

Abstraction Recovery for Scalable Static Binary Analysis

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The Gap Between Binary and Source Code

```
push    %ebp
mov     %esp,%ebp
sub     $0x10,%esp
movl    $0x1,-0x4(%ebp)
jmp     1d <f+0x1d>
mov     -0x4(%ebp),%eax
imul    0x8(%ebp),%eax
mov     %eax,-0x4(%ebp)
subl    $0x1,0x8(%ebp)
cmpl    $0x1,0x8(%ebp)
jg      f <f+0xf>
mov     -0x4(%ebp),%eax
leave
ret
```

Functions

Types

Variables

Control Flow

```
int f(int c) {
    int accum = 1;
    for (; c > 1; c--) {
        accum = accum * c;
    }
    return accum;
}
```



Static Binary Analysis

Automatic extraction of
facts about binary
programs without
executing them



Static Binary Analysis Strengths

- **High Coverage**
 - Reason about most or all possible executions
- **Safe**
 - Does not execute (possibly unsafe) code
- **Widely Applicable**
 - Source code not needed
 - Useful for end-users, researchers, sysadmins



Primary Challenge: Scalability



Largest Program

Static Binary Code
Analysis Tools



Largest
Program

Static Source Code
Analysis Tools



The Gap Between Binary and Source Code

```
push    %ebp
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jg      f <f+0xf>
mov     -0x4(%ebp),%eax
leave
ret
```

Functions

Types

Variables

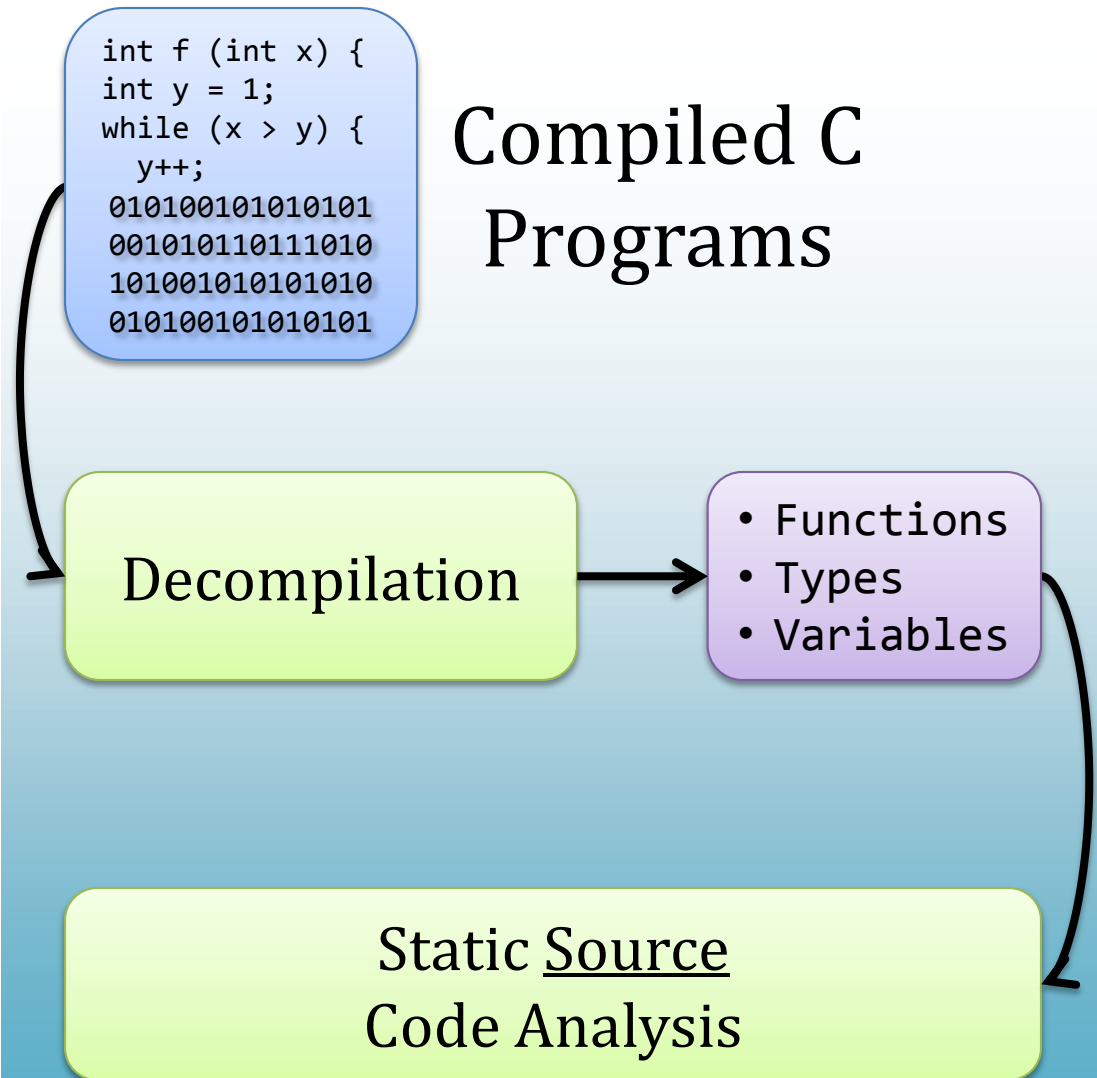
Control
Flow

```
int f(int c) {
    int accum = 1;
    for (; c > 1; c--) {
        accum = accum * c;
    }
    return accum;
}
```



Abstraction Recovery

1. Choose abstractions
2. Recover abstractions
3. Scalable, high-level reasoning



Reverse Engineering

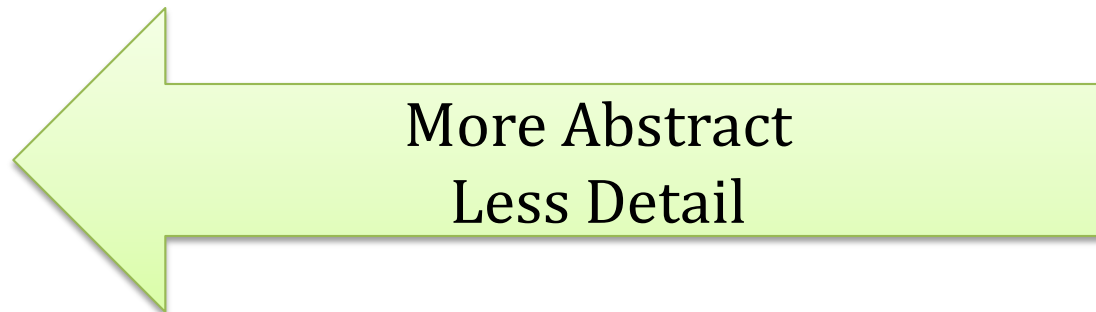
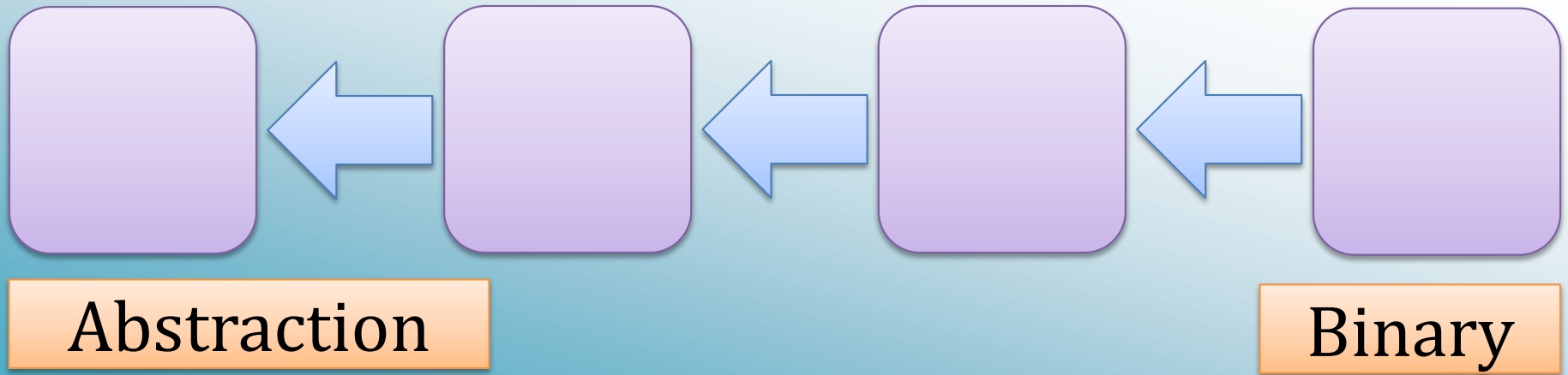
“Reverse engineering is the process of analyzing a subject system to create representations of the system at a higher level of abstraction.”

