

# Automated Security Testing

## CS155 Computer and Network Security

*Acknowledgments: Lecture slides are from the Computer Security course taught by Dan Boneh at Stanford University. When slides are obtained from other sources, a reference will be noted on the bottom of that slide. A full list of references is provided on the last slide.*

**Stanford University**

# Fuzzing

# Fuzzing

Form of vulnerability analysis:

1. Feed large number of random anomalous test cases into program
2. Monitor for crashes or unexpected program behavior

Some kinds of errors can be used to find an exploit

Commonly used to test file parsers (e.g., PDF readers) and network protocols

# HTTP Fuzzing Example

## Standard HTTP GET Request

```
GET /index.html HTTP/1.1
```

## Anomalous Requests

```
GEEEE..EET /index.html HTTP/1.1
```

```
GET //////////index.html HTTP/1.1
```

```
GET %n%n%n%n%n%n.html HTTP/1.1
```

```
GET /AAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAAA.html HTTP/1.1
```

```
GET /index.html HTTTTTTTTTTTTTTTTP/1.1
```

```
GET /index.html HTTP/1.1.1.1.1.1.1.1.1
```

# HTTP Fuzzing Example

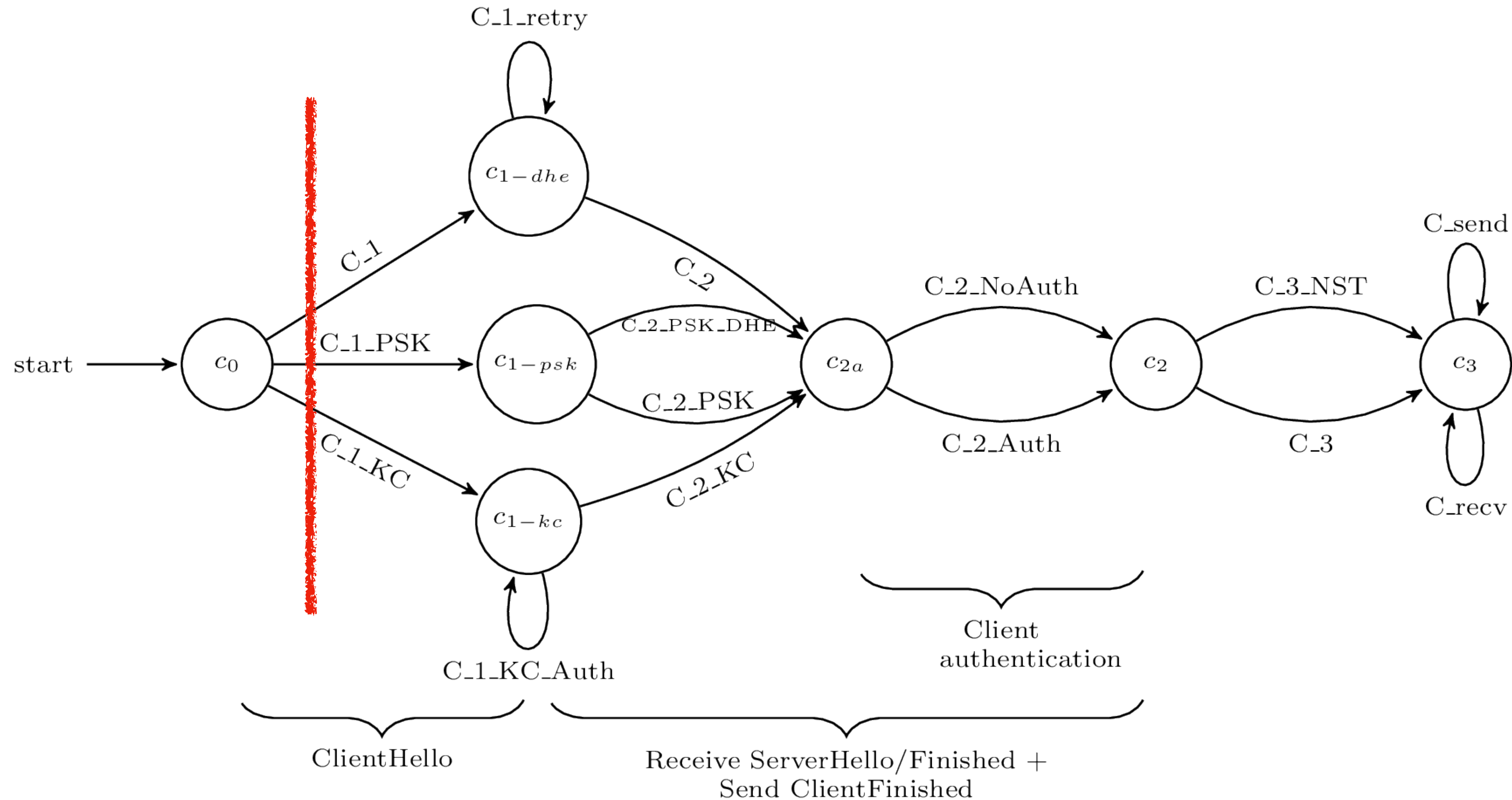
## Standard HTTP GET Request

```
GET /index.html HTTP/1.1
```

## Anomalous Requests

```
GEEEE...EET /index.html HTTP/1.1  
GET //////////index.html HTTP/1.1  
GET %n%n%n%n%n%n.html HTTP/1.1  
GET /AAAAAAAAAAAAAAAA.html HTTP/1.1  
df%w3rasd8#r78jskdf lasdjf  
4isg8swksdfskdf lsdgmsf$gkjs
```

# Random Fuzzing



# Types of Fuzzing

## **Mutation-based (Dumb) fuzzing**

Add anomalies to existing good inputs (e.g., test suite)

## **Generative (Smart) fuzzing**

Generate inputs from specification of format, protocol, etc

## **Evolutionary (Responsive) fuzzing**

Leverage program instrumentation, code analysis

Use response of program to build input set

# Mutation-Based Fuzzing

## Basic Idea

Take known good input and add anomalies

Anomalies may be completely random or follow some heuristics

- Large integers or strings

- Randomly flip bits



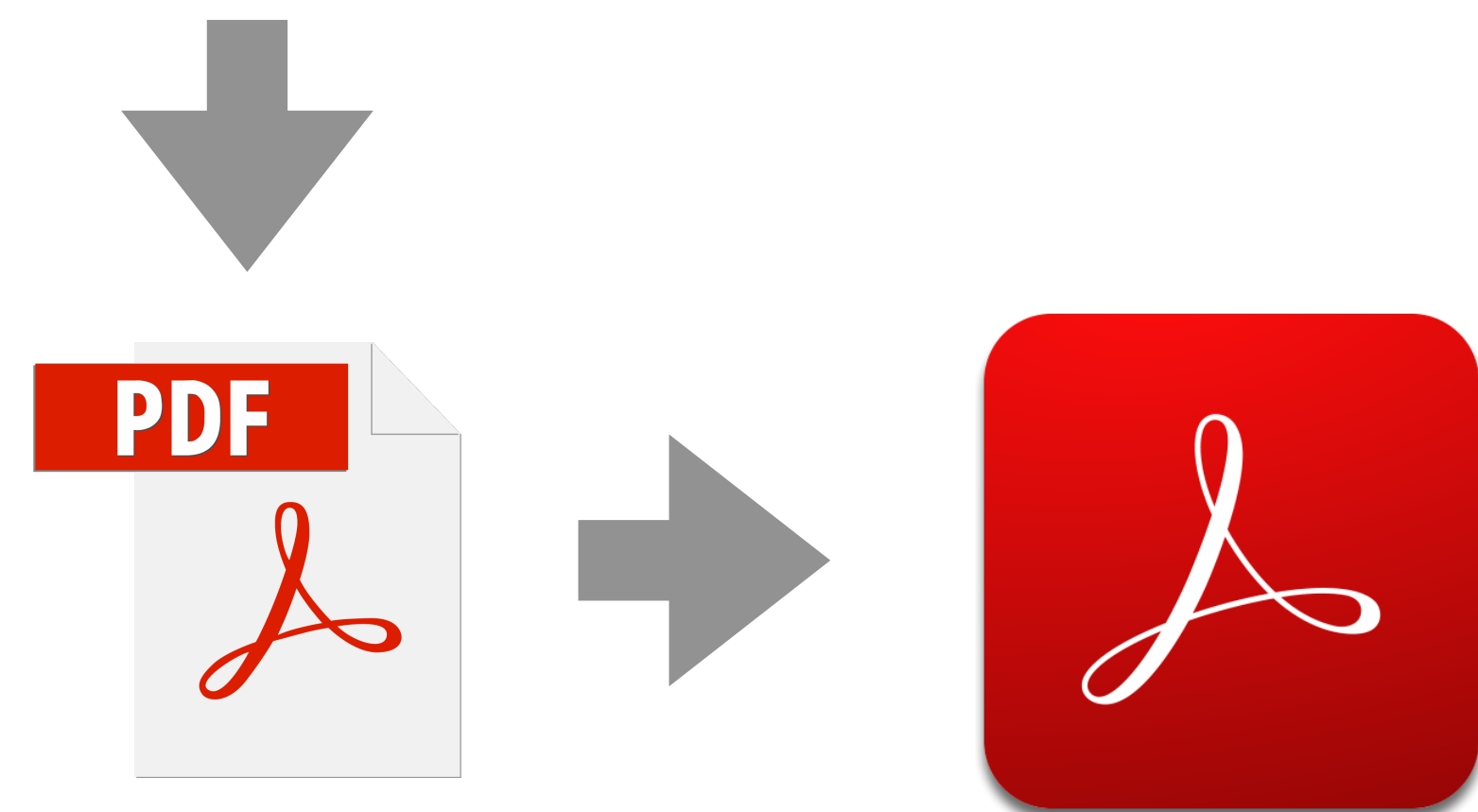
# Fuzzing PDF Reader

Download 100s of random PDF files

Mutate content in the PDF file:

- flip bits
- increase size of integers or strings
- remove data

Limited by the functionality that the existing files happened to use — unlikely to hit less commonly tested code paths



# Mutation-Based Fuzzing

## Basic Idea

Take known good input and add anomalies

Anomalies may be completely random or follow some heuristics

## Advantages

Little or no knowledge of the structure of the inputs is assumed

Requires little to no set up time

## Disadvantages

Dependent on the inputs being modified

May fail for protocols with checksums, challenge-response, etc.

