UNDER-CONSTRAINED SYMBOLIC EXECUTION: CORRECTNESS CHECKING FOR REAL CODE

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CONTRIBUTIONS

- Technique + tool for finding deep bugs in **real**, open source C/C++ code
  - No manual testcases
  - No functional specification
- Bugs reported **may** have security implications; exploitability must be determined manually
  - Memory access, heap management, assertion failures, division-by-zero
- Found 77 new bugs in BIND, OpenSSL, Linux kernel
  - 2 OpenSSL DoS vulnerabilities: CVE-2014-0198, CVE-2015-0292
  - 14 Linux kernel vulnerabilities (mostly minor DoS issues)

MOTIVATION: CURRENT PRACTICE

- Code reviews
- “Safer” languages
- Manual (regression) testing
- Static analysis (Coverity, clang static analyzer, etc.)

Bugs are everywhere!

SYMBOLIC EXECUTION

- Provide *symbolic* rather than *concrete* inputs
- Conceptually: explore **all** paths through a program
- Accurately track all memory values (bit precision)
- Report paths/inputs that crash
  - Generate concrete testcase
- KLEE tool (prior work: OSDI 2008)

EXAMPLE


```
int foo(int x) {
  if (x)
    return x/10;
  else
    return 10/x;
}
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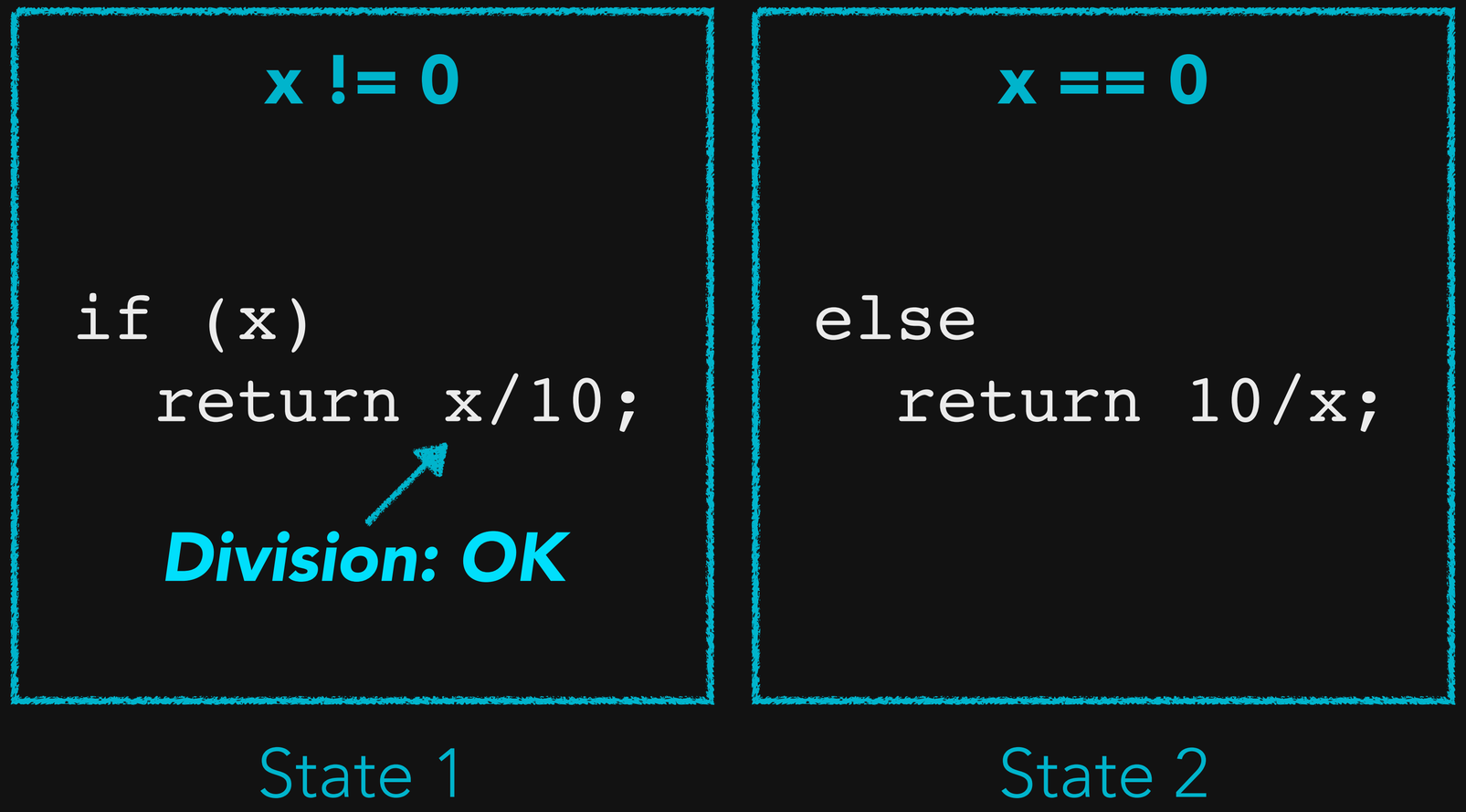

x != 0
if (x)
return x/10;
Division: OK
x == 0
else
return 10/x;
State 1
State 2

EXAMPLE

PROBLEM: SCALABILITY

- Path explosion
  - $|\text{paths}| \sim 2^{|\text{if-statements}|}$
- Path length and complexity
  - Undecidable: infinite-length paths (halting problem)
- SMT query complexity (NP-complete)

SOLUTION: UNDER-CONSTRAINED

- Directly execute individual functions within a program
  - Less code = Fewer paths
  - Function calls executed (inter-procedural)
  - Able to test previously-unreachable code