Chikofsky and Cross

Software Reuse and Reverse Engineering in Practice



Reverse Engineering



Abstraction Recovery

1. Choose
abstractions

2. Recover
abstractions

3. Scalable, high-
level reasoning

```
int f (int x) {  
  int y = 1;  
  while (x > y) {  
    y++;  
    010100101010101  
    0010101101111010  
    101001010101010  
    010100101010101
```

Compiled C
Programs

Decompilation

- Functions
- Types
- Variables

Reverse Engineering

Static Source
Code Analysis

Outline

- Introduction
- Recovering Abstractions
 - C abstractions (Phoenix Decompiler)
 - Gadget abstractions (Q ROP Compiler)
- Future Work and Conclusions



```
int f (int x) {  
  int y = 1;  
  while (x > y) {  
    y++;  
  }
```

```
  return y;  
}
```

Original
Source

Compiler

Decompiler

```
int f (int a) {  
  int v = 1;  
  while (a > v++)  
  {}
```

```
  return v;  
}
```

Recovered
Source

```
010100101010101  
001010110111010  
101001010101010  
101111100010100  
010101101001010  
100010010101101  
010101011010111
```

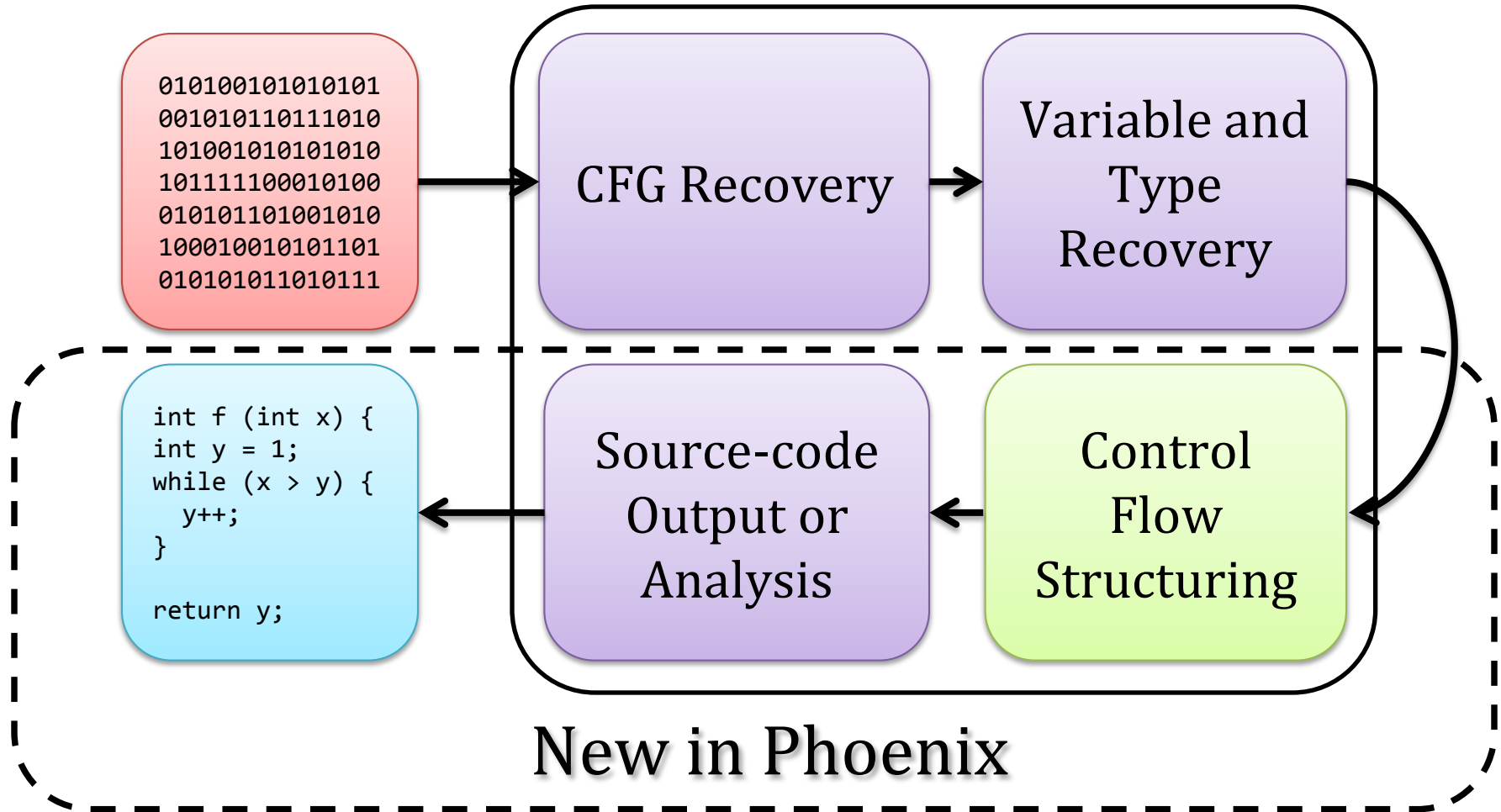
Compiled
Binary

The Phoenix Decompiler

- Designed for abstraction recovery
 - Correctness (new)
 - Prior work: focus on manual reverse engineering
 - Effective abstraction recovery
- Design: series of stages
 - Each stage recovers a different abstraction
 - Some are new; some are not



Phoenix Overview



Control Flow Structuring

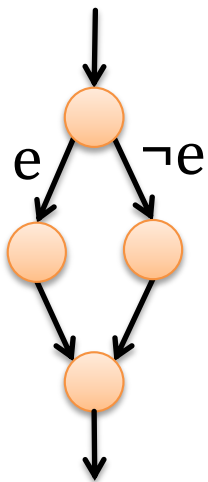
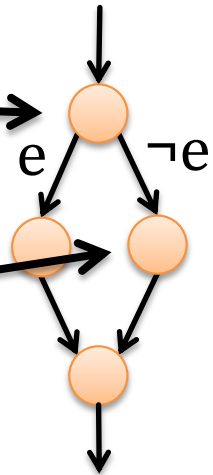
if (e)