# Generation Based Fuzzing

## Basic Idea

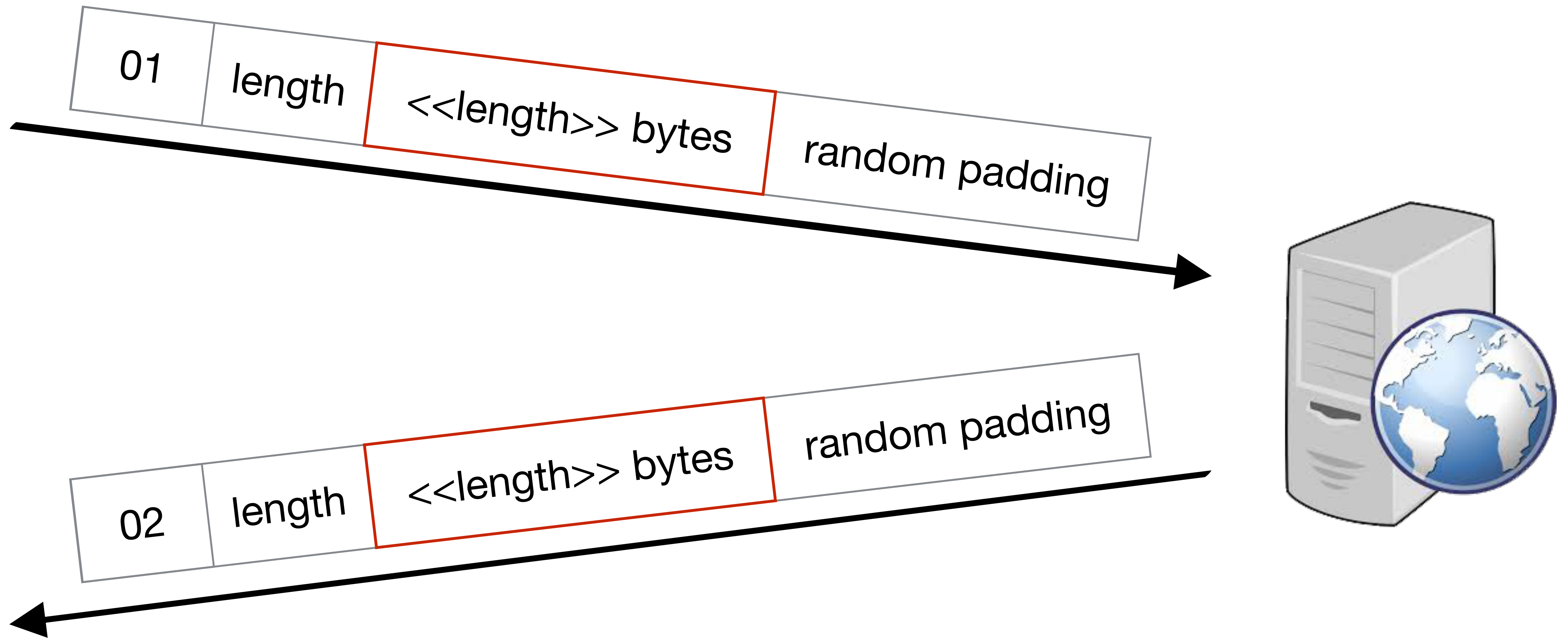
Test cases are generated from protocol description: RFC, spec, etc.  
Anomalies are added to each possible spot in the inputs



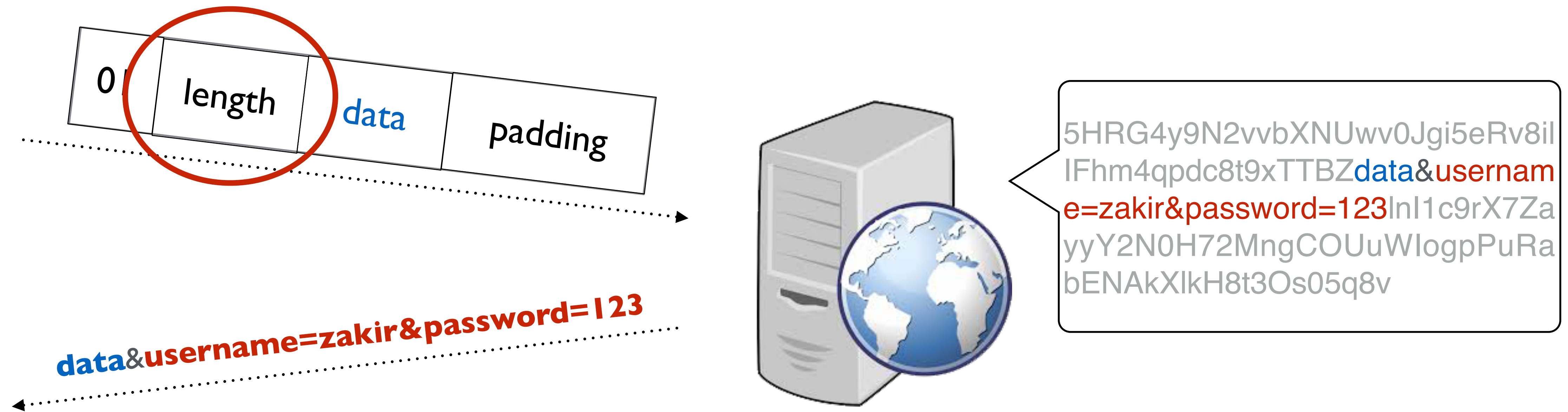
# Generation Example

```
1 <!-- A. Local file header -->
2 <Block name="LocalFileHeader">
3   <String name="lfh_Signature" valueType="hex" value="504b0304" token="true" mut
4   <Number name="lfh_Ver" size="16" endian="little" signed="false"/>
5   ...
6   [truncated for space]
7   ...
8   <Number name="lfh_CompSize" size="32" endian="little" signed="false">
9     <Relation type="size" of="lfh_CompData"/>
10  </Number>
11  <Number name="lfh_DecompSize" size="32" endian="little" signed="false"/>
12  <Number name="lfh_FileNameLen" size="16" endian="little" signed="false">
13    <Relation type="size" of="lfh_FileName"/>
14  </Number>
15  <Number name="lfh_ExtraFldLen" size="16" endian="little" signed="false">
16    <Relation type="size" of="lfh_FldName"/>
17  </Number>
18  <String name="lfh_FileName"/>
19  <String name="lfh_FldName"/>
20  <!-- B. File data -->
21  <Blob name="lfh_CompData"/>
22 </Block>
```

# Generation Example: TLS Heartbeat



# Generation Example: TLS Heartbeat



Heartbleed Vulnerability: server trusts user provided length field and echoes back memory contents following request data



# Generation Based Fuzzing

## Basic Idea

Test cases are generated from protocol description: RFC, spec, etc.  
Anomalies are added to each possible spot in the inputs

## Advantages

Knowledge of protocol may give better results than random fuzzing

## Disadvantages

Can take *significant* time to set up. Requires understanding spec

**Can you find anything  
with “dumb” fuzzing?**



# Charlie Miller's 5 Lines

In 2010, Charlie Miller fuzzed Adobe Acrobat, Apple Preview, Powerpoint, and Open Office by downloading PDF and PPT files and five lines of simple fuzzing:

```
numwrites = random.randrange(math.ceil((float(len(buf)) / FuzzFactor))) + 1
for j in range(numwrites):
    rbyte = random.randrange(256)
    rn = random.randrange(len(buf))
    buf[rn] = "%c"%(rbyte)
```

# Charlie Miller's 5 Lines

## **Collect a large number of pdf files**

Aim to exercise all features of pdf readers

Found 80,000 PDFs on Internet

## **Reduce to smaller set with apparently equivalent code coverage**

Used Adobe Reader + Valgrind in Linux to measure code coverage

Reduced to 1,515 files of 'equivalent' code coverage

Same effect as fuzzing all 80k in 2% of the time

# Charlie Miller's 5 Lines

Randomly changed selected bytes to random values in files

Produce ~3 million test cases from 1,500 files

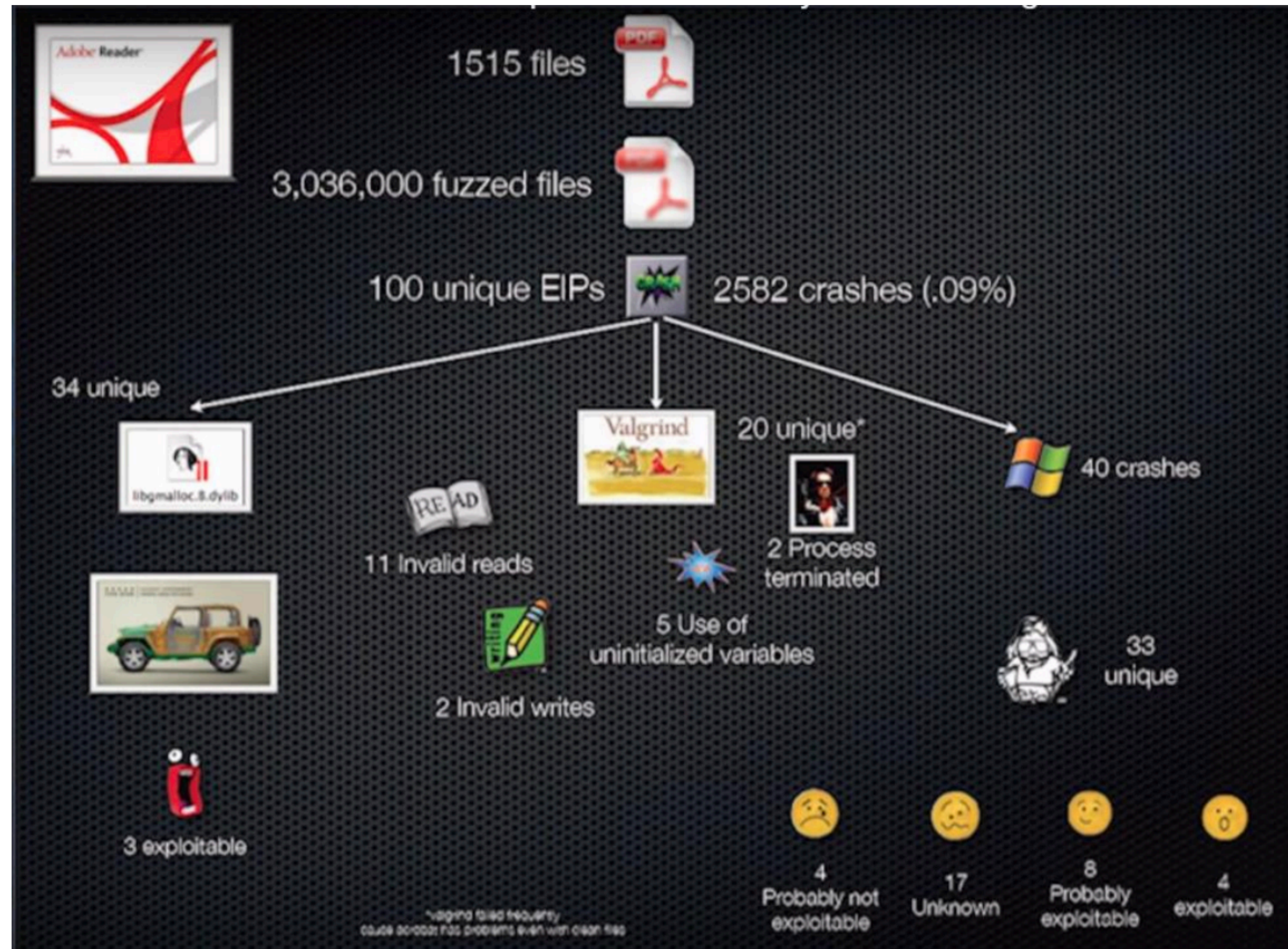
Use standard common tools to determine if crash represents a exploit