- Challenges
  - **Complex inputs** (e.g., pointer-rich data structures)
  - Under-**constrained**: inputs have unknown preconditions
    - False positives

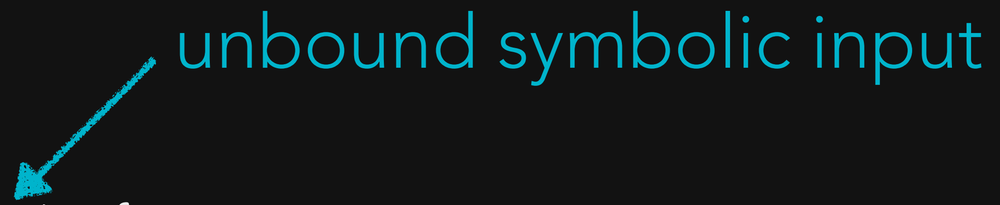
UC-KLEE TOOL

- Extends KLEE tool (OSDI 2008)
- Runs LLVM bitcode compiled from C/C++ source
- Automatically synthesizes complex inputs
  - Based on *lazy initialization* (Java PathFinder)
  - Supports pointer manipulation and casting in C/C++ (no type safety)
  - User-specified input depth (*k*-bound) [Deng 2006]

LAZY INITIALIZATION

- Symbolic (input) pointers initially **unbound**
- On first dereference:
  - New object allocated
  - Symbolic pointer **bound** to new object's address
  - Assume no aliasing (i.e., no cyclical data structures)
- On subsequent dereferences:
  - Pointer resolves to object allocated above

EXAMPLE

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    sum += n->val;