{...; }

else

{...; }

Compilation



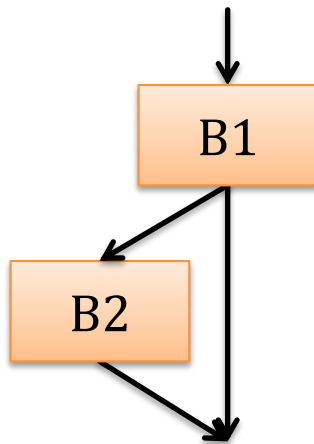
Control Flow Structuring

if (e)
{...; }
else
{...; }

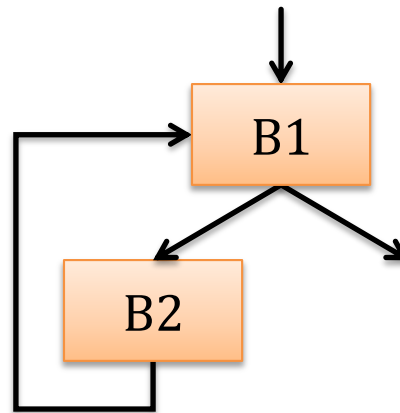


Structural Analysis

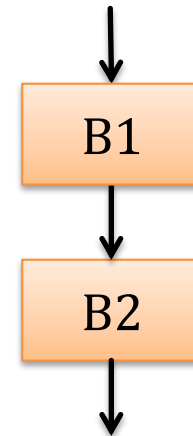
- Iteratively match patterns to CFG
 - Collapse matching regions



If-then

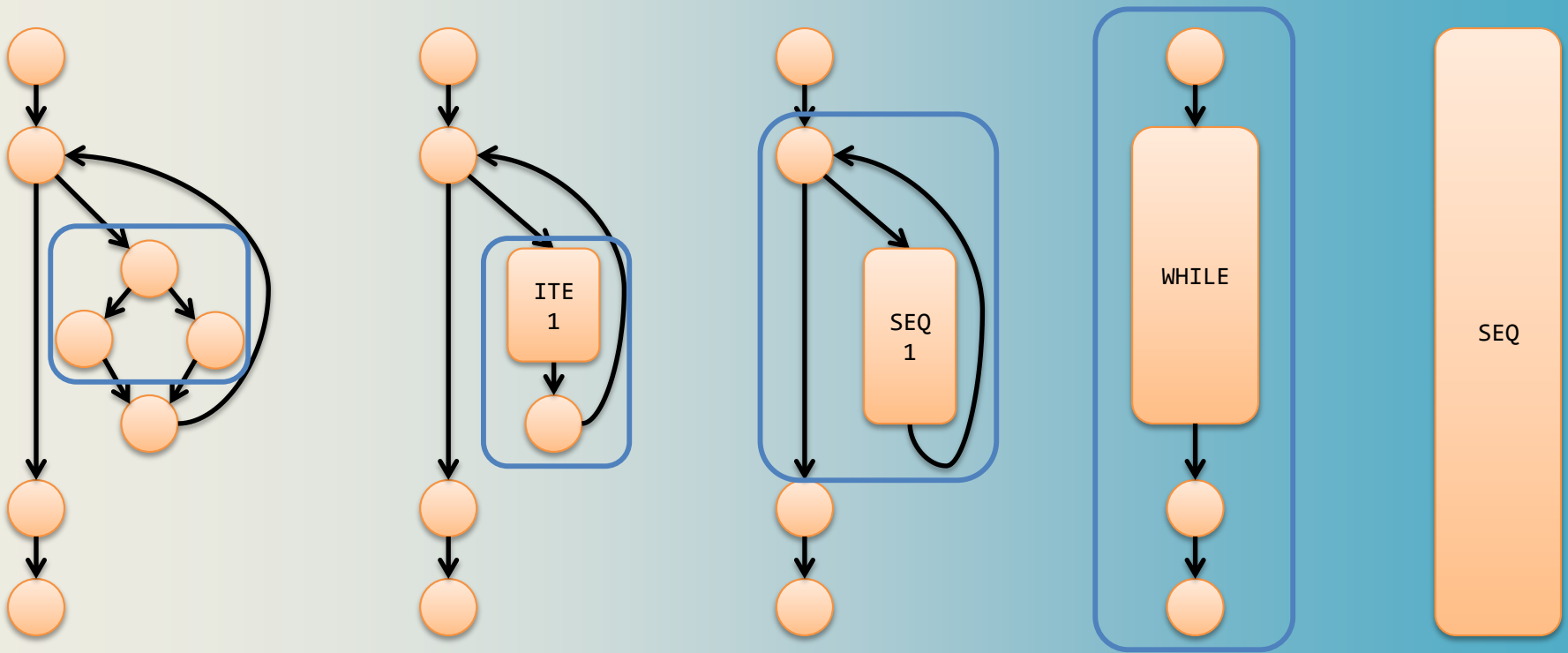


While



Sequence

Structural Analysis Example



```
...;  
while (...) { if (...) {...} else {...} };  
...; ...;
```



Structural Analysis Property Checklist

1. Correctness



Structural Analysis Property Checklist

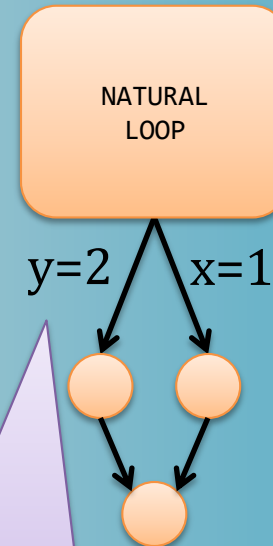
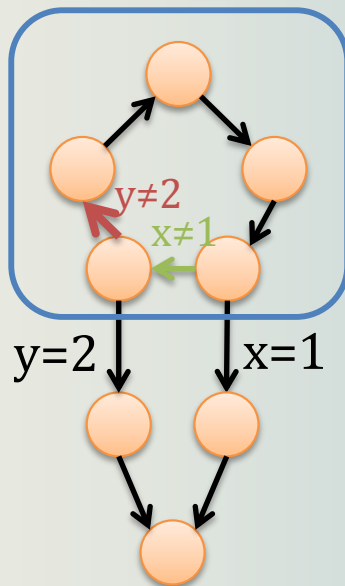
~~1. Correctness~~

- Not originally intended for decompilation
- Structure can be incorrect for decompilation



Semantics Preservation

- Reductions preserve meaning of program



Non-determinism



Structural Analysis Property Checklist

~~1. Correctness~~

- ~~– Not originally intended for decompilation~~
- ~~– Structure can be incorrect for decompilation~~

2. Effective abstraction recovery



Structural Analysis Property Checklist

~~1. Correctness~~

- Not originally intended for decompilation
- Structure can be incorrect for decompilation

~~2. Effective abstraction recovery~~

- Graceless failures for unstructured programs
 - break, continue, and gotos
 - Failures cascade to large subgraphs



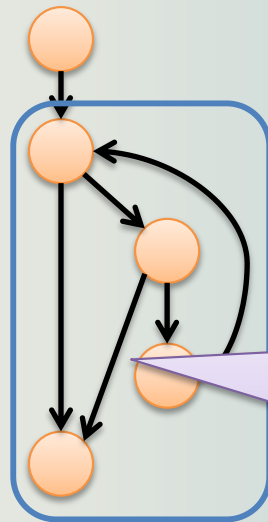
Unrecovered Structure

```
s1;  
while (e1) {  
    if (e2) { break; }  
    s2;  
}  
s3;
```