Acrobat: 100 unique crashes, 4 actual exploits

Preview: 250 unique crashes, 60 exploits (tools may over-estimate)

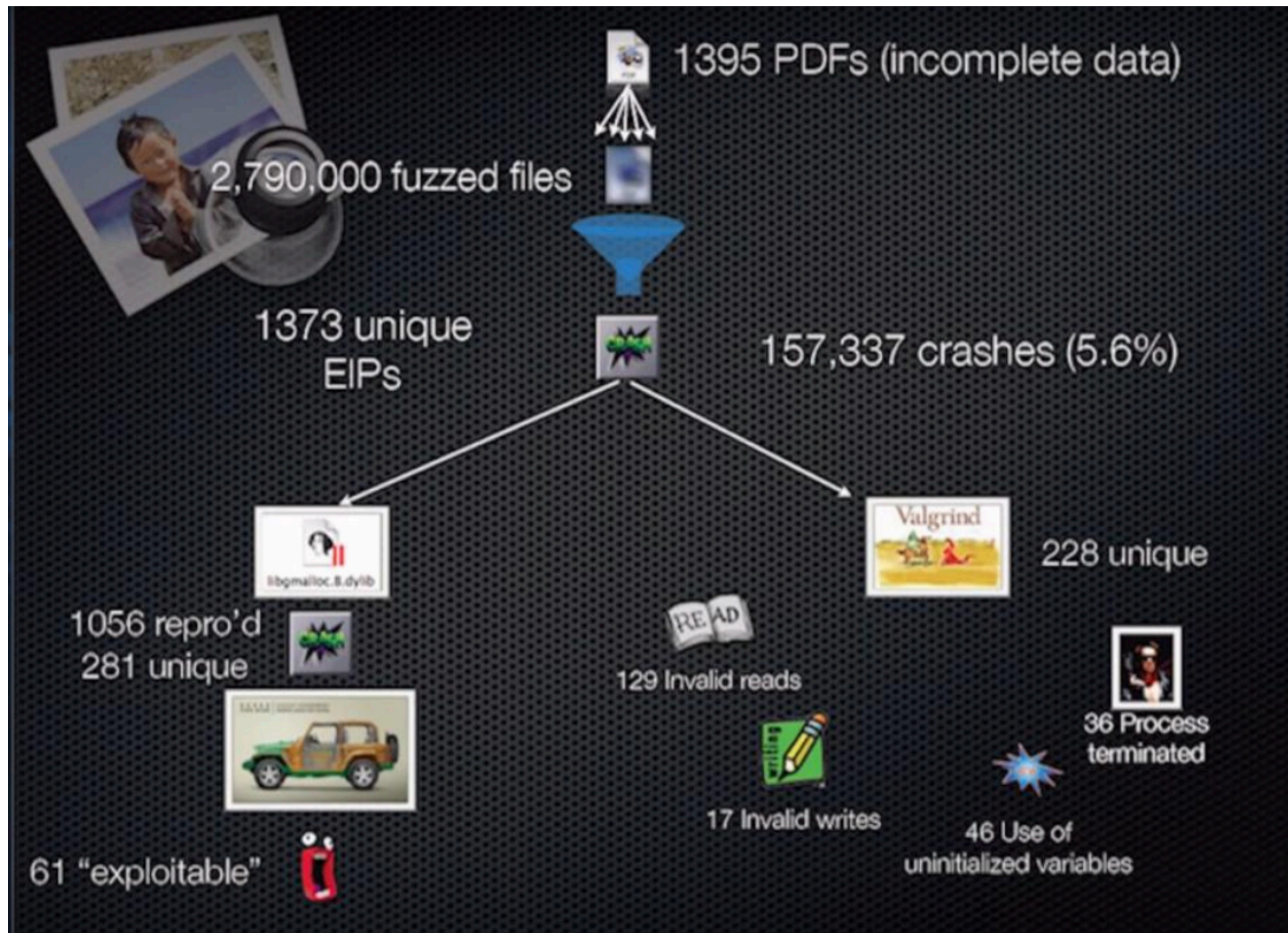


# Adobe Acrobat





# Apple Preview





# Mutation vs Generation

	Ease of Use	Knowledge	Completeness	Complex Programs
Mutation	Easy to setup and automate	Little to no protocol knowledge required	Limited by initial corpus	May fail for protocols with checksums or other complexity
Generative	Writing generator is labor intensive	Requires having protocol specification	More complete than mutations	Handles arbitrarily complex protocols

# Problems with Fuzzing

Mutation based fuzzers can generate an infinite number of test cases...  
*When has the fuzzer run long enough?*

Generation based fuzzers generate a finite number of test cases.  
*What happens when they're all run and no bugs are found?*

How do you monitor the target application such that you know when something “bad” has happened?

Sometimes every anomalous test case triggers the same (boring) bug?

# Code Coverage

What if we tried to build tests that try to reach code in the program?

Code coverage is a metric which can be used to determine how much code has been executed.

**Function coverage:** Has each function in the program been called?

**Edge coverage:** Has every edge in the Control flow graph been executed?

**Branch coverage:** Has each branch of each control structure been executed?

**Predicate coverage:** Has each boolean expression been evaluated to true and false?



# Evolutionary Fuzzing

## Basic Idea:

Generate inputs based on the structure and response of the program

**Autodafe:** Prioritizes based on inputs that reach dangerous API functions

**EFS:** Generates test cases based on code coverage metrics

Typically instrument program with additional instructions to track what code has been reached — or, if no source is available, track with Valgrind.

# Tools

**Two popular tools today are:**

cross\_fuzz — specifically targeted at browser and generating complex DOM sequences

American Fuzzy Lop (AFL) — most everything else

# AFL Algorithm

- 1) Load user-supplied initial test cases into the queue,
- 2) Take next input file from the queue,
- 3) Attempt to trim the test case to the smallest size that doesn't alter the measured behavior of the program,
- 4) Repeatedly mutate the file using a balanced and well-researched variety of traditional fuzzing strategies,
- 5) If any of the generated mutations resulted in a new state transition recorded by the instrumentation, add mutated output as a new entry in the queue.
- 6) Go to 2.

# Program Analysis

# Program Analyzers

Program analysis — process of analyzing program behavior to determine correctness, robustness, safety and liveness

## **Static analysis**

- Analyze source to find errors or check their absence

- Consider all possible inputs (in summary form)

- Can prove absence of bugs, in some cases

## **Dynamic analysis**

- Run instrumented code to find problems

  - Need to choose sample test input

- Can find vulnerabilities but cannot prove their absence

# Static Analysis

A static analysis tool **S** analyzes the source code of a program **P** to determine whether it satisfies a property  $\phi$ , such as:

- “**P** never dereferences a null pointer”
- “**P** does not leak file handles”
- “No cast in **P** will lead to a ClassCastException”

# Static Analysis

A sta  
deter

Unfortunately, it is impossible to write such a tool!

- “**Rice's theorem** states that all non-trivial, semantic properties of programs are undecidable

- “

- “

For any nontrivial property  $\phi$ , there is no general automated method to determine whether  $P$  satisfies  $\phi$

# Two Imperfect Options

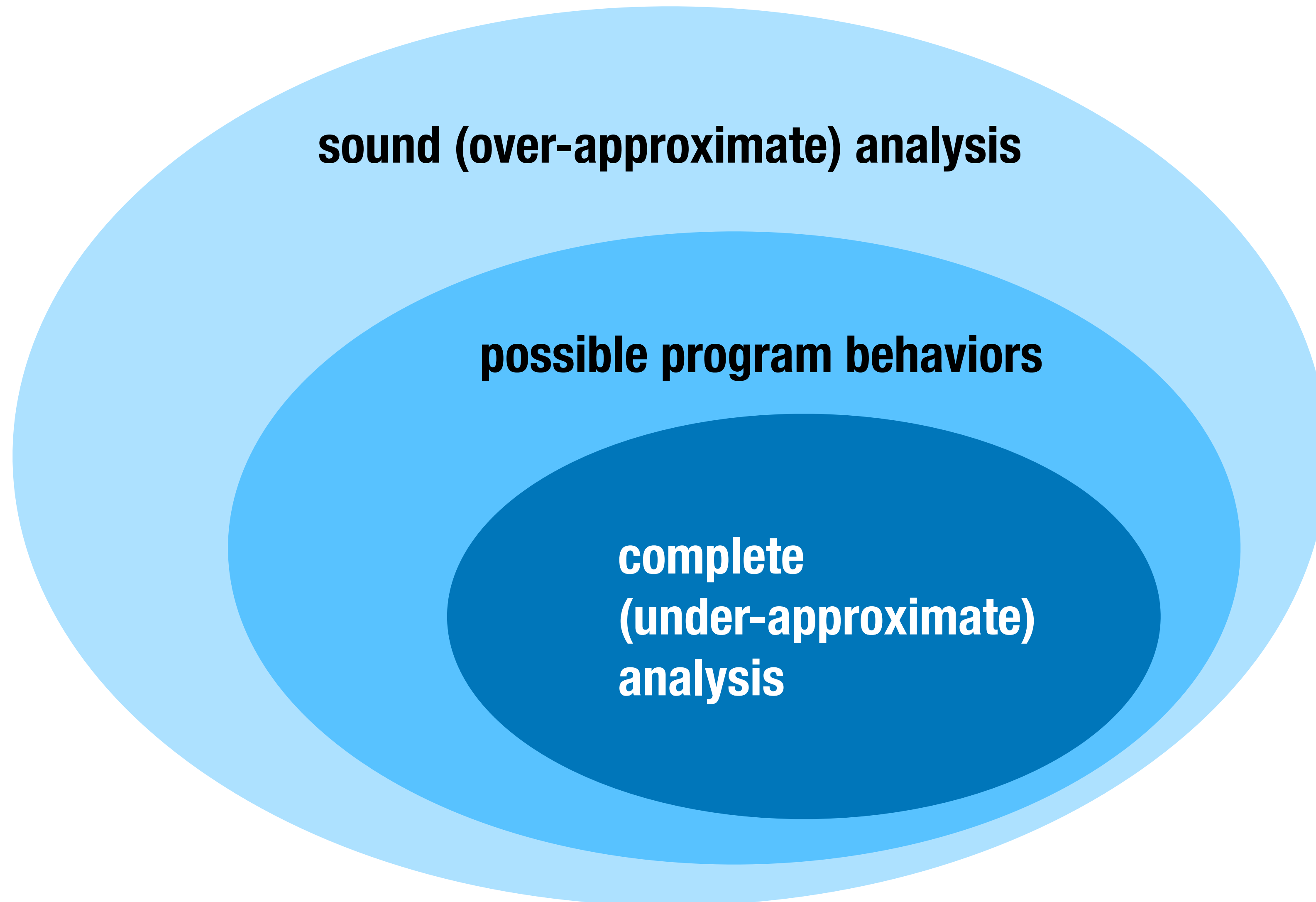
An analysis tool **S** analyzes the source code of a program **P** to determine whether it satisfies a property  $\phi$  can be wrong in one of two ways:

If **S** is sound, it will never miss violations, but it may say that **P** violates  $\phi$  even though it doesn't (resulting in false positives).

