Static Program Analysis to Improve Code Reliability and Security

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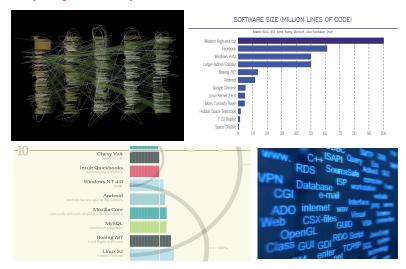
February 28, 2019

Outline

- Existing software bugs and vulnerabilities
- Static analysis and dynamic analysis
- Technical contributions in developing scalable and precise program analysis
 - Fundamental program analysis
 - Sparse value-flow analysis
 - Selective value-flow analysis
 - On-demand value-flow analysis
 - Applications
 - Value-flow analysis for detecting memory errors
- Research opportunities

Modern System Software

- Extremely Large and Complex



Software Becomes More Buggy



Memory Leak

- A dynamically allocated object is not freed along some execution path of a program
- A major concern of long running server applications due to gradual loss of available memory.

```
/* CVE-2012-0817 allows remote attackers to cause a denial of service through adversarial connection requests.
 2
     /* Samba — - libads/ldap.c:ads_leave_realm */.
 3
 4
     host = memAlloc(hostname);
      if (...) {...; return ADS_ERROR_SYSTEM(ENOENT);} // The programmer forgot to release host on error.
     /* A memory leak in Php-5.5.11 */
      for (...) {
         char* buf = readBuffer();
          if (condition)
            printf (buf):
          else
           continue: // buf is leaked in else branch
         freeBuf(buf):
10
11
```

Buffer Overflow

- Attempts to put more data in a buffer than it can hold.
- Program crashes, undefined behavior or zero-day exploit¹.

```
/* A simplified example from "Young and Mchugh, IEEE S&P 1987", exploited by attackers to bypass vertication*/

void verfiyPassword(){
    char buff [15]; int pass = 0;
    printf ("\n Enter the password: \n");
    gets(buff);

if (strcmp(buff, "thegeekstuff")){ // return non—zero if the two strings do not match
    printf ("\n Wrong Password \n");
    }

else{ // return zero if two strings matched or a buffer overrun
    printf ("\n Correct Password \n");
    pass = 1;
}

if (pass)
    printf ("\n Root privileges given to the user \n");
}
```

¹ Heartbleed, a well-known vulnerability in OpenSSL is also caused by buffer overflow (It took more than 2 years to discover and fix it since first patch, and over 500,000 websites were affected). Vulnerability is exploited when more data can be read than should be allowed

Uninitialized Variable

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2

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13

15

- Stack variables in C and C++ are not initialized by default.
- Undefined behavior or denial of service via memory corruption

```
/* An uninitialized variable vulnerability simplified from anuplot, CVE-2017-9670 */
     void load(){
             switch (ctl) {
                     case -1:
                             xN = 0; yN = 0;
                             break:
                     case 0:
                             xN = i; yN = -i;
                             break:
                     case 1:
                             xN = i + NEXT_SZ: vN = i - NEXT_SZ:
                             break:
14
                     default:
                             xN = -1: xN = -1: // xN is accidentally set twice while yN is uninitialized
16
                             break:
17
                    plot(xN, vN):
```

Use-After-Free

2

8

10 11

12 13

14

- Attempt to access memory after it has been freed.
- Program crashes, undefined behavior or zero-day exploit.

```
/* CVE-2015-6125 and CVE-2018-12377 with similar heap use after free patterns*/

char* msg = memAlloc(...);
...
if (err) {
    abrt = 1;
    ...
    free (msg);
}
...
if (abrt) {
    ...
    logError("operation aborted before commit", msg); // try to access released heap variable
}
```

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Static Analysis

- Analyze a program without actually executing it inspection of its source code by examining all possible program paths
 - + Pin-point problems at source code level.
 - + Catch bugs at early the stage of the software development cycle.
 - False alarms due to over-approximation.
 - Precise analysis has scalability issue for analyzing large size programs.