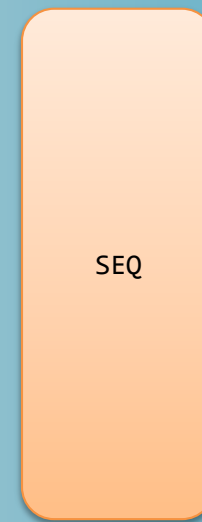
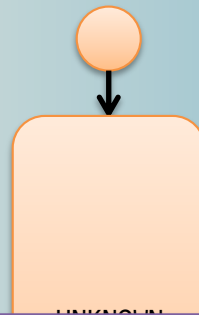
Original

```
s1;  
L1: if (e1) { goto L2; }  
    else { goto L4; }  
L2: if (e2) { goto L4; }  
L3: s2; goto L1;  
L4: s3;
```

Decompiled



This break edge prevents progress



Iterative Refinement

- Remove edges that are preventing a match
 - Represent in decompiled source as break, goto, continue
 - Run on remaining graph

Allows structuring algorithm to make more progress



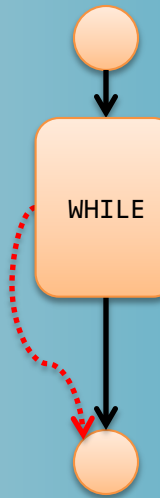
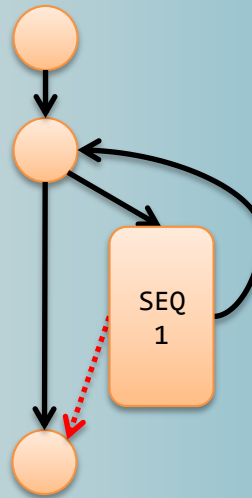
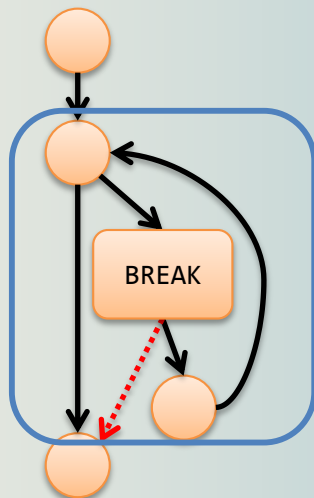
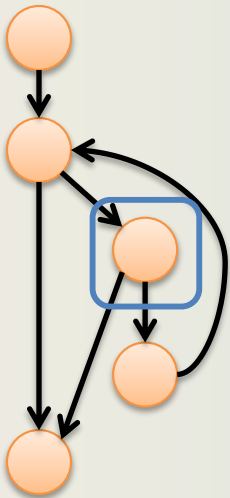
Iterative Refinement

```
s1;  
while (e1) {  
    if (e2) { break; }  
    s2;  
}  
s3;
```

Original

```
s1;  
while (e1) {  
    if (e2) { break; }  
    s2;  
}  
s3;
```

Decompiled



Large Scale Experiment Details

- How does Phoenix compare with state of the art?
- Measure impact of:
 - Semantics preservation
 - Iterative refinement
- Other decompilers
 - Hex-Rays (industry state of the art)
 - Boomerang (academic state of the art)



Large Scale Experiment Details

- How does Phoenix compare with state of the art?
- Measure impact of:
 - Semantics preservation
 - Iterative refinement
- Other decompilers
 - Hex-Rays (industry state of the art)
 - ~~Boomerang (academic state of the art)~~
 - Did not terminate in <1 hour for most programs