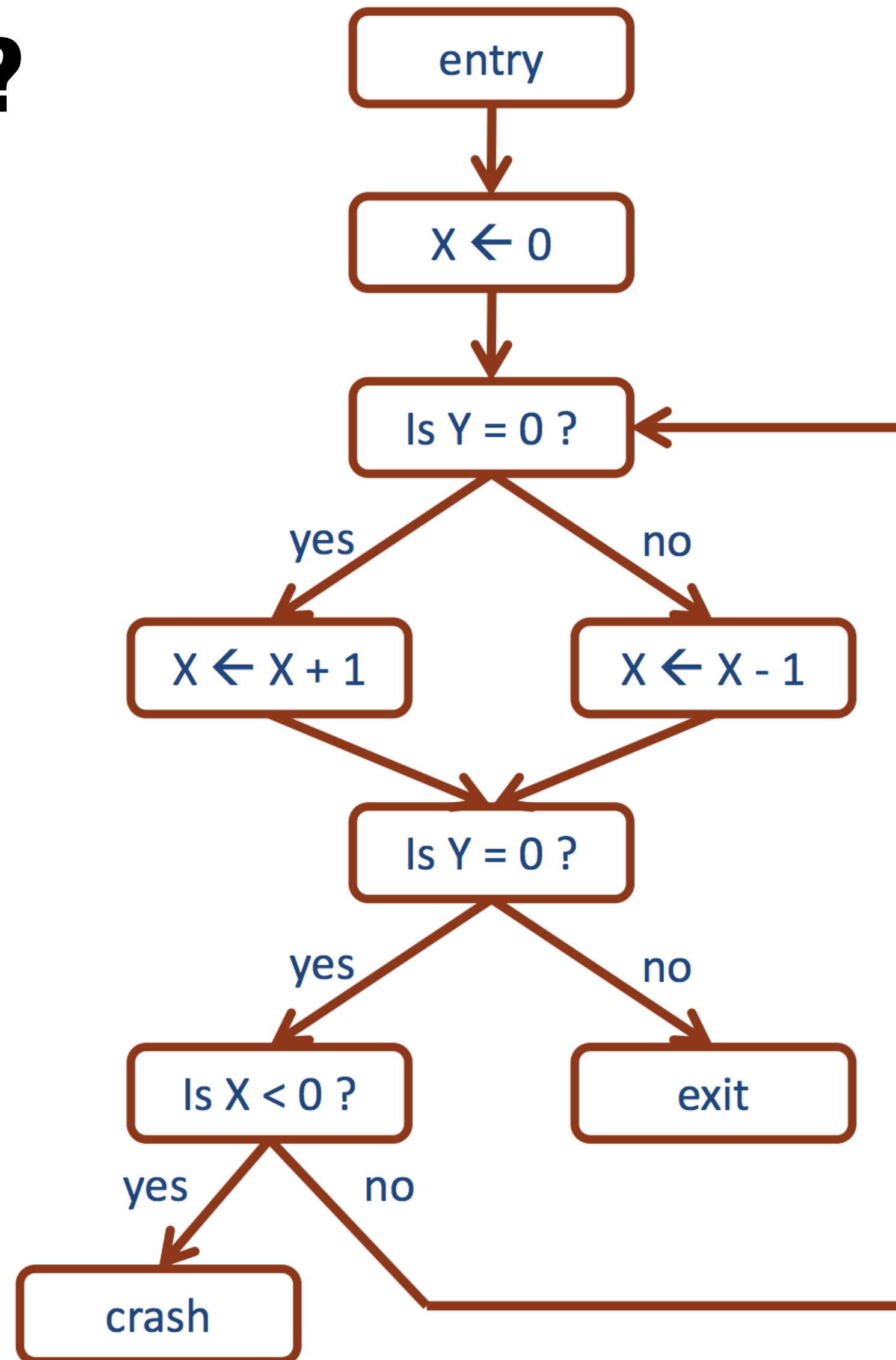
If **S** is complete, it will never report false positives, but it may miss real violations of  $\phi$  (resulting in false negatives).