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Assume x is a tainted value foo(x)foo(y) if(cond) p = xp = x(a)oot else p = vp = vflow-sensitivity context-sensitivity path-sensitivity at which under which along which program point calling context program path p is tainted? p is tainted? p is tainted?

Levels of Abstractions

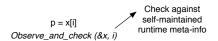
Dynamic Analysis

- Analyze a program at runtime inspection of its running program by examining some executable paths depending on specific test inputs
 - + Identify bugs at runtime (catch it when you observe it).
 - + Zero or very low false alarm rates.
 - Runtime overhead due to code instrumentation.
 - May miss bugs (false negative) due to under-approximation.

Dynamic Analysis

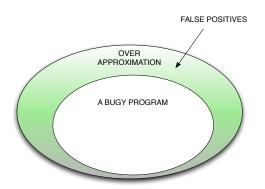
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Instrumentations



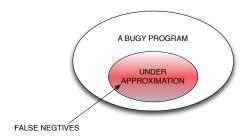
Limited Coverage

Bug Detection Philosophy



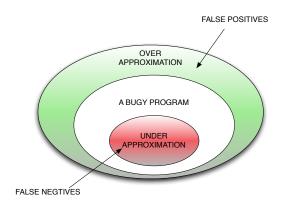
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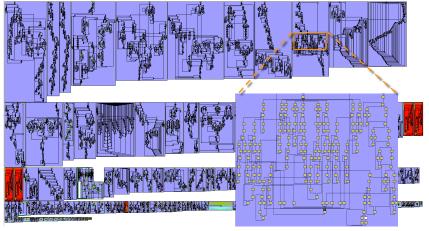
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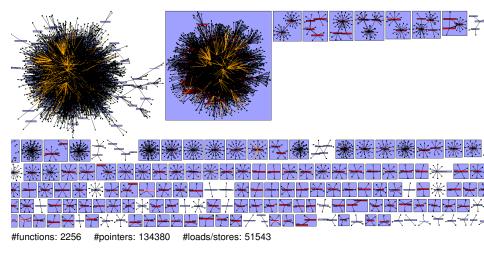
Whole-Program CFG of 300.twolf (20.5KLOC)



#functions: 194 #pointers: 20773 #loads/stores: 8657

Costly to reason about flow of values on CFGs!

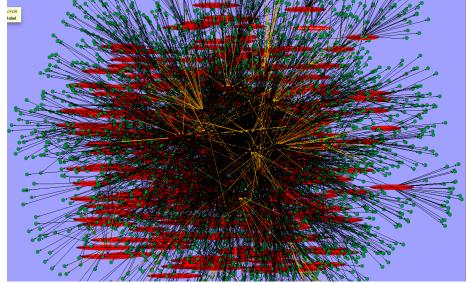
Call Graph of 176.gcc (230.5KLOC)



Costly to reason about flow of values on CFGs!

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Call Graph of 176.qcc



Research Aim

Developing fundamental and practical **program analysis** techniques that can efficiently and precisely **understand**, **detect and fix** bugs in the context of large-scale software with millions of lines of code.

- Fundamental Program Analyses
 - Sparse analysis (CC'16, CGO '16, ICSE '18,)
 - Selective analysis (SAS '14, LCTES '16, TECS '18)
 - On-demand analysis (FSE '16, ICSE '18, TSE '18)
- Client Application: Software Bug Detection and Repair
 - Memory leaks (ISSTA '12, TSE '14)
 - Buffer overflows (ISSRE '14, IEEE Transaction on Reliability '15)
 - Uninitialized variables (CGO '14, FSE '16)
 - Use-after-frees (ACSAC '17, ICSE '18)
 - Concurrency bugs (CGO '16, ICST '19)
 - Control-flow integrity protection (ISSTA '17, ACISP '18)
 - Program Repair (SAC'16, ICSE '19)

A sparse, selective and on-demand interprocedural program dependence analysis framework for both sequential and multithreaded programs.