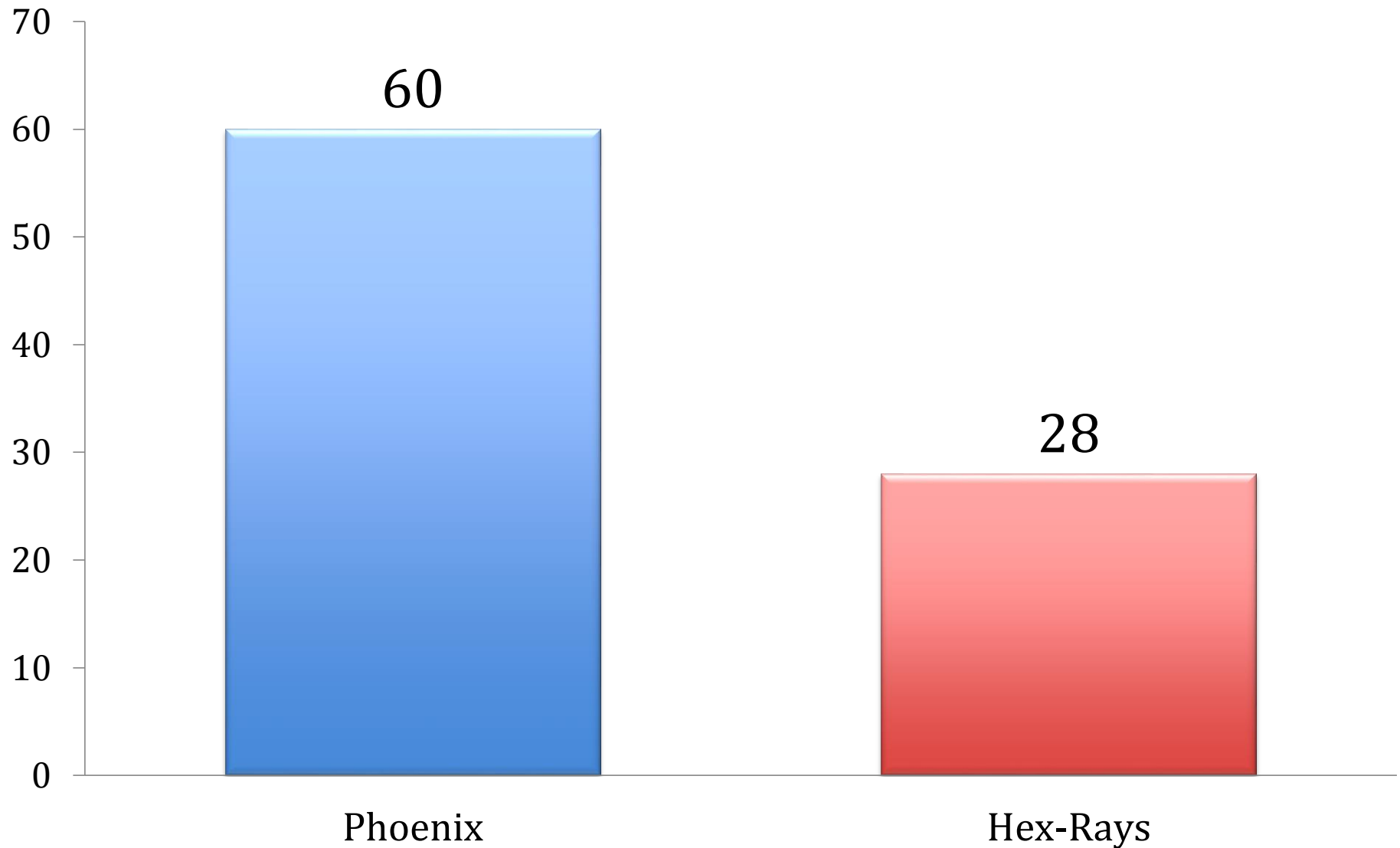


Large Scale Experiment Details

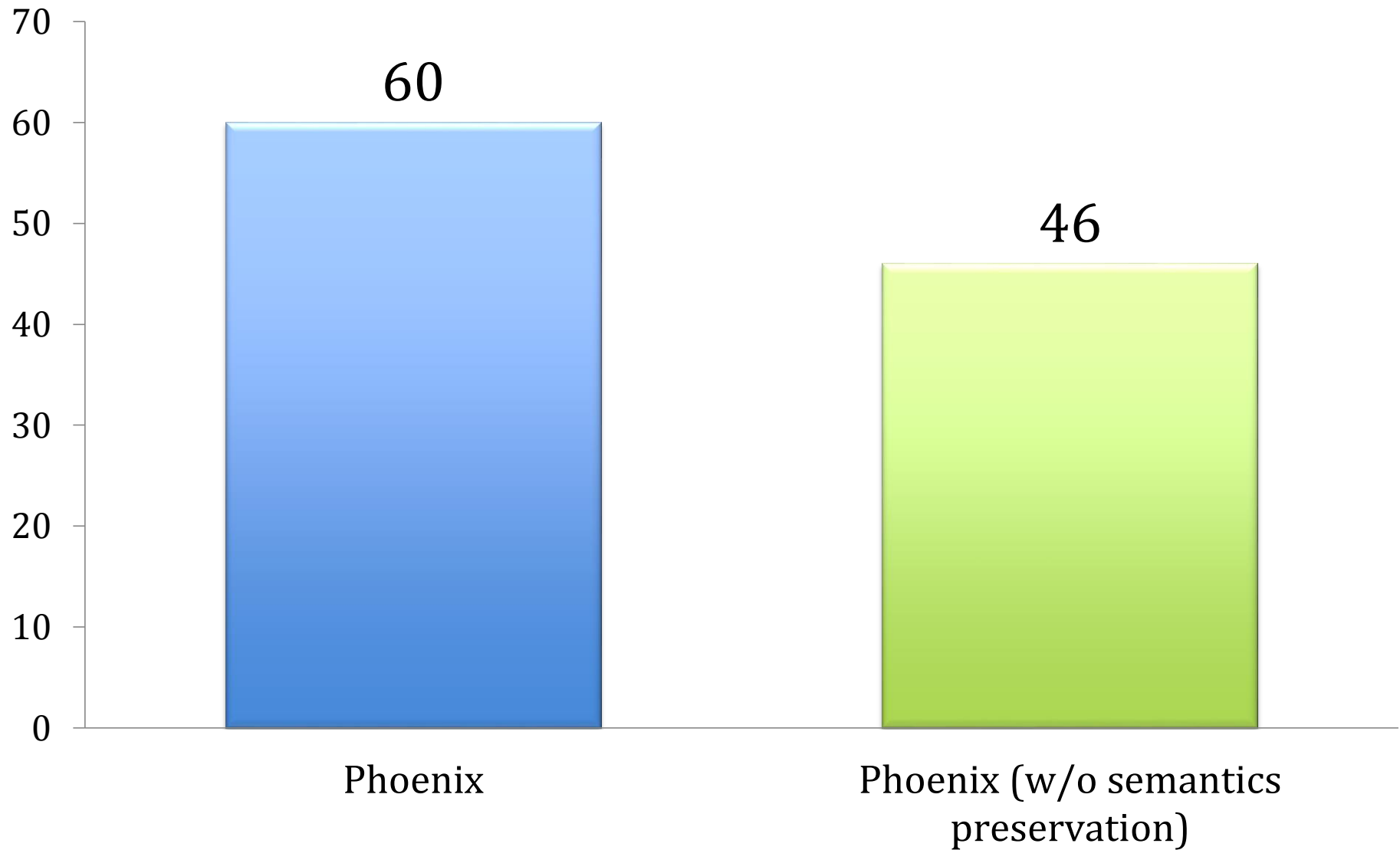
- GNU coreutils 8.17, compiled with gcc
 - Programs of varying complexity
 - Test suite
- Metrics
 - Correctness
 - Number of decompiled utilities that pass unit tests
 - Has not been done before on large scale!
 - Control-flow structure recovery
 - Count number of goto statements