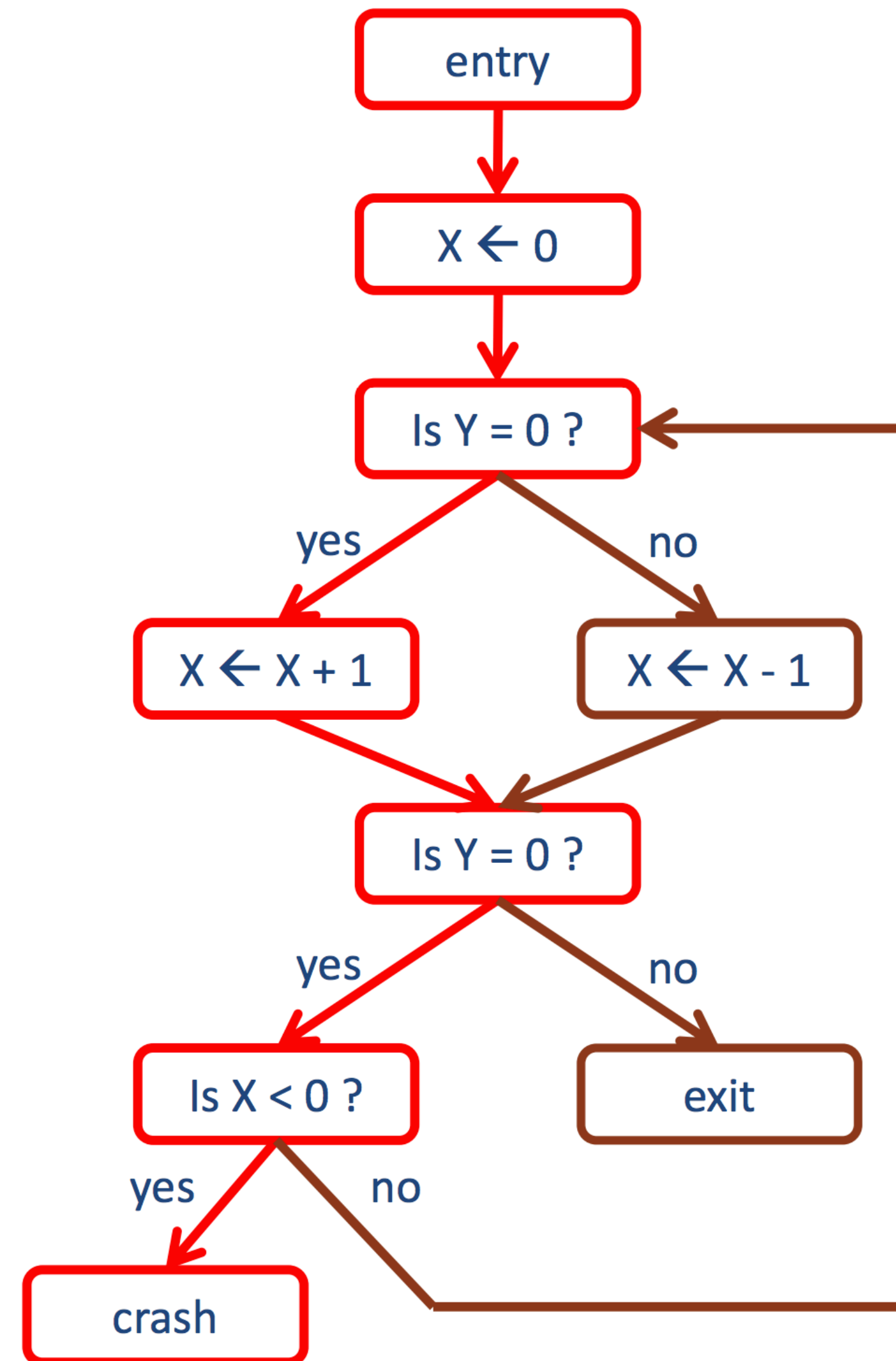
# Soundness vs Completeness



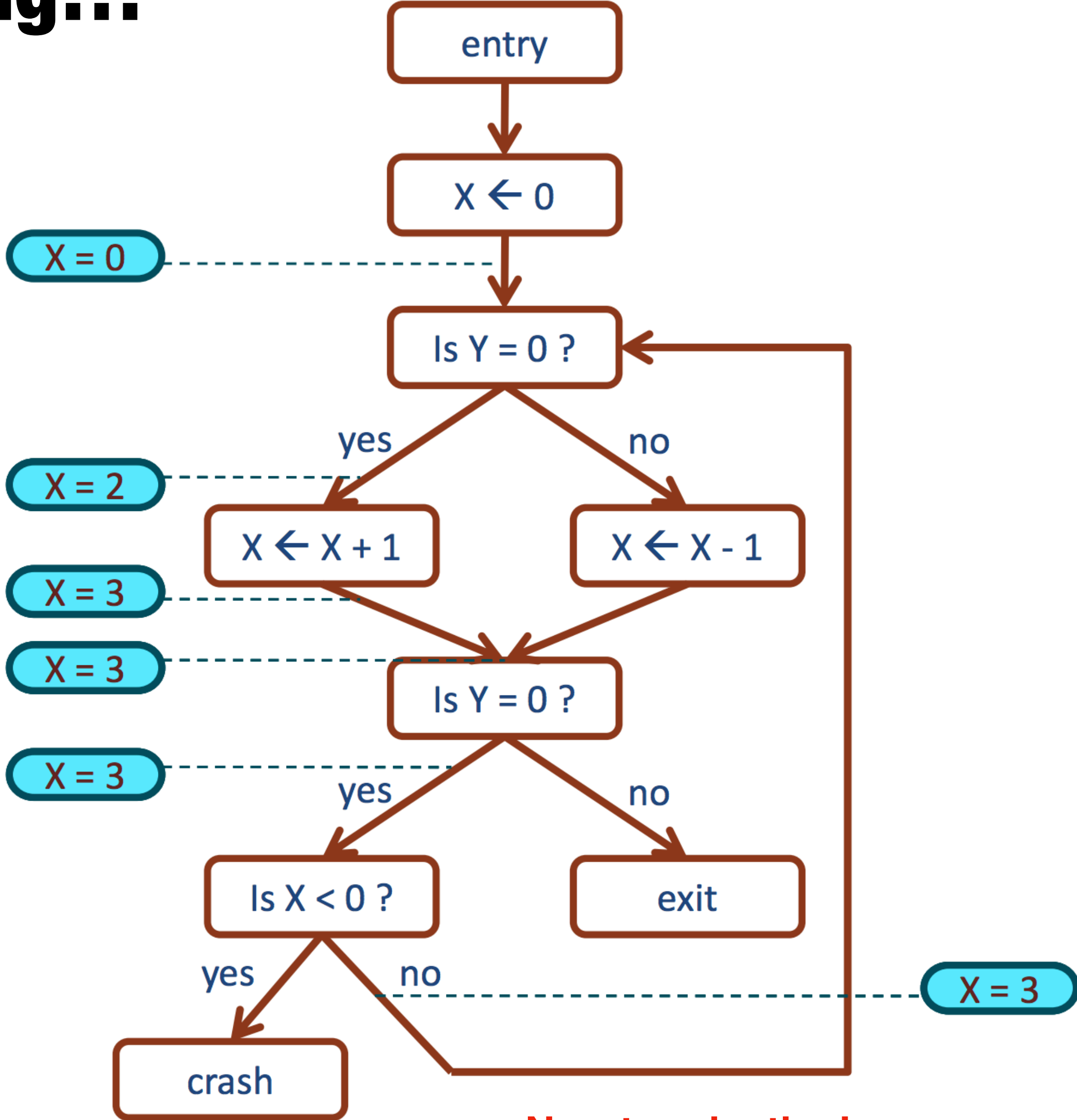
**Is this program safe?**



**Yes, it is safe.**  
**This program will not crash.**

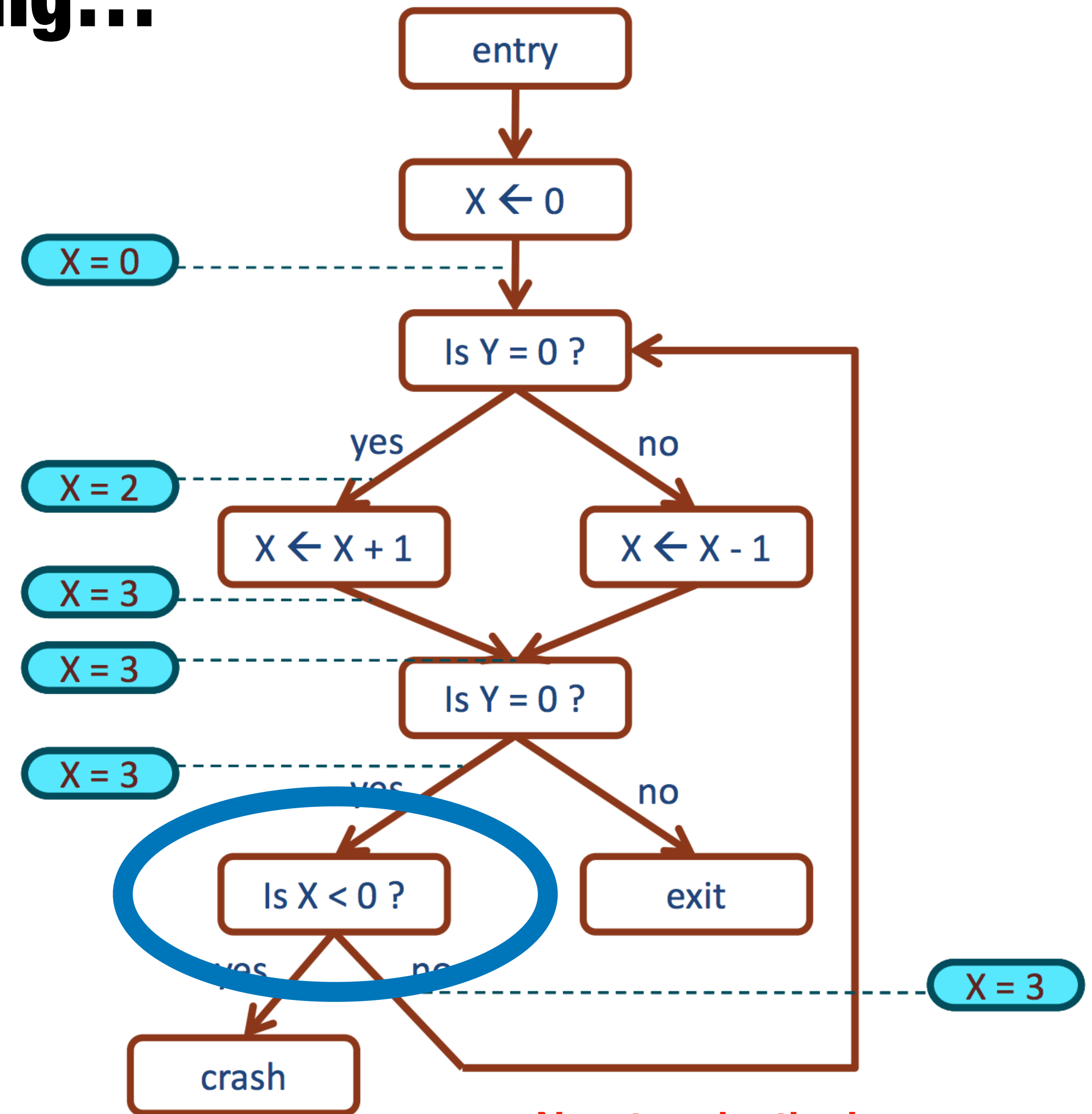


# Try analyzing without approximating...



**Non-termination!**  
**Therefore, need to approximate**

# Try analyzing without approximating...



**Non-termination!**  
**Therefore, need to approximate**

# Abstraction

## Concrete Domain of Integers

$$x = 5$$

$$x = -5$$

$$x = 0$$

## Abstract Domain of Signs

⊕ Positive ints

⊖ Negative ints

⊕ Zero

# Abstraction

**Concrete Domain of Integers**

**Abstract Domain of Signs**

$x = 5$  →  $\oplus$  Positive ints

$x = -5$  →  $\ominus$  Negative ints

$x = 0$  →  $\odot$  Zero

# Abstraction

**Concrete Domain of Integers**

**Abstract Domain of Signs**

**$x = 5$**

**$x = -5$**

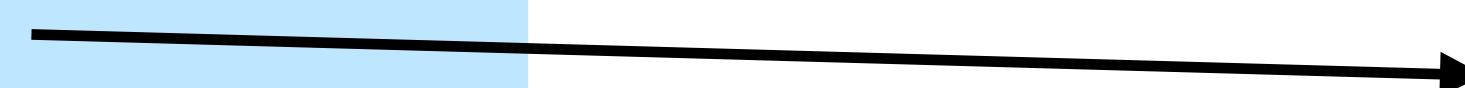
**$x = 0$**

**$x = b ? -1 : 1$**

**$\oplus$  Positive ints**

**$\ominus$  Negative ints**

**$\odot$  Zero**





# Abstraction

**Concrete Domain of Integers**

**Abstract Domain of Signs**

**$x = 5$**

**$x = -5$**

**$x = 0$**

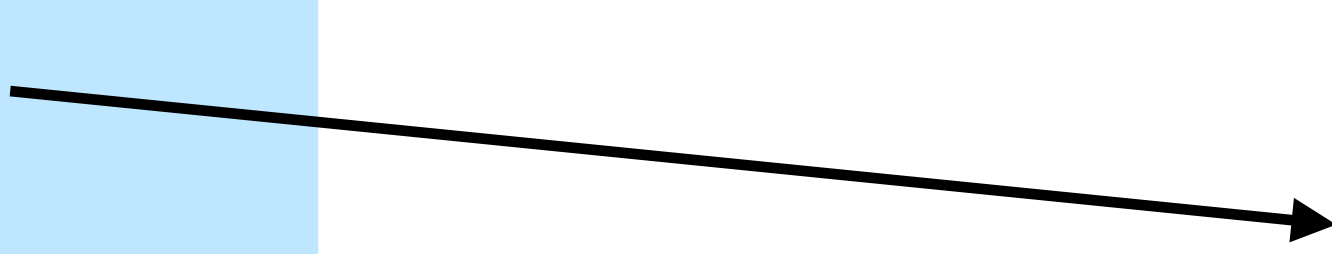
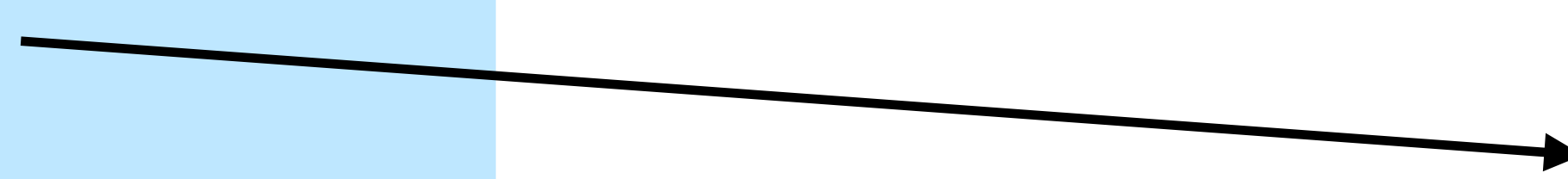
**$x = b ? -1 : 1$**

**$\oplus$  Positive ints**

**$\ominus$  Negative ints**

**$\odot$  Zero**

**$\top$  All integers**



# Abstraction

**Concrete Domain of Integers**

**Abstract Domain of Signs**

**$x = 5$**

**$x = -5$**

**$x = 0$**

**$x = b ? -1 : 1$**

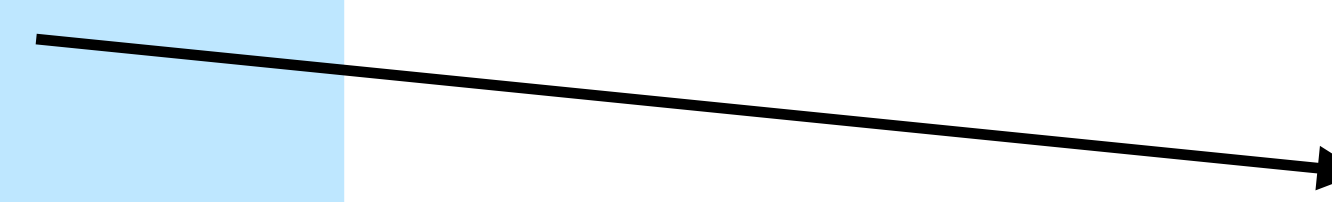
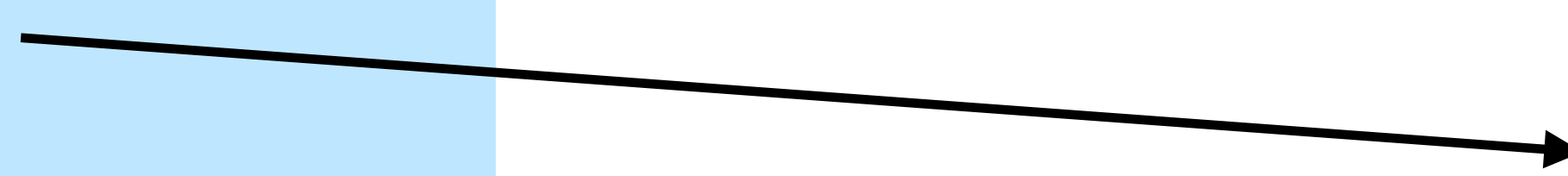
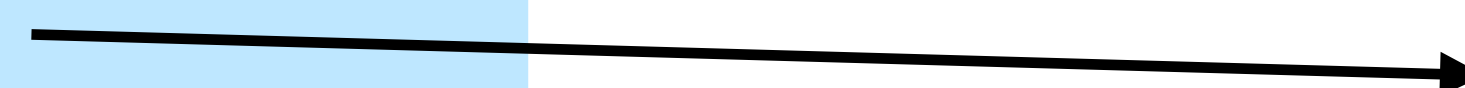
**$x = y / 0$**