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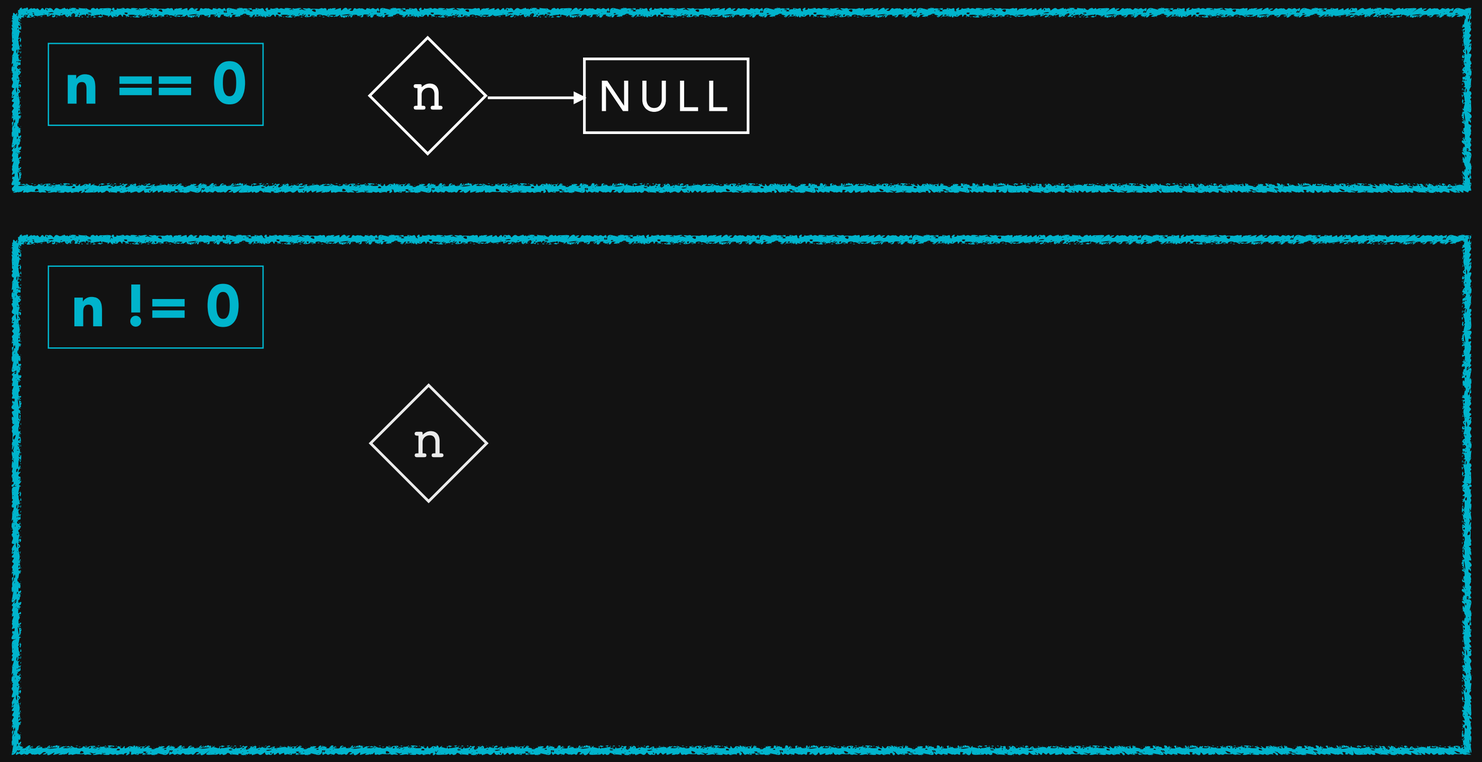

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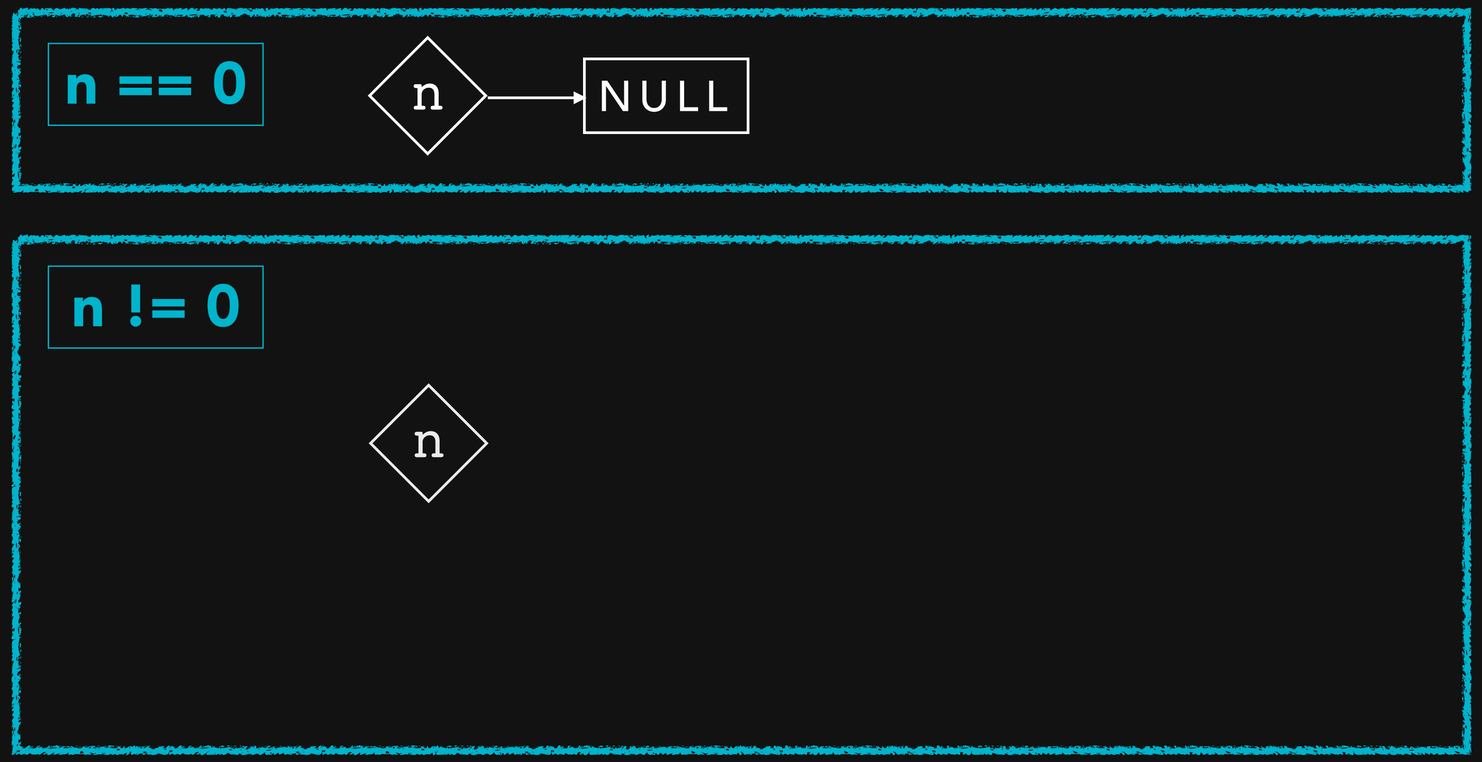

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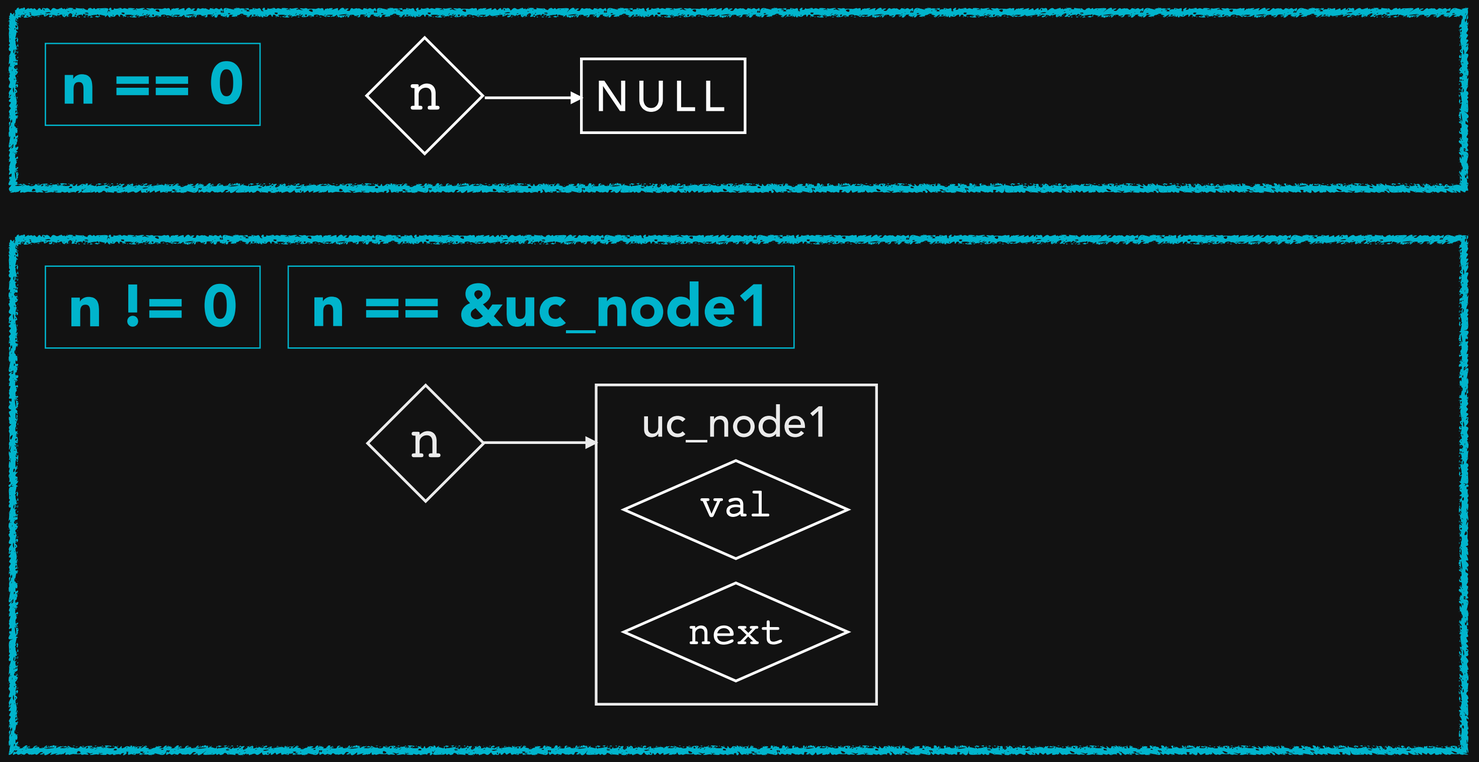

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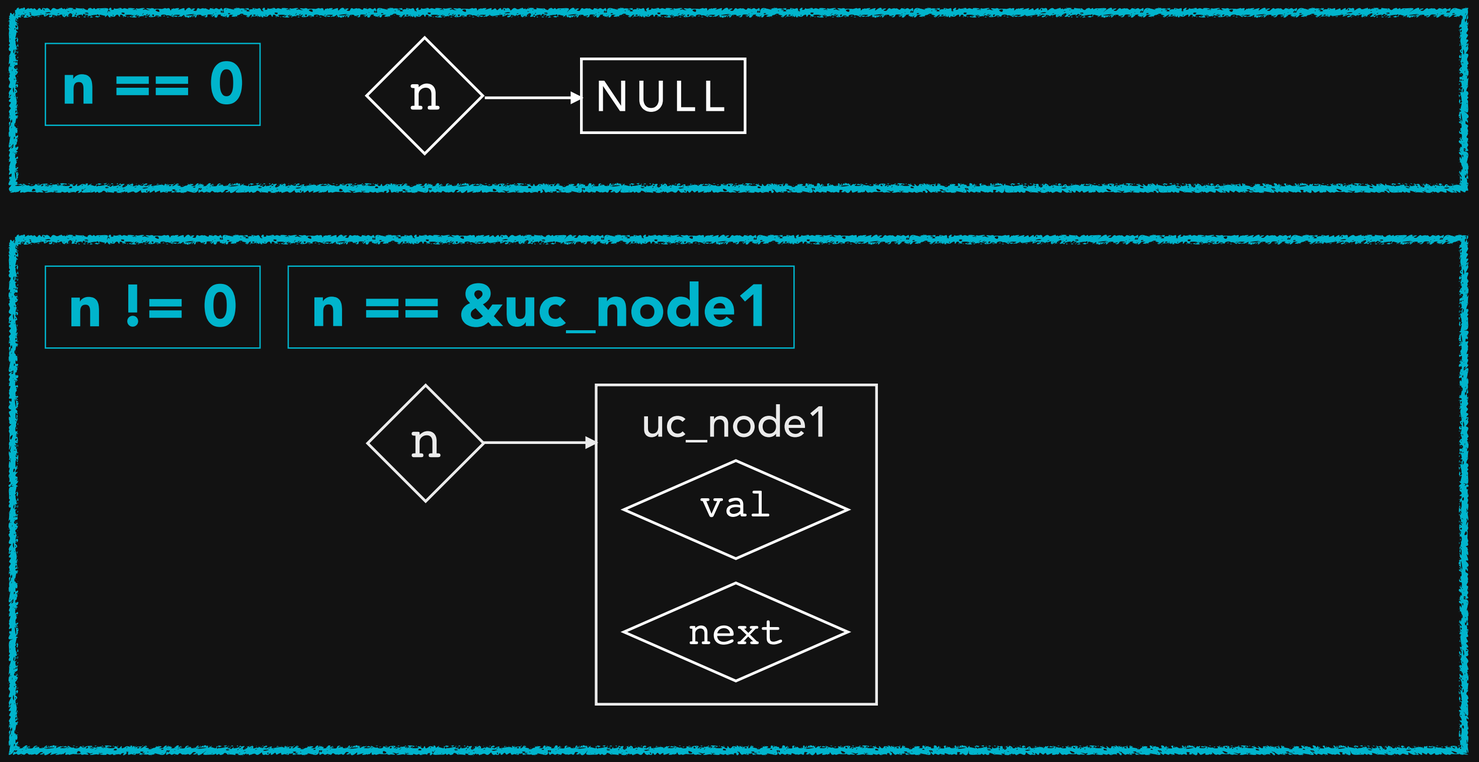

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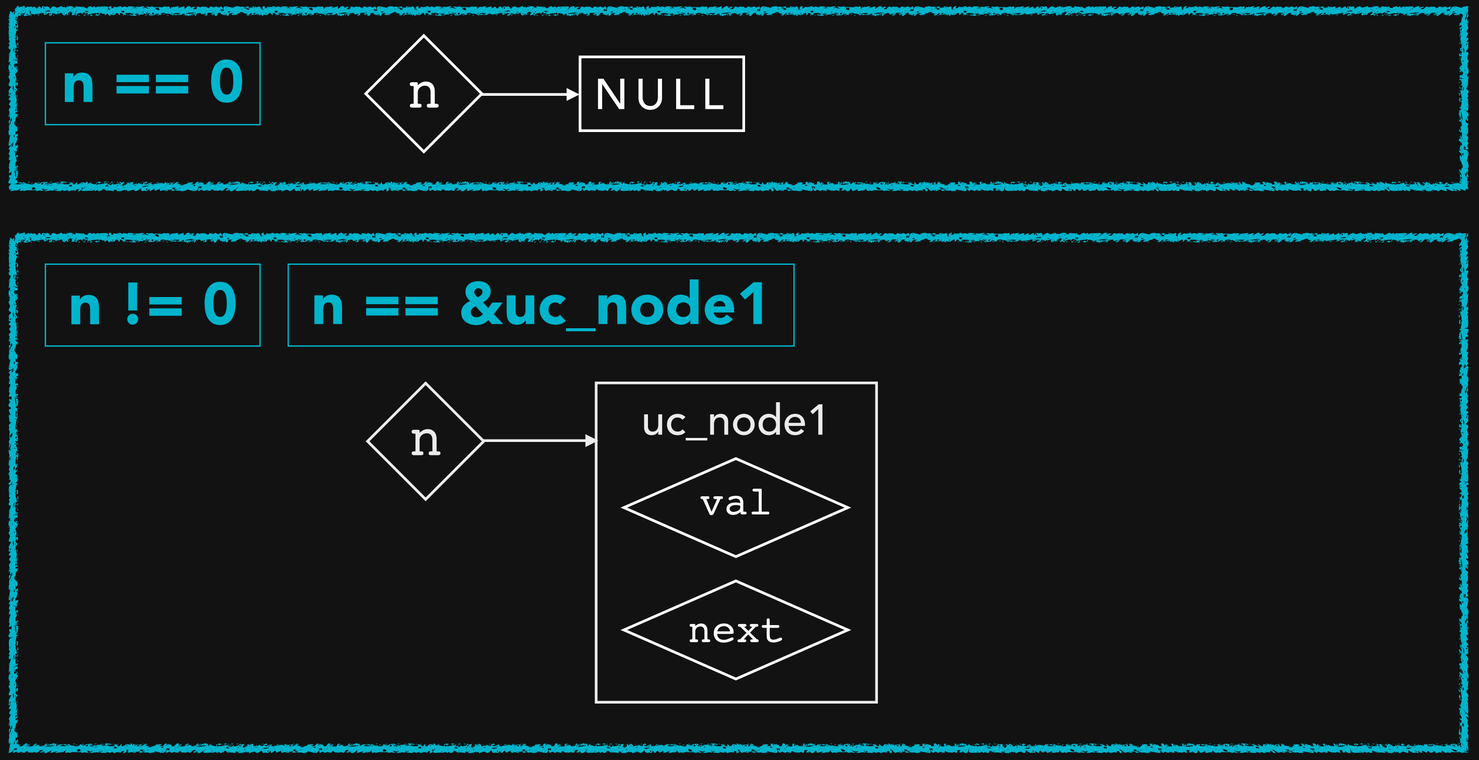

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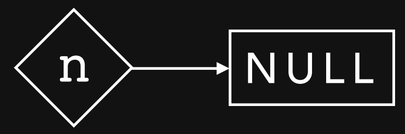
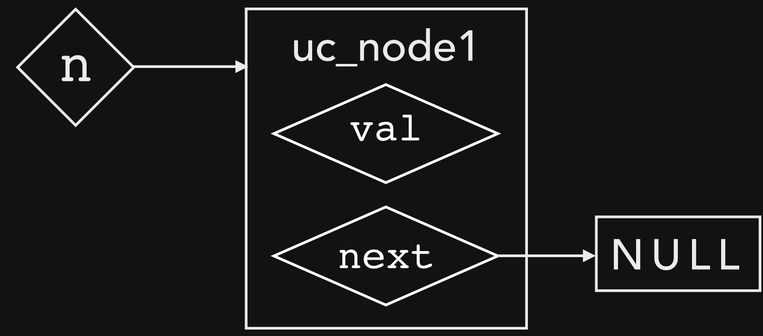


n != 0 **n == &uc_node1** **uc_node1.next == 0**



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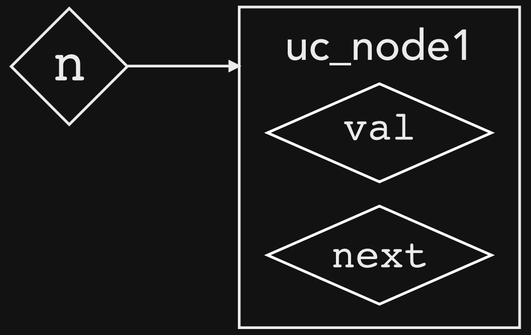

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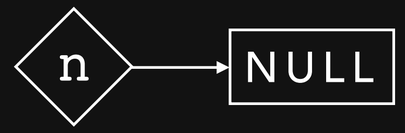