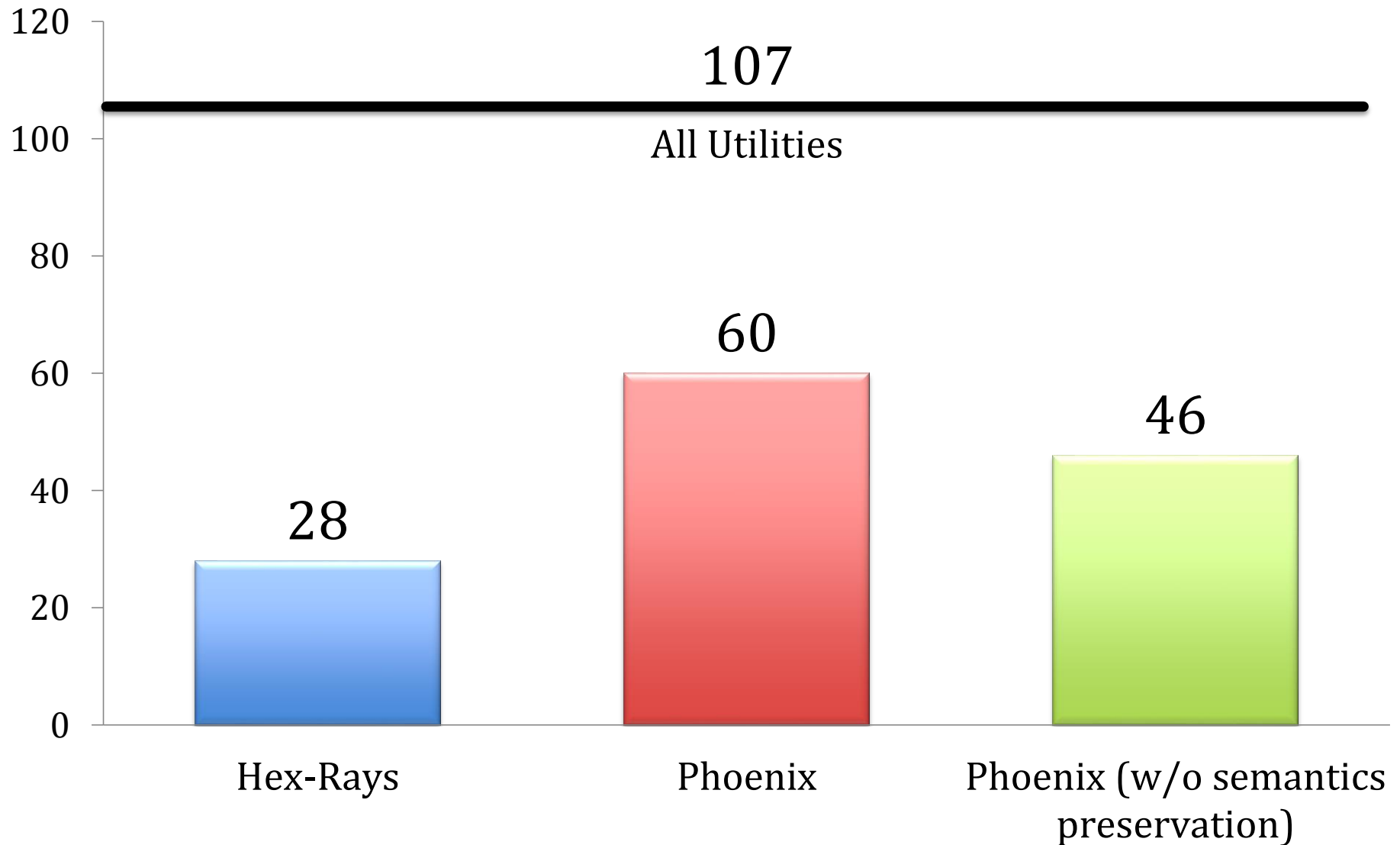
Number of Correct Utilities



Number of Correct Utilities



Number of Correct Utilities

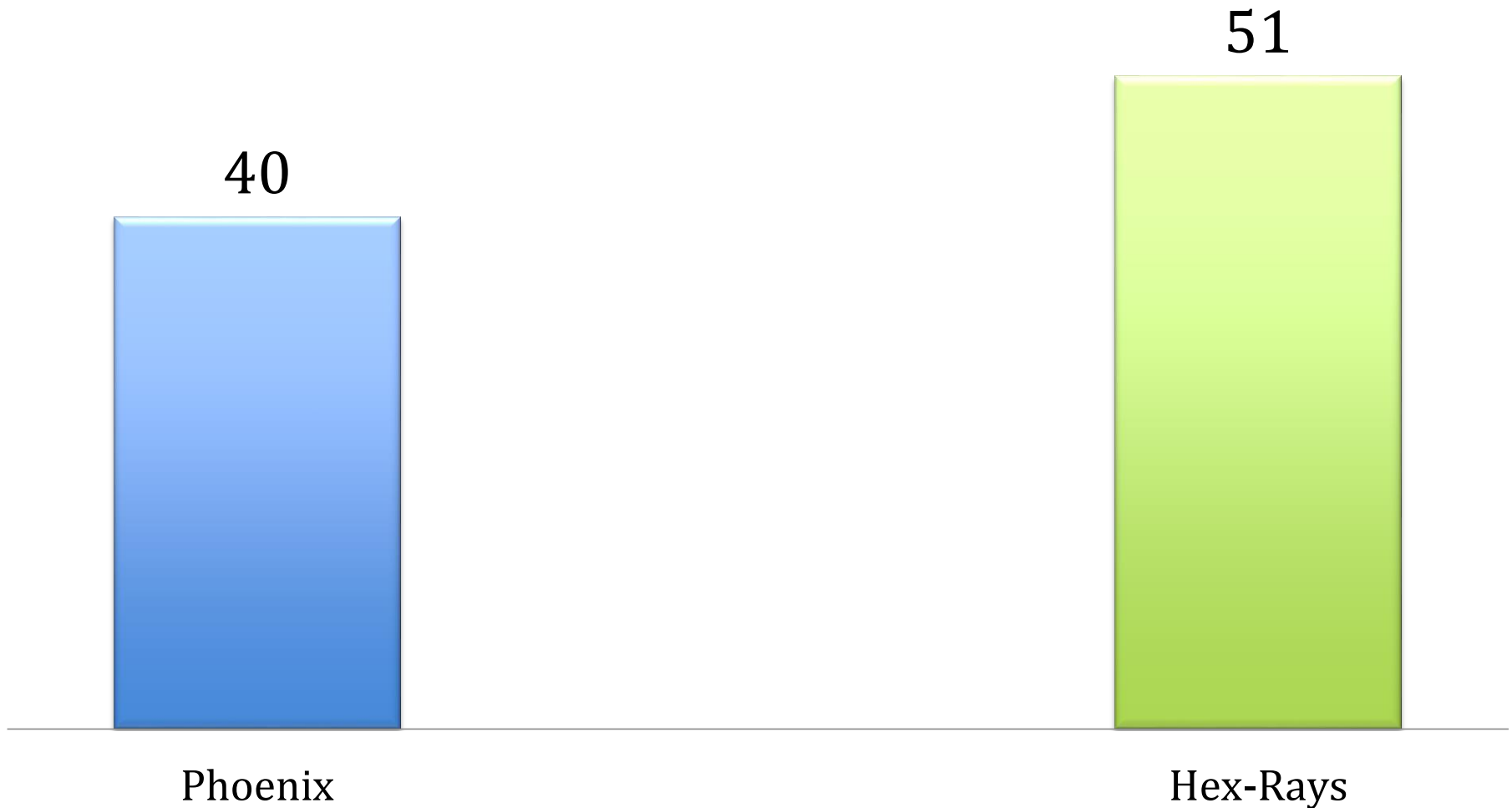


Correctness

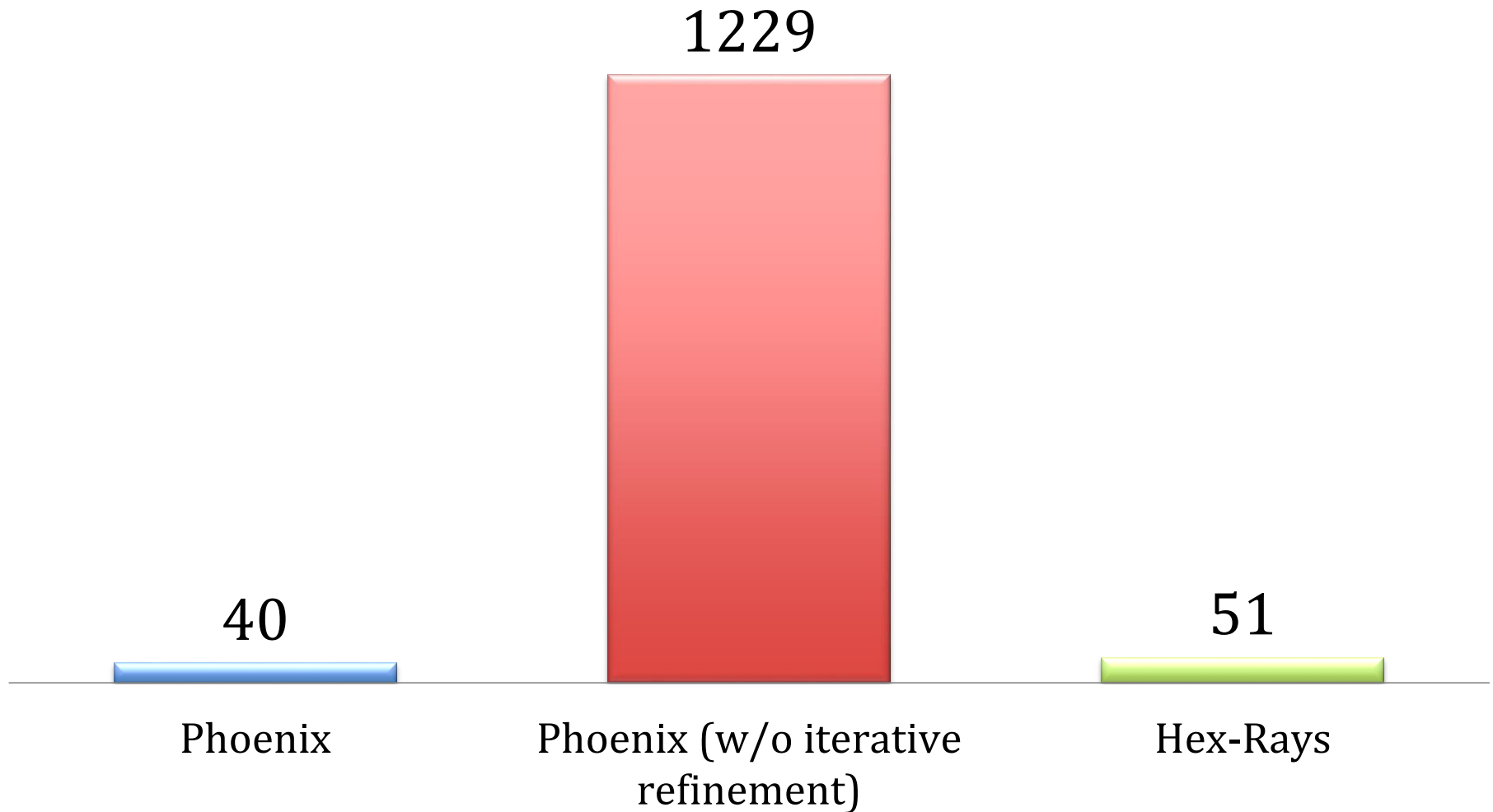
- Any incorrect abstraction can cause incorrect decompilation
 - Hex Rays
 - ?
 - Phoenix
 - All (known) correctness errors attributed to type recovery
 - Undiscovered variables
 - No known problems in control flow structuring