**$\oplus$  Positive ints**

**$\ominus$  Negative ints**

**$\odot$  Zero**

**$\top$  All integers**



# Abstraction

**Concrete Domain of Integers**

**Abstract Domain of Signs**

**$x = 5$**

**$x = -5$**

**$x = 0$**

**$x = b ? -1 : 1$**

**$x = y / 0$**

**$\oplus$  Positive ints**

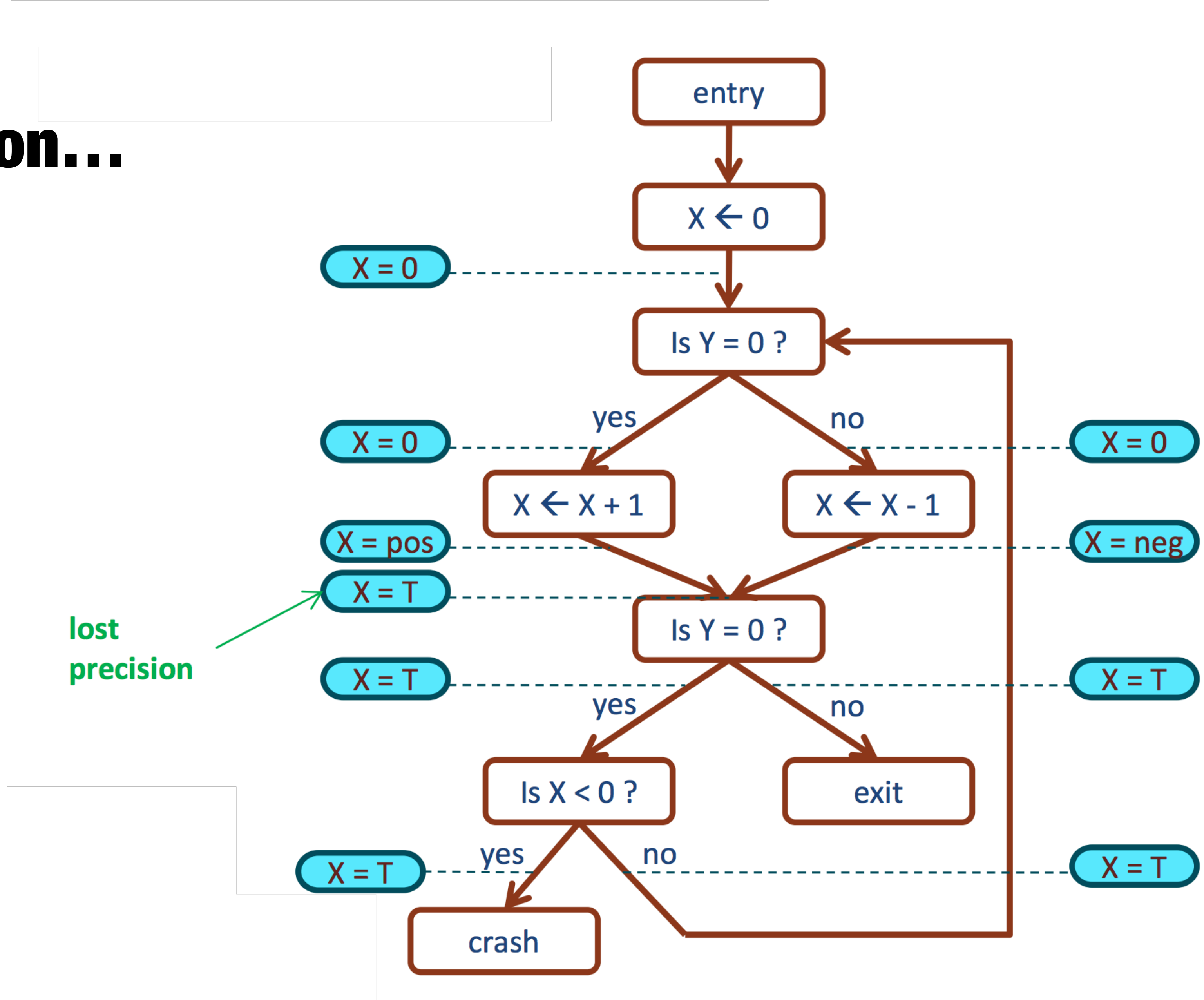
**$\ominus$  Negative ints**

**$\odot$  Zero**

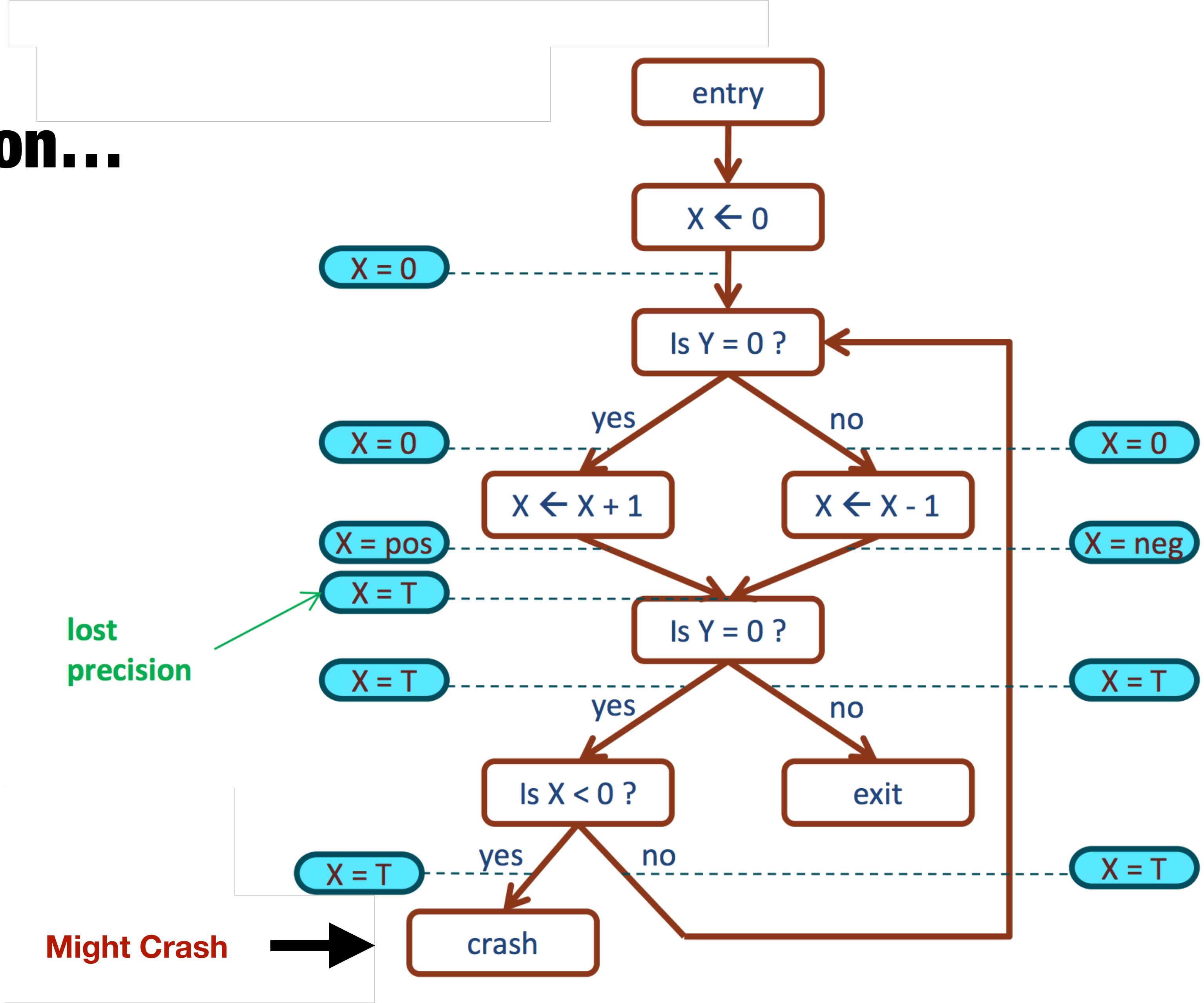
**$\top$  All integers**

**$\perp$  No integers  
(undefined)**

# Try analyzing with “signs” approximation...



# Try analyzing with “signs” approximation...







# Bugs to Detect

Uninitialized variables

Null pointer dereference

Use after free

Double free

Array indexing errors

Mismatched array new/delete

Potential stack overrun

Potential heap overrun

Return pointers to local variables

Logically inconsistent code

Invalid use of negative values

Passing large parameters by value

Underallocations of dynamic data

Memory leaks

File handle leaks

Network resource leaks

Unused values

Unhandled return codes

Use of invalid iterators

# Example: Check for missing optional args

## Prototype for `open()` syscall:

```
int open(const char *path, int oflag, /* mode_t mode */...);
```

## Typical mistake:

```
fd = open("file", O_CREAT);
```

**Result:** file has random permissions

**Check:** Look for `oflags == O_CREAT` without mode argument

# Example: Chroot protocol checker

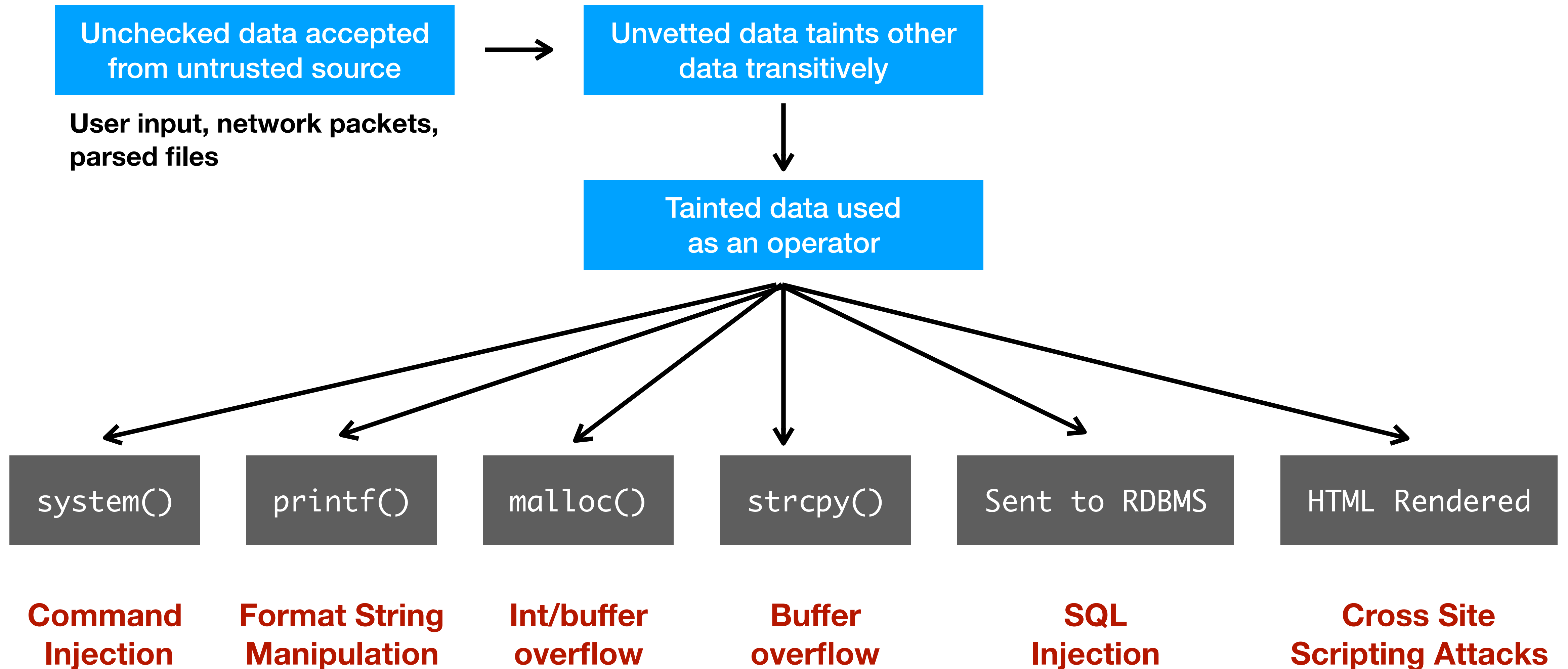
**Goal:** confine process to a “jail” on the filesystem

chroot() changes filesystem root for a process

**Problem:** chroot() itself does not change current working directory

**Check:** check if any sys calls (e.g., open) are called before chdir is called

# Tainting Checkers





# Finding Vulnerabilities

## **Stanford Research**

*Using Programmer-Written Compiler Extensions to Catch Security Holes*

Ken Ashcraft and Dawson Engler

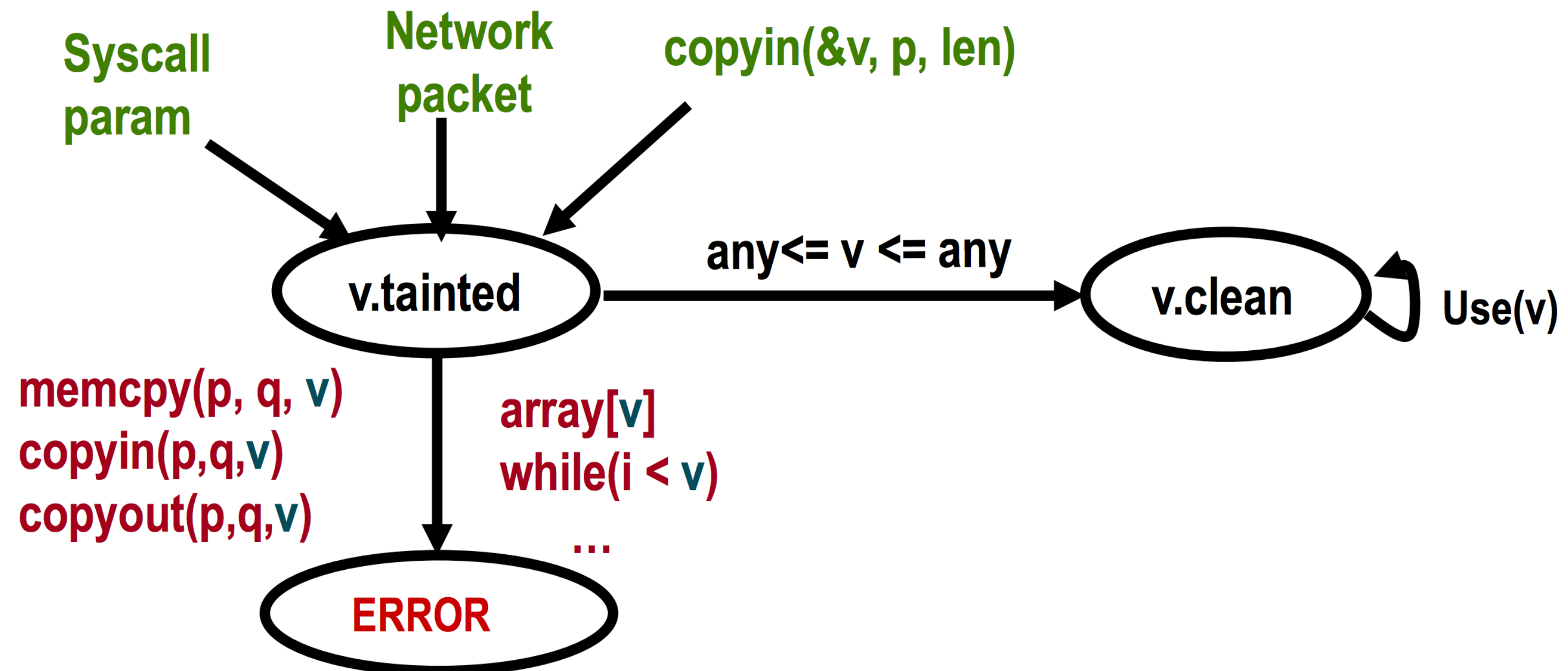
*IEEE Security and Privacy* (“Oakland”) 2002

Used modified compiler to find over 100 security holes in Linux and BSD

Longterm, commercialized and extended tools

# Checking for Unsanitized Integers

Warn when unchecked integers from **untrusted sources** reach **trusting sinks**



Linux: 125 errors, 24 false; BSD: 12 errors, 4 false

# Example Untrusted Integer

## Remote exploit, no length checks

```
/* 2.4.9/drivers/isdn/act2000/capi.c:actcapi_dispatch */
isdn_ctrl cmd;
...
while ((skb = skb_dequeue(&card->rcvq))) {
msg = skb->data;
...
memcpy(cmd.parm.setup.phone,
msg->msg.connect_ind.addr.num,
msg->msg.connect_ind.addr.len - 1);
```

# Overview of Static Analysis

Automated method to find errors or check their absence

Consider all possible inputs (in summary form)

Can prove absence of bugs, in some cases

Very well-studied part of computer science, but tools will inherently always over- or under-report problems

# Dynamic Analysis

Dynamic (Program) Analysis analyzes computer software while it is operating (in contrast to static which looks only at code)

Unit tests, integration tests, system tests and acceptance tests are all a form of dynamic testing.

However, typically like to instrument code to understand where the problem occurred