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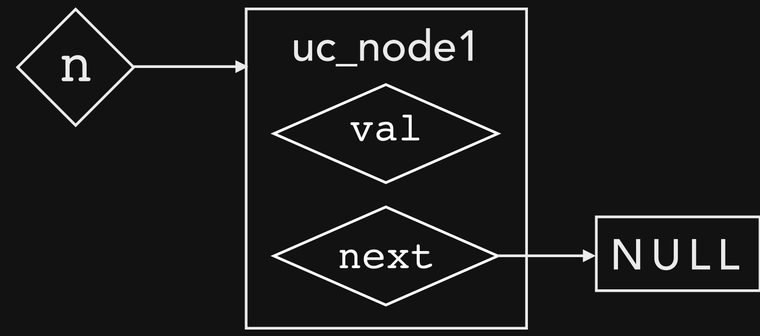

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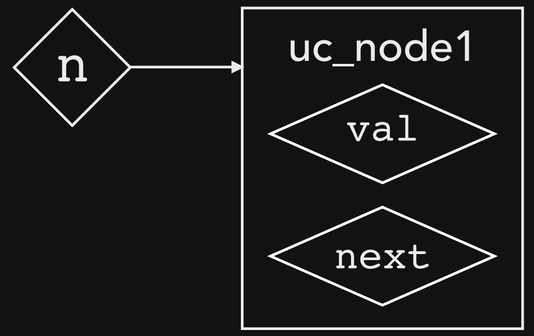

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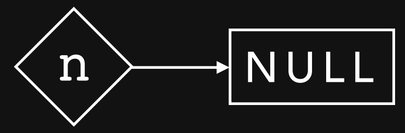

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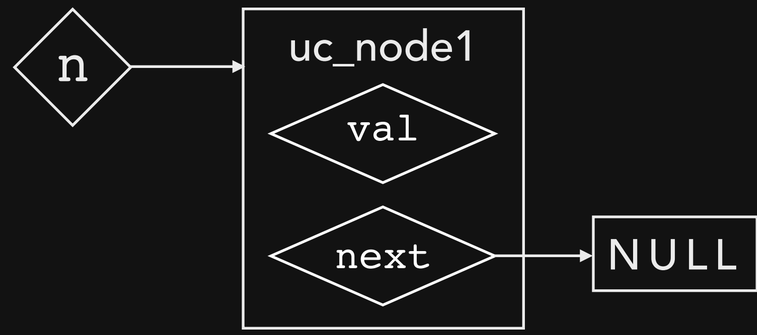

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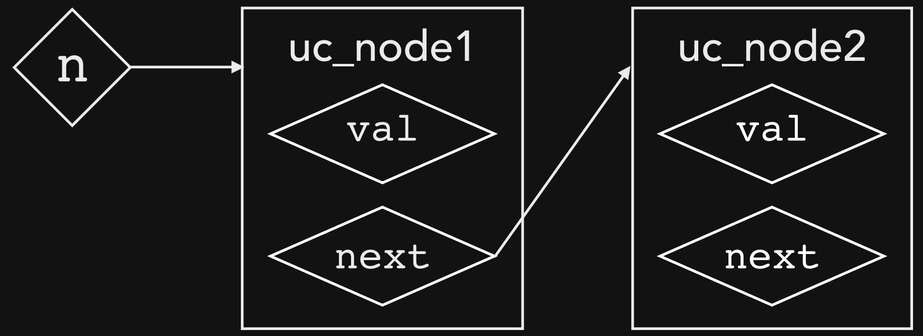

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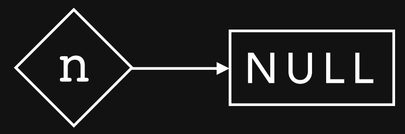

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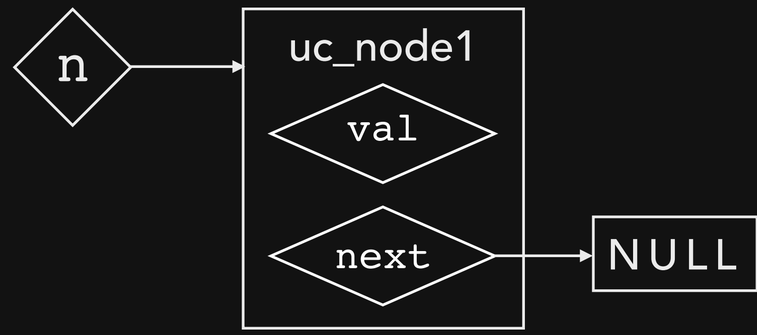

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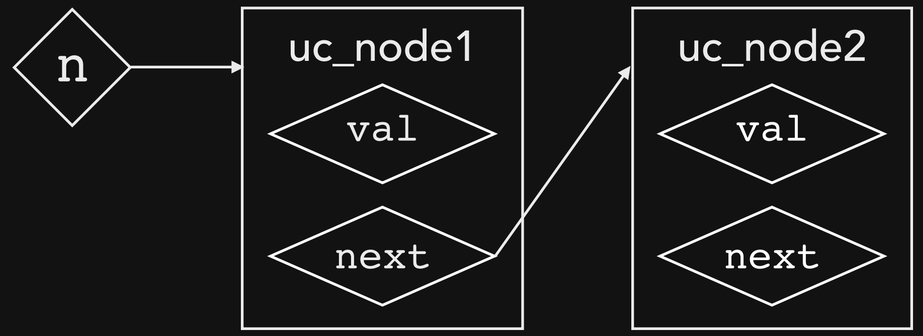

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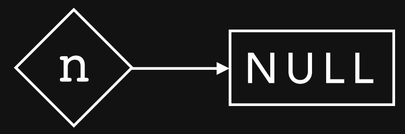