Control Flow Structure: Gotos Emitted (Fewer is Better)



Control Flow Structure: Gotos Emitted (Fewer is Better)



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- Future Work and Conclusions



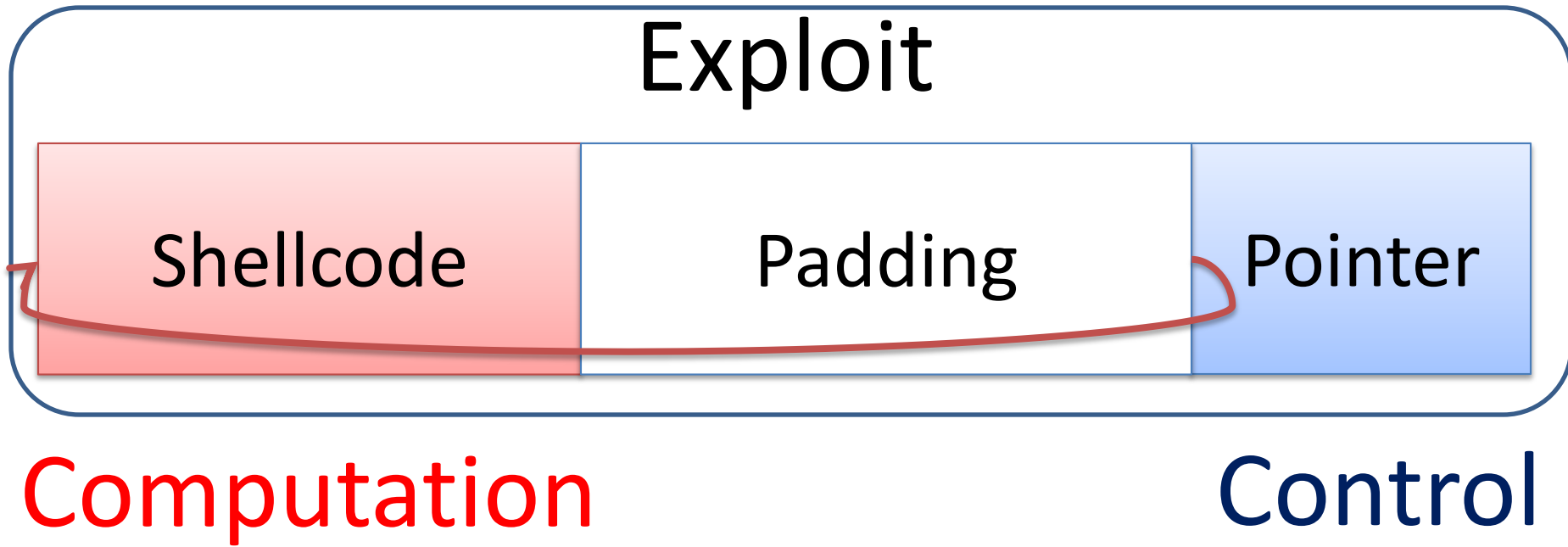
OS Defenses



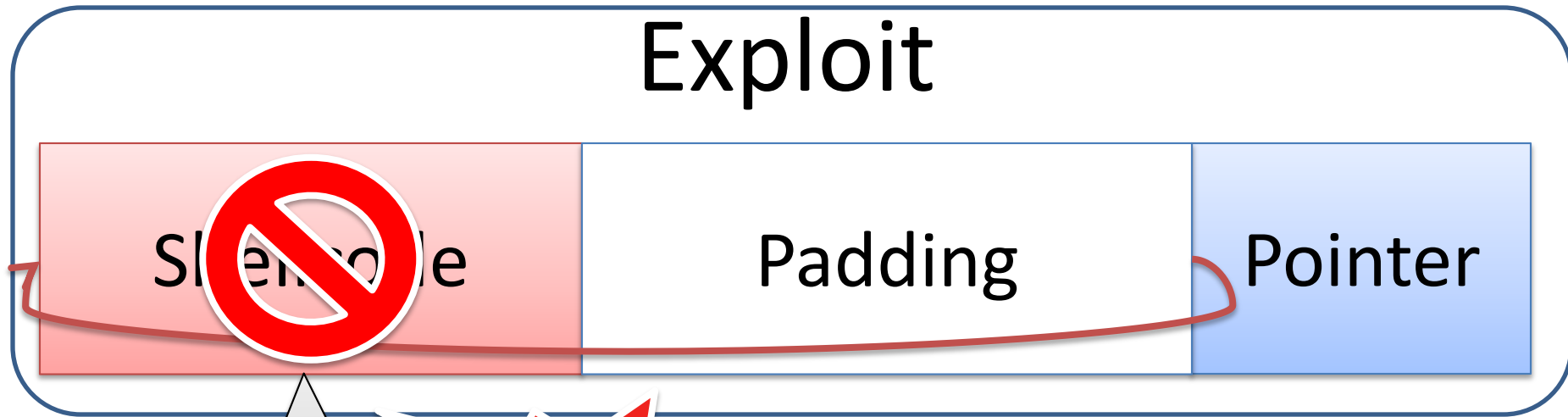
- All major operating systems employ defenses
 - DEP: Data Execution Prevention
 - ASLR: Address Space Layout Randomization
- Make reliable exploitation difficult
 - How difficult?



Simple Control-Flow Hijack Exploit



Data Execution Prevention (DEP)



Crash

User input is
non-executable

cannot be writable
and executable



Bypassing DEP

- Goal: Specify exploit computation even when DEP is enabled
- Return-oriented Programming
[Shacham 2007]
 - Use existing instructions from program it to create self-contained gadgets
 - Chain gadgets together to encode computation