# Valgrind

==25832== Invalid read of size 4

==25832== at 0x8048724: BandMatrix::ReSize(int, int, int) (bogon.cpp:45)

==25832== by 0x80487AF: main (bogon.cpp:66)

==25832== Address 0xBF74C is not stack'd, malloc'd or free'd

# Isn't that a Debugger?

Traditional debuggers typically focus on allow programmers to find the source of fatal errors (e.g., NULL pointer deref)

Not all bugs lead to crashes — especially for inputs that typically don't crash.

In contrast, security tools attempt to uncover non-fatal problems — potential race conditions or overflows

# Google AddressSanitizer (ASan)

AddressSanitizer is a memory error detector for C/C++ that finds:

- Use after free (dangling pointer dereference)

- Heap buffer overflow

- Stack buffer overflow

- Global buffer overflow

- Use after return

- Use after scope

- Initialization order bugs

- Memory leaks

# Google AddressSanitizer (ASan)

## **LLVM Pass**

Modifies the code to check the shadow state for each memory access and creates poisoned redzones around stack and global objects to detect overflows and underflows

## **A run-time library that replaces the malloc function**

The run-time library replaces malloc, free and related functions, creates poisoned redzones around allocated heap regions, delays the reuse of freed heap regions, and does error reporting.

# Google AddressSanitizer (ASan)

```
==9901==ERROR: AddressSanitizer: heap-use-after-free on address 0x60700000dfb5 at pc 0x45917b
bp 0x7fff4490c700 sp 0x7fff4490c6f8
READ of size 1 at 0x60700000dfb5 thread T0
#0 0x45917a in main use-after-free.c:5
#1 0x7fce9f25e76c in __libc_start_main /build/buildd/eglibc-2.15/csu/libc-start.c:226
#2 0x459074 in _start (a.out+0x459074)
0x60700000dfb5 is located 5 bytes inside of 80-byte region [0x60700000dfb0,0x60700000e000)
freed by thread T0 here:
#0 0x4441ee in __interceptor_free projects/compiler-rt/lib/asan/asan_malloc_linux.cc:64
#1 0x45914a in main use-after-free.c:4
#2 0x7fce9f25e76c in __libc_start_main /build/buildd/eglibc-2.15/csu/libc-start.c:226
previously allocated by thread T0 here:
#0 0x44436e in __interceptor_malloc projects/compiler-rt/lib/asan/asan_malloc_linux.cc:74
#1 0x45913f in main use-after-free.c:3
#2 0x7fce9f25e76c in __libc_start_main /build/buildd/eglibc-2.15/csu/libc-start.c:226
SUMMARY: AddressSanitizer: heap-use-after-free use-after-free.c:5 main
```

# Summary of Program Analysis

	Pros	Cons
Static	<p>Enables quickly finding bugs at development time</p> <p>Can detect some problems that dynamic misses</p>	<p>Either over or under reports.</p> <p>Misses complex bugs.</p> <p>Generally requires code.</p>
Dynamic	<p>May uncover complex behavior missed by static.</p> <p>Can run on blackbox.</p>	<p>Depends on user input—only checks executed code</p>



# Reverse Engineering

# Reverse Engineering

**reverse engineering:** process of discovering the technological principles of a [insert noun] through analysis of its structure, function, and operation

In security, this is typically uncovering the human readable code for a binary:

- Vulnerability or exploit research

- Malware analysis

- Check for copyright/patent violations

- Interoperability (e.g. understanding a file/protocol format)