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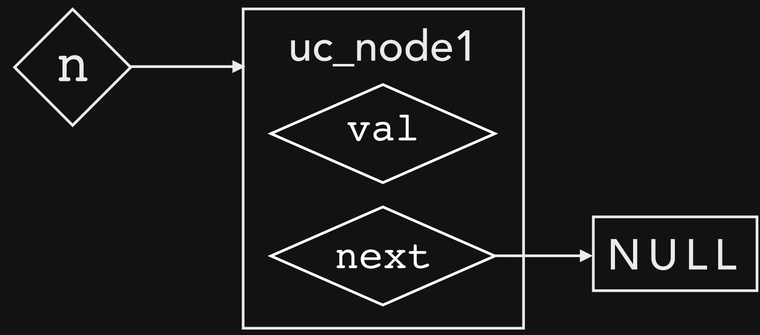

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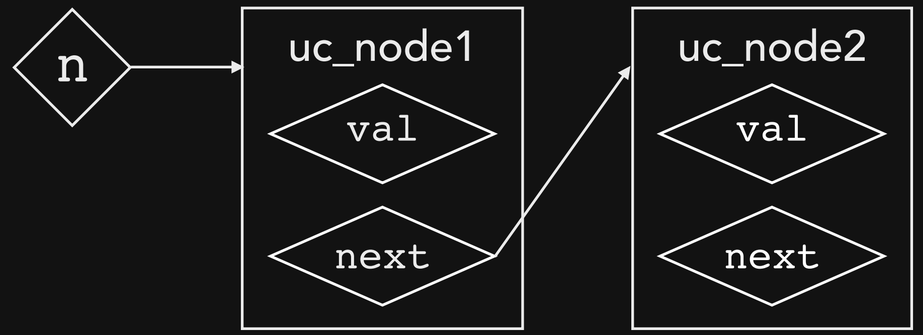

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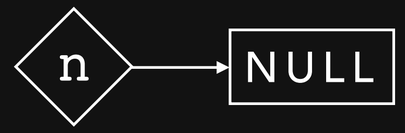

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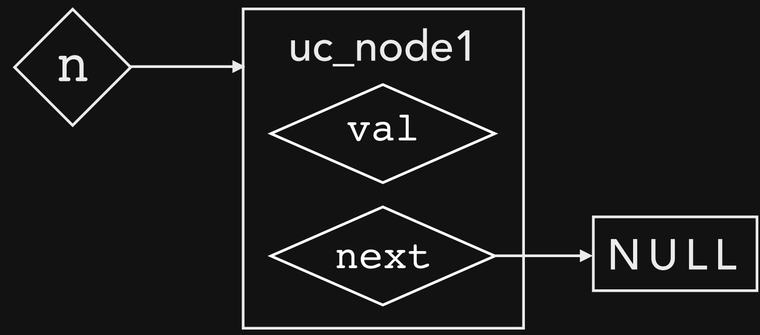

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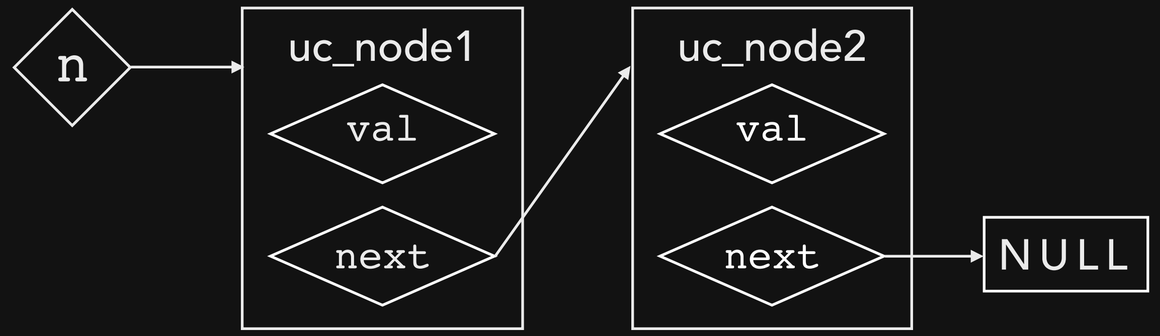

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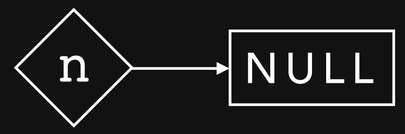

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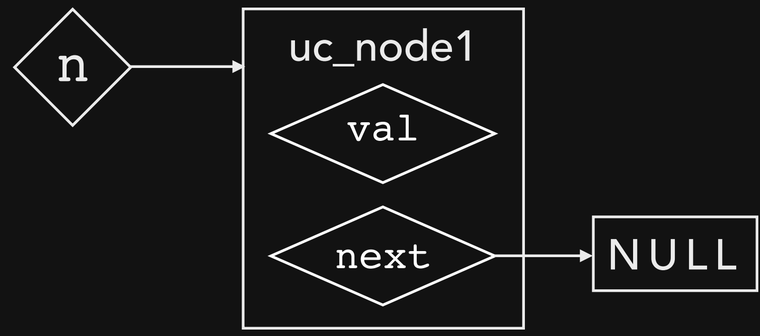

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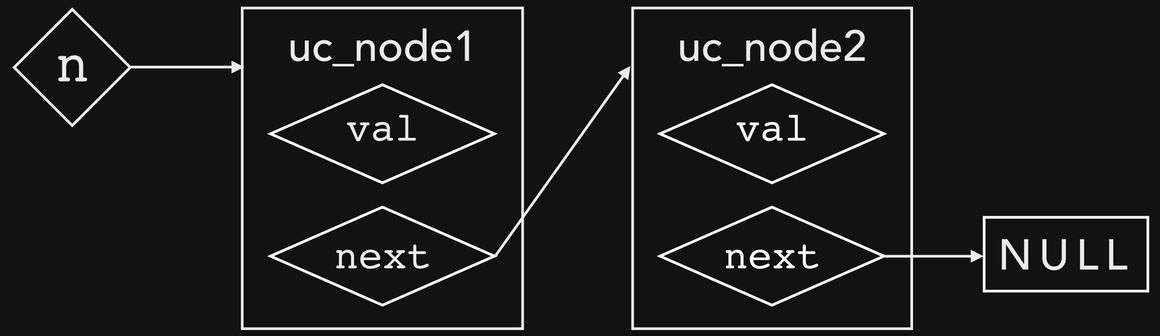
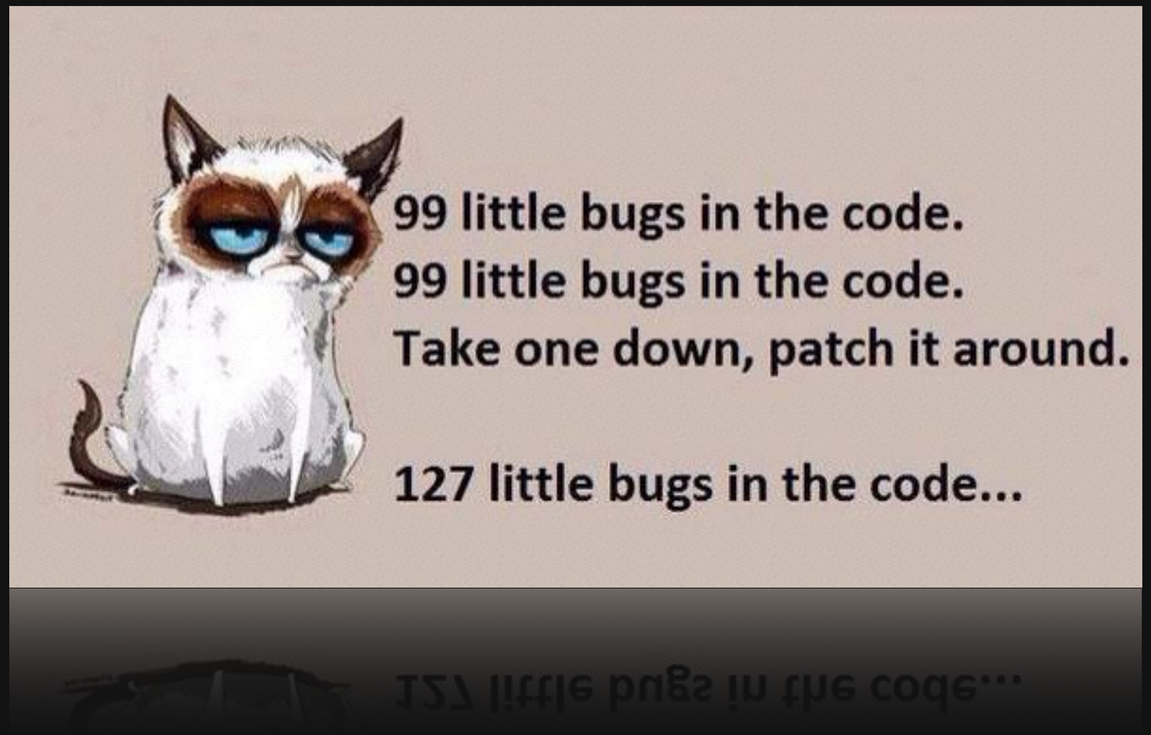


USE CASES

- Equivalence checking: **patches**
  - Yesterday's code vs. today's code (i.e., **fewer** bugs today)
  - Goal: detect (and prevent!) new **crashes** introduced by patches
  - Other uses discussed in CAV 2011 paper

PATCHES



Source: https://twitter.com/phabricator

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  - Other uses discussed in CAV 2011 paper
- General bug-finding: **rule-based checkers**
  - Single version of a function; under-constrained + additional checker rules
  - Memory leaks, uninitialized data, unsafe user input
  - Simple interface for adding new checkers

EQUIVALENCE CHECKING

```
retA = fooA(x);
retB = fooB(x);

assert(retA == retB);
```

identical input (symbolic)

assert **equivalence**

EQUIVALENCE CHECKING

- Value equivalence
  - Return value
  - Arguments passed by reference
  - Global/static variables
  - System call effects (modeled)
- Error (crash) equivalence
  - Both versions typically have the same same (unknown) preconditions!