- The SVF project
 - Started since early 2014, actively maintained. Publicly available at: http://svf-tools.github.io/SVF.
 - Implemented on top of LLVM compiler (the latest version 7.0.0) with over 100KLOC C/C++ code and 200+ stars on Github.
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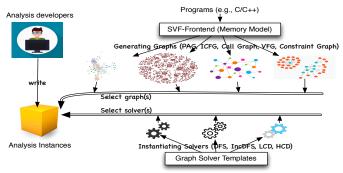
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- Value-Flow Analysis: resolves both control and data dependence.
 - Does the information generated at program point A flow to another program point B along some execution paths?
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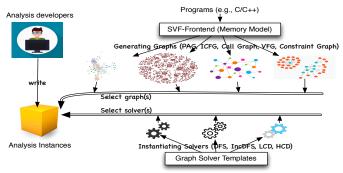
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- Key features of SVF
 - Sparse: compute and maintain the data-flow facts where necessary
 - Selective: support mixed analyses for precision and efficiency trade-offs.
 - On-demand: reason about program parts based on user queries.

SVF: Design Principle



- Serving as an open-source foundation for building practical value-flow analysis
 - Minimize the efforts of implementing sophisticated analysis (extendable, reusable, and robust via layers of abstractions)
 - Support developing different analysis variants (flow-, context-, heap-, field-sensitive analysis) in a sparse and on-demand manner.

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- Client applications:
 - Static bug detection (e.g., memory leaks, null dereferences, use-after-frees and data-races)
 - Accelerate dynamic analysis (e.g., Google's Sanitizers and AFL fuzzing)



What is SVF?

SVF is a static tool that enables scalable and precise interprocedural dependence analysis for C and C++ programs. SVF allows value-flow construction and pointer analysis to be performed iteratively, thereby providing increasingly improved precision for both.

What kind of analyses does SVF provide?

- · Call graph construction for C and C++ programs
- · Field-sensitive Andersen's pointer analysis
- · Sparse flow-sensitive pointer analysis
- · Value-flow dependence analysis
- · Interprocedural memory SSA
- . Detecting source-sink related bugs, such as memory leaks and incorrect file-open close errors.
- · An Eclipse plugin for examining bugs

License

GPLv3

- Cited by leading program analysis and security groups, e.g., Chopped Symbolic Execution (from Imperial College London@ICSE'18), PinPoint (from HKUST@PLDI'18), Type-based CFI (from ACSAC'18@MIT and Northeastern University), Kernel Fuzzing (from Purdue@IEEE S&P'18), Directed Fuzzer (from NTU@CCS'18) and K-Miner (from TU Darmstadt@NDSS'18).
- Used, commented and contributed by researchers from IBM, UCSB, UIUC, Cambridge, Wisconsin-Madison through our Github (comments).

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Flow-insensitive pointer analysis:

- Ignore program execution order
- A single solution across whole program

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$$p = & a$$
 $*p = & b$
 $*p = & c$
 $q = *p$

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 $p \to a$
 $p \to a$
 $a \to b, c$
 $p = & c$
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Flow-insensitive analysis

$$p = & a$$

$$p \rightarrow a$$

$$*p = & b$$

$$p \rightarrow a \quad a \rightarrow b$$

$$*p = & c$$

$$p \rightarrow a \quad a \rightarrow c$$

$$q = *p$$

$$p \rightarrow a \quad a \rightarrow c \quad q \rightarrow c$$

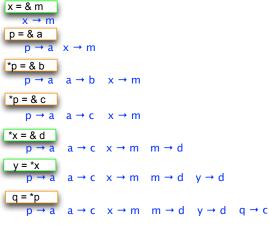
The Data-flow-based Flow-Sensitive Analysis