- Copy protection (e.g., DRM or software licensing) removal

# Techniques

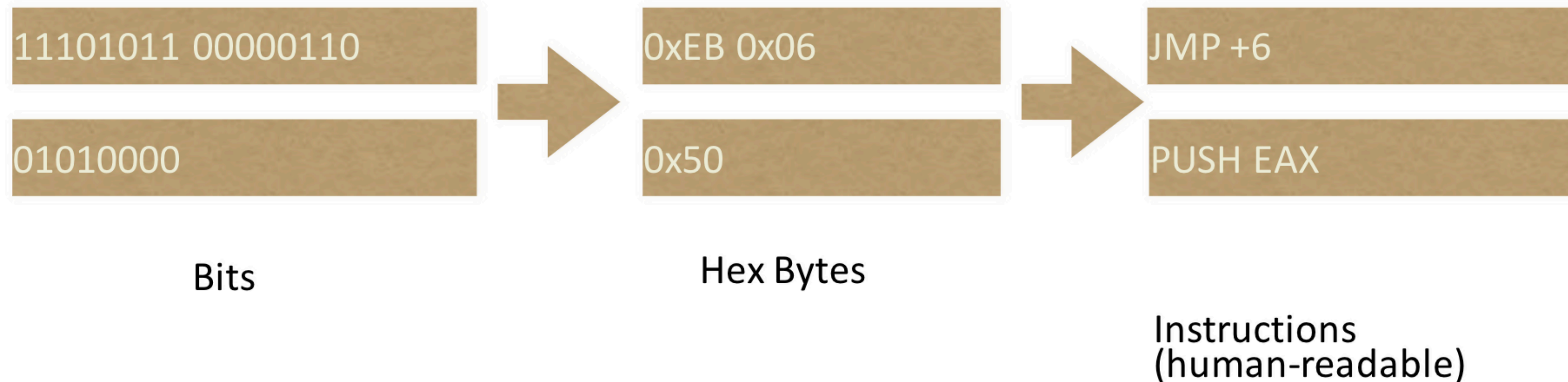
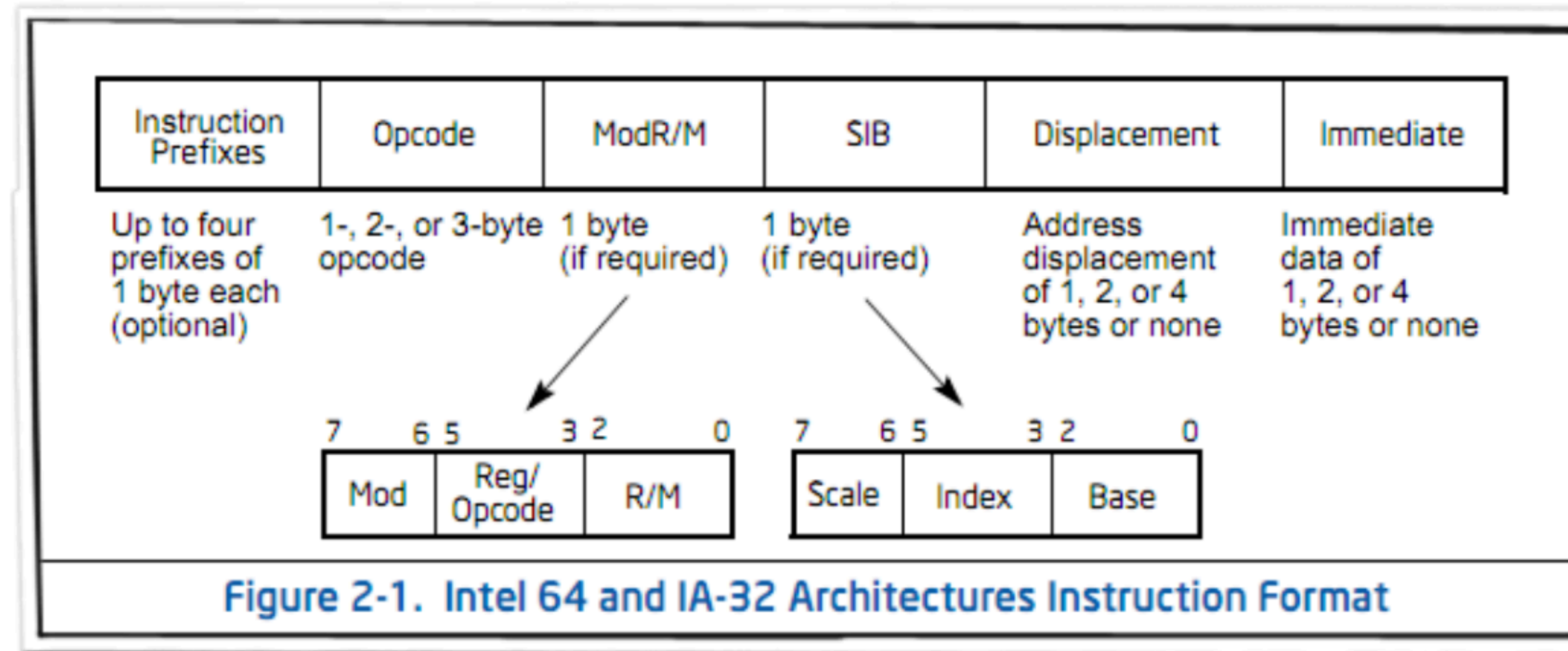
## **Static Code Analysis (structure)**

- \* Disassemblers

## **Dynamic Code Analysis (operation)**

- \* Tracing / Hooking
- \* Debuggers

# Disassembly



# Decompilation

```
lui    $v0, 0($v0)
andi   $v0, 0xFF
move   $v1, $v0
la     $v0, a2i
addu   $v0, $v1, $v0
lbu    $v0, 0($v0)
sb     $v0, 0x48+var_30($fp)
lbu    $v1, 0x48+var_30($fp)
li     $v0, 0xFF
bne    $v1, $v0, loc_402160
or     $at, $zero
```

```
lui    $v0, 0x40
addiu  $v1, $v0, (aWrongPassword - 0x400000) # "WRONG PASSWORD\n"
lw     $v0, stderr@@GLIBC_2_0
move   $a0, $v1 # ptr
li     $a1, 1 # size
li     $a2, 0xF # n
jal    fwrite
move   $a3, $v0 # s
jal    exit
li     $a0, 1 # status
```

```
fwrite("ERR\n");
exit(0);
```



# Decompilation

```
IDA View-A Pseudocode-A
2 {
3  unsigned int v2; // [sp+20h] [bp-28h]@1
4  __int64 *v3; // [sp+28h] [bp-20h]@1
5  signed int i; // [sp+30h] [bp-18h]@1
6  va_list va; // [sp+58h] [bp+10h]@1
7
8  va_start(va, a1);
9  v3 = (__int64 *)va;
10 v2 = 0;
11 for ( i = 0; i < (signed int)a1; ++i )
12 {
13     ++v3;
14     v2 += *((_DWORD *)v3 - 2);
15 }
16 printf("va_ri/count = %d\n", a1);
17 printf("va_ri/res   = %d\n", v2);
18 return v2;
19 }
```

00003615 va\_ri:2



# Difficulties

## Disassembly is imperfect

### Benign Optimizations

- Constant folding
- Dead code elimination
- Inline expansion
- etc...

### Intentional Obfuscation

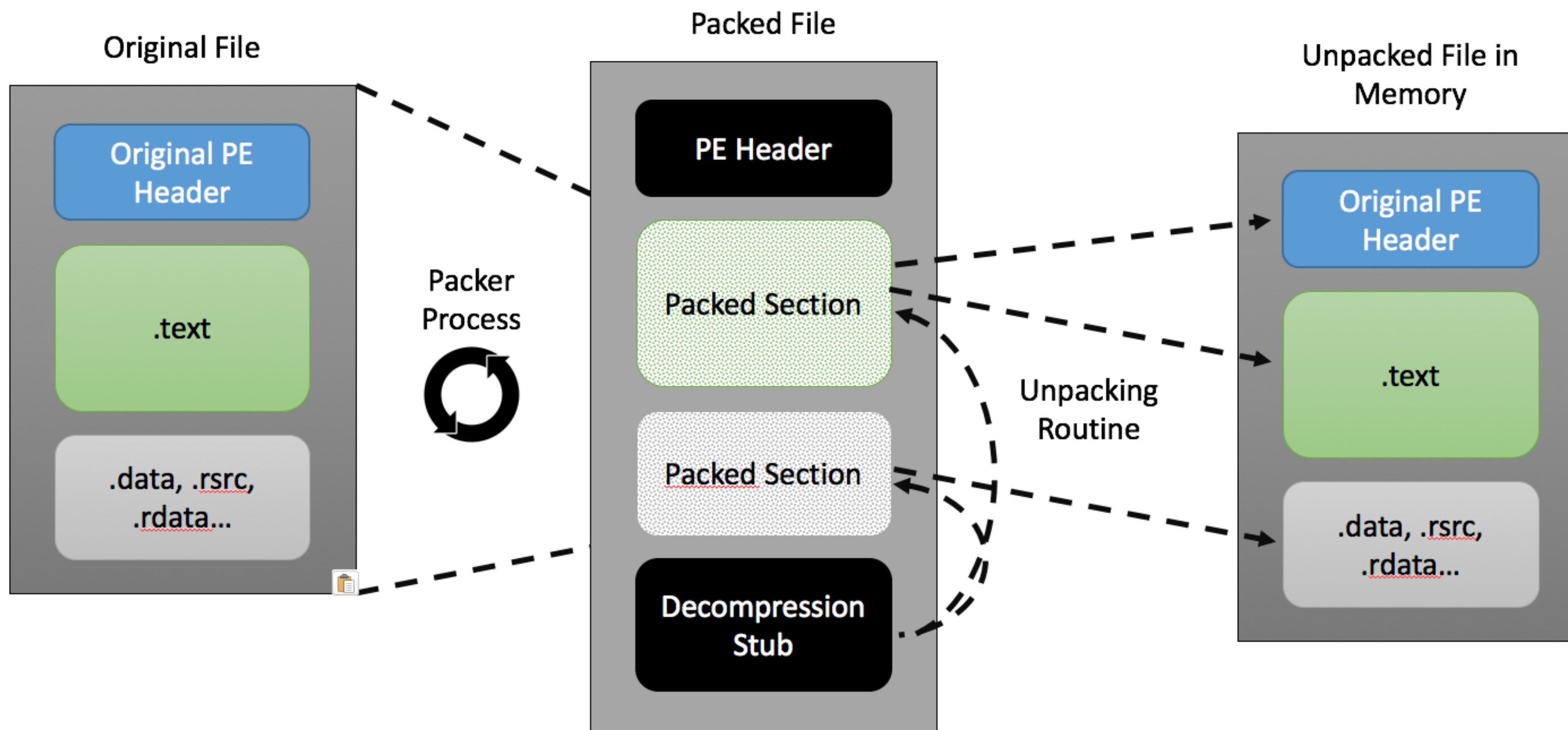
- Packing

# Packing

**Packing:** technique to hide the real code of a program through one or more layers of compression/encryption

At run-time the unpacking routine restores the original code in memory and then executes it

# Packing





**IDA**  
**Pro**



**GHIORRA**

A software reverse engineering (SRE) suite of tools developed by NSA's Research Directorate in support of the Cybersecurity mission

# **Automated Security Testing**

**CS155 Computer and Network Security**

**Stanford University**