  - Neither version crashes on an input
  - Both versions crash on an input

USE CASE: whether patches introduce **crashes**

EQUIVALENCE CHECKING

- Check **per path** equivalence of two functions
- If **all paths** exhausted, equivalence verified (up to input bound)

EVALUATION

- BIND, OpenSSL
  - Mature, security-critical codebases (~400 KLOC each)
- Patches
  - BIND: 487 patches to 9.9 stable (14 months)
  - OpenSSL: 324 patches to 1.0.1 stable (27 months)
- Ran UC-KLEE for 1 hour on each patched function

EVALUATION: PATCHES

- Discovered **10 new bugs** (4 in BIND, 6 in OpenSSL)
  - 2 OpenSSL DoS vulnerabilities:
    - CVE-2014-0198: NULL pointer dereference
    - CVE-2015-0292: Out-of-bounds **`memcpy`** read
- Verified (w/ caveats) that patches do not introduce crashes
  - 67 (13.8%) for BIND, 48 (14.8%) for OpenSSL
  - Caveat: max. input size (25KB), tool limitations/bugs

OPENSSL CVE-2014-0198

```
do_ssl3_write():
1   if (wb->buf == NULL)
2     if (!ssl3_setup_write_buffer(s))
3       return -1;
4   ...
5   /* If we have an alert to send, lets send it */
6   if (s->s3->alert_dispatch) {
7     i=s->method->ssl_dispatch_alert(s);
8     if (i <= 0)
9       return(i);
10    /* if it went, fall through and send more stuff */
11  }
12  ...
13  unsigned char *p = wb->buf;
14  *(p++)=type&0xff;
```

NULL pointer check

call sets wb->buf to NULL

NULL pointer dereference

OPENSSL CVE-2014-0198

- Uncommon code path
  - SSL_MODE_RELEASE_BUFFERS runtime option (used by Apache mod_ssl)
  - SSL alert pending (could be triggered by attacker)
  - Difficult to consider this case with traditional testing

FALSE POSITIVES

- Function's inputs have unknown **preconditions**
- Partial solutions
  - Automated heuristics
  - Manual annotations (lazily, as needed)
    - Written in C/C++, separate from codebase
    - Simple annotation can silence **many** errors

FALSE POSITIVES: EXAMPLE (BIND)

```
1  int isc_region_compare(isc_region_t *r1, isc_region_t *r2) {
2    unsigned int l;
3    int result;
4
5    REQUIRE(r1 != NULL);
6    REQUIRE(r2 != NULL);
7
8    l = (r1->length < r2->length) ? r1->length : r2->length;
9
10   if ((result = memcmp(r1->base, r2->base, l)) != 0)
11     return ((result < 0) ? -1 : 1);
12   else
13     return ((r1->length == r2->length) ? 0 :
14             (r1->length < r2->length) ? -1 : 1);
15 }
```

```
INVARIANT(r->length <= OBJECT_SIZE(r->base));
```

623 errors silenced (7.5% of all errors reported for BIND)

MANUAL ANNOTATIONS

- BIND: 400 lines of annotation code (~0.1%)
- OpenSSL: 60 lines of annotation code (~0.02%)
- Reasonable effort relative to code size (~400 KLOC) and importance

GENERAL BUG-FINDING

- Run **single version** of a function (w/ lazy initialization)
- Individual checkers look for specific types of bugs:
  - Leak checker
  - Uninitialized data checker
  - User input checker
- Like Valgrind but applied to **all execution paths**

EVALUATION

- 20,000+ functions: BIND, OpenSSL, Linux kernel (~12 MLOC)
- Found 67 new bugs
  - 37 memory leaks
    - Linux kernel: exploitable AUTH_GSS leak in NFS SunRPC layer
  - 19 uses of uninitialized data
    - BIND: DNS UDP port PRNG selected by uninitialized value
    - Linux kernel: leak of private kernel stack data via firewire ioctl
  - 11 unsafe user input (Linux kernel only)
    - VMware VMCI driver: unchecked memcpy length (~Heartbleed)
    - CEPH distributed file system: division-by-zero (kernel FPE)

USER INPUT CHECKER

- User input is fully-constrained (an attacker may supply any value); no unknown input preconditions
- Checker tracks whether each symbolic byte is UC/FC
- Checker emits UNSAFE_INPUT flag if error is caused by FC input
- Suppresses flag for inputs possibly sanitized (false pos. trade-off)
- C annotations: specify functions returning user input
  - Linux: `get_user`, `copy_from_user`, syscall args
  - BIND: `isc_buffer_getuint8`
  - OpenSSL: byte-swaps (`n2s`, `n2l`, etc.) [Chou]

KERNEL VMCI VULNERABILITY

Fully constrained

copy_from_user()

```
1  static int dg_dispatch_as_host(...,
2                                 struct vmci_datagram *dg) {
3    dg_size = VMCI_DG_SIZE(dg);
4    ...
5    dg_info = kmalloc(sizeof(*dg_info) +
6          (size_t) dg->payload_size, GFP_ATOMIC);
7    ...
8    memcpy(&dg_info->msg, dg, dg_size);
9    ...
10 }
```

Unchecked **memcpy** length

Send up to 69,632 bytes from host private kernel memory to guest OS

Similar to Heartbleed! (much lower impact)

CONCLUSION

- Under-constrained symbolic execution
- Equivalence checking: patches
- General bug-finding: rule-based checkers
- Experimental results: BIND, OpenSSL, Linux kernel

QUESTIONS?

@ramosbugs