 Propagates points-to along the control-flow without knowing whether the information will be used there or not.

```
x = & m
      x \rightarrow m
p = & a
       p \rightarrow a \quad x \rightarrow m
d = 0
       p \rightarrow a \quad a \rightarrow b \quad x \rightarrow m
*p = & c
       p \rightarrow a \quad a \rightarrow c \quad x \rightarrow m
x = 8 d
       p \rightarrow a \quad a \rightarrow c \quad x \rightarrow m \quad m \rightarrow d
  v = x
        p \rightarrow a \quad a \rightarrow c \quad x \rightarrow m \quad m \rightarrow d \quad v \rightarrow d
  q = p
        p \rightarrow a \quad a \rightarrow c \quad x \rightarrow m \quad m \rightarrow d \quad y \rightarrow d \quad q \rightarrow c
```

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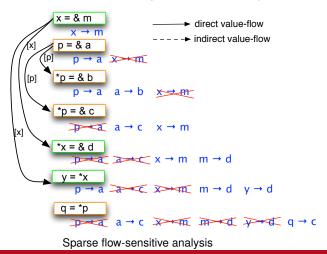
Sparse Flow-Sensitive Analysis (ISSTA '12, TSE'14, CC'16)

 Propagate points-to information only along pre-computed def-use chains (a.k.a value-flows) instead of control-flow

```
x = & m
    x \rightarrow m
p = & a
     p \rightarrow a \times m
*p = & b
     p \rightarrow a \quad a \rightarrow b \quad x \rightarrow m
*p = \& c
    a \rightarrow c x \rightarrow m
x = & d
    x \rightarrow m \quad m \rightarrow d
y = *x
      p \rightarrow a \rightarrow c \rightarrow m \rightarrow d \quad v \rightarrow d
q = *p
    a \rightarrow c \times m \longrightarrow d \times d q \rightarrow c
```

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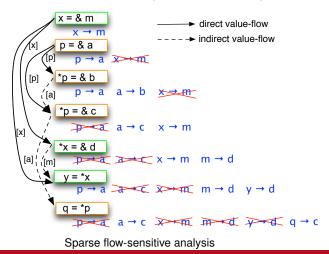
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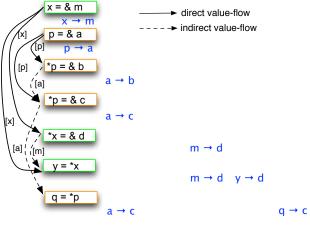
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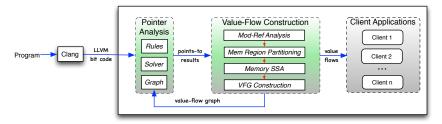
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Sparse flow-sensitive analysis

Evaluation and Results

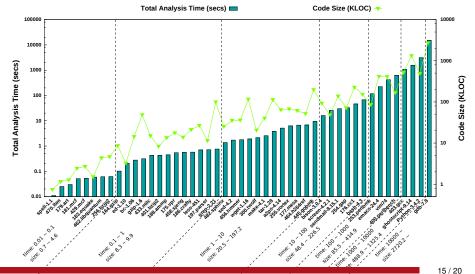


Benchmarks:

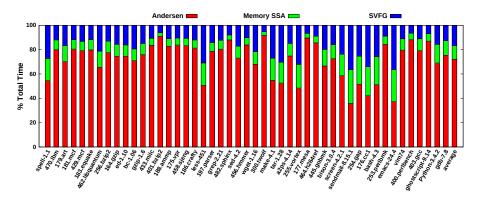
- All SPEC C benchmarks: 15 programs from CPU2000 and 12 programs from CPU2006
- 20 Open-source applications: most of them are recent released versions.
- Total lines of code evaluated: 8,005,872 LOC with maximum program size 2,720,279 LOC
- Machine setup:
 - Ubuntu Linux 3.11.0-15-generic Intel Xeon Quad Core HT, 3.7GHZ, 64GB

Analysis Time

Total Analysis Time = Andersen + MemorySSA + VFG

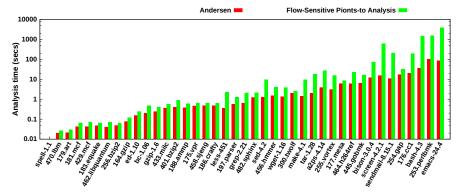


Analysis Time Distribution



Average Percentage: Andersen (71.9%), Memory SSA (11.3%), VFG (16.8%)

Analysis Time : Andersen v.s. Sparse Flow-Sensitive Points-to Analysis



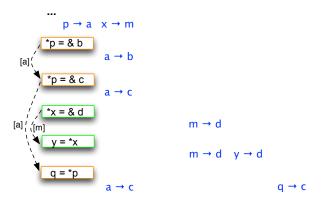
Flow-Sensitive Analysis Slowdowns: From 1.2 \times to 44 \times . On average 6.5 \times .

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Region-based Selective Flow-Sensitivity (sas '14)

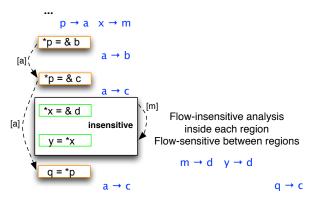
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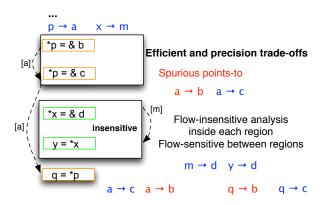
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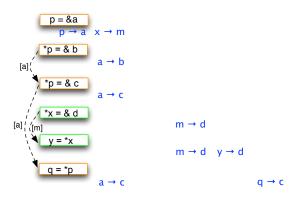


Region-based flow-sensitive analysis Load-precision-preserving analysis is **2X** faster than sparse analysis.

Outline

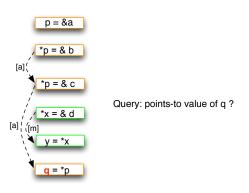
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Demand-driven flow-sensitive analysis with strong updates via CFL-Reachability

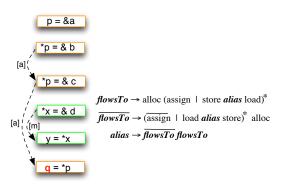


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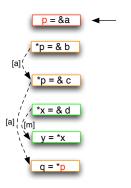
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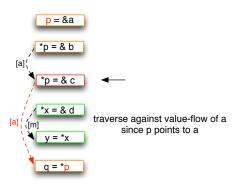
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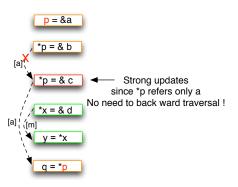
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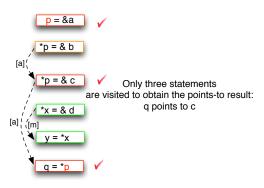
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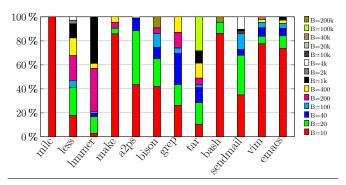


Figure: Percentage of queried variables proved to be safe (initialized) by demand-driven analysis over whole-program analysis under different budgets

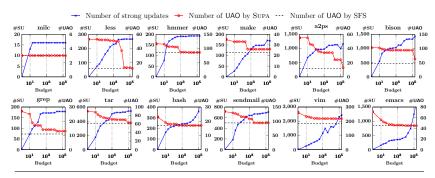


Figure: Correlating the number of strong updates with the number of unintialized variables detected under different budgets

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 - reduce the runtime overhead of SOFTBOUND from 77% to 47%
- Protecting Control-Flow Integrity (ISSTA'17 and ACISP'18)
 - pointer analysis to identify and remove spurious call targets by class hierarchy analysis to raise the bar against code reuse attacks.
 - reduce the sets of legitimate targets permitted at 20.3% of the virtual callsites in Chrome

Ongoing and Future Opportunities on SVF

- Automatic Program Repair: Value-flow-guided precise automatic program repair.
- Partial/Compositional Pointer Analysis: Analysis for programs in the presence of incomplete code.
- Machine-learning-guided static analysis: enable machine learning (e.g., deep representation learning) to boost pointer analysis for analysing large-scale programs.

Thanks!

Q & A