have two Automated Repair projects:

- 1. Inference of memory bounds
  - Buffer overflow (WRITEs) and leakage of sensitive information (READs)
- 2. Incorrect usage of crypto/security APIs
  - E.g., incorrect validation of certificate chain using OpenSSLAPI, leading to MITM
- A difficulty we encountered was the **Source**  $\leftrightarrow$  **I R mapping problem**:
  - Code is most readily analyzed and repaired on an intermediate representation (IR)
  - Transformations on the IR aren't unambiguously mappable to the source
  - Macros and #ifdefs are a further difficulty
    - Prof. Christian Kästner (CMU SCS) has done work on #ifdefs as part of this project
  - We are further investigating these issues this year (FY17)





Automated code repair (ACR) reduces a system's attack surface and improves its ability to withstand cyber-attacks.

ACR is suitable for problems where many bugs follow a common pattern and have a corresponding pattern for repair.

In FY16, we focused on integer overflows involving memory bounds/indices.

We are continuing work on ACR in FY17.

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