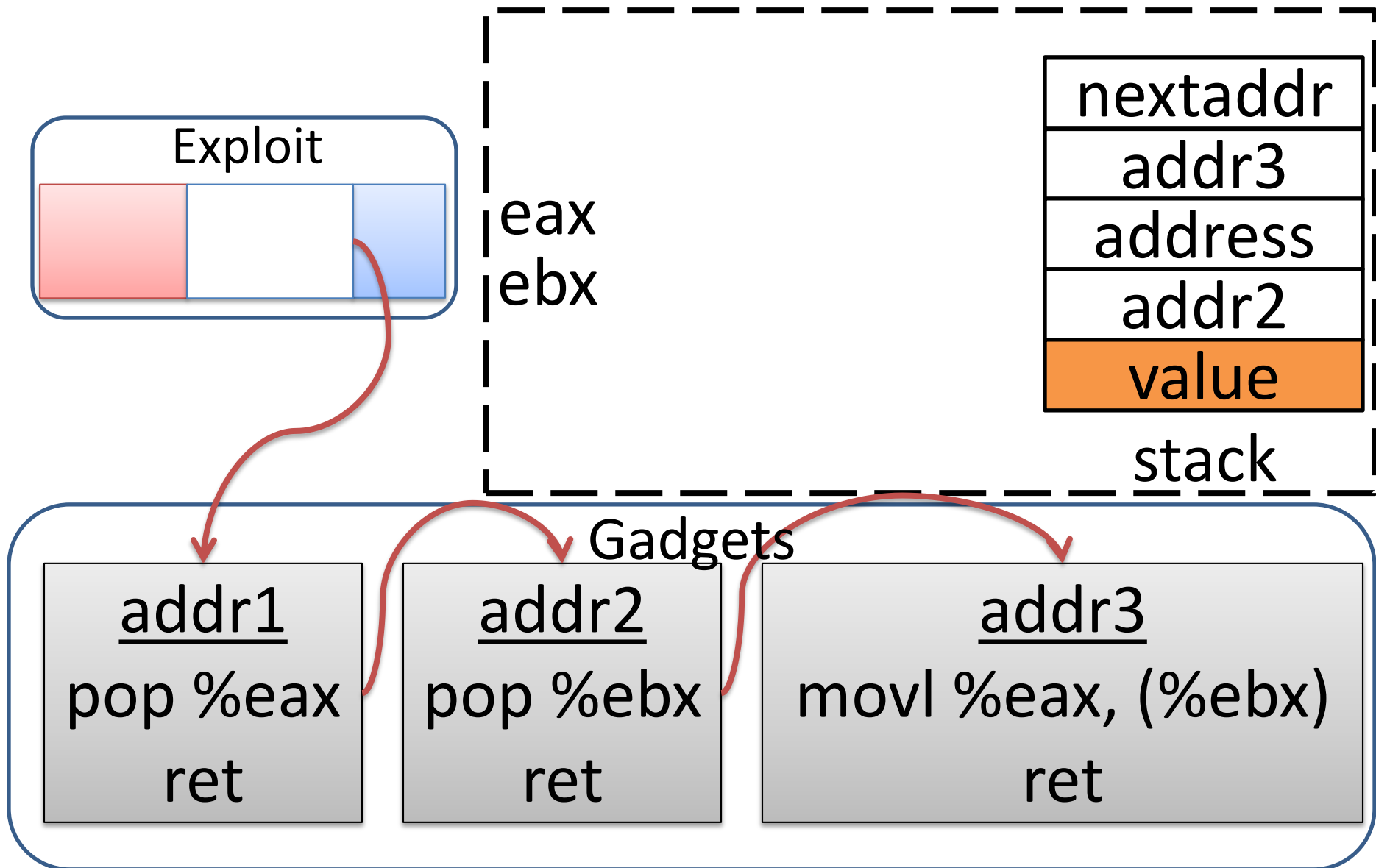


Return-oriented Programming

Example: How can we write to memory without shellcode?



Return-oriented Programming



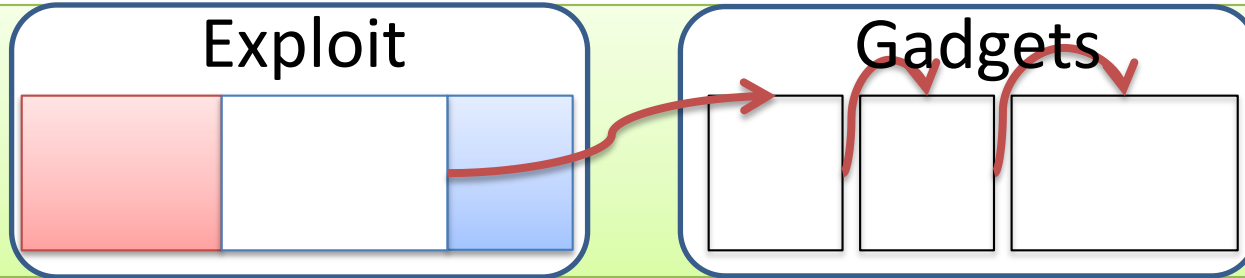
Gadgets as Abstractions

- Gadgets are behavior specifications
 - Load constant
 - Store to memory
 - Don't need to reason about low-level behavior to combine them



Address Space Layout Randomization (ASLR)

ASLR disabled



ASLR enabled



ASLR: Addresses are unpredictable

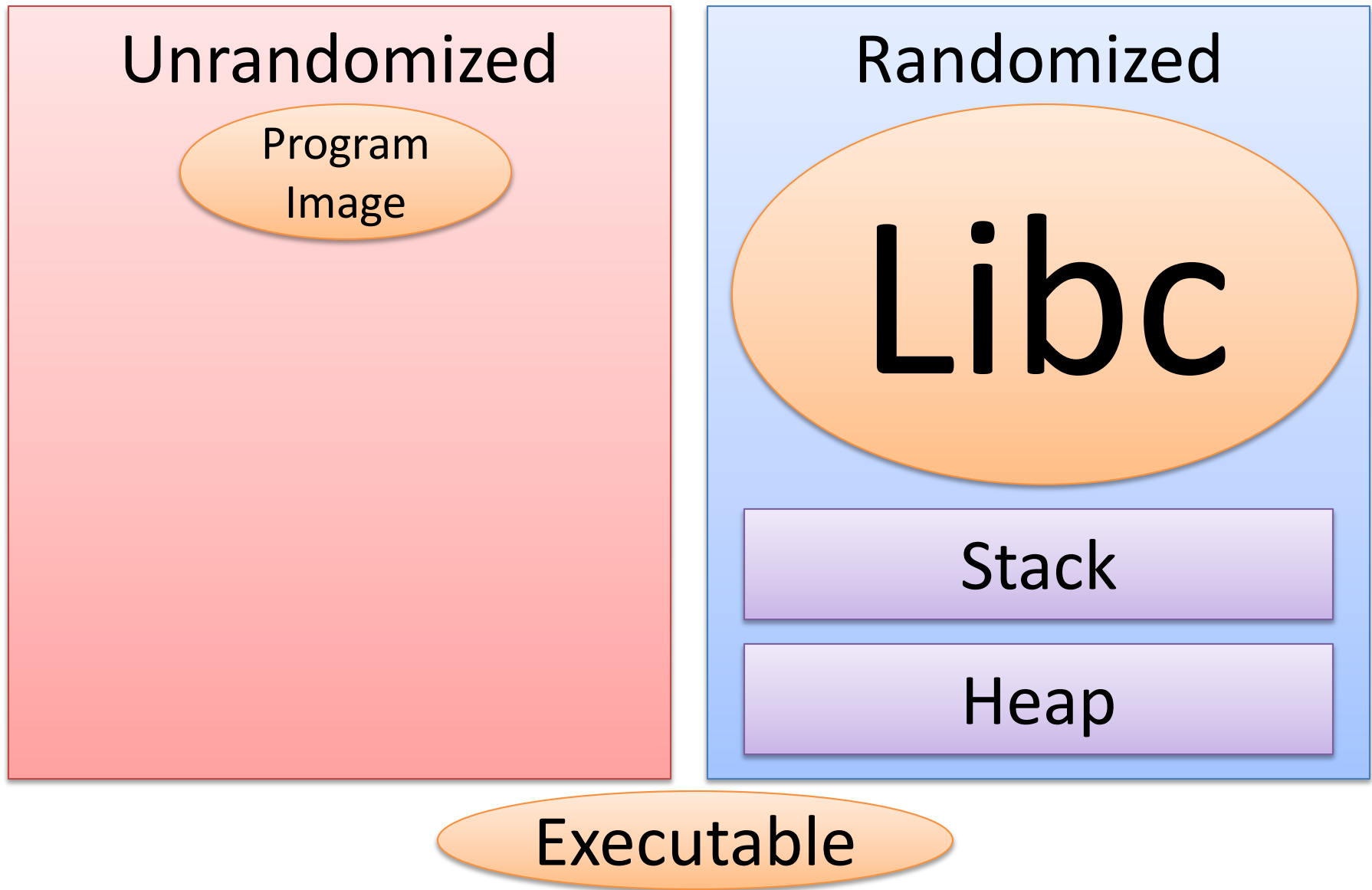


Return-oriented Programming + ASLR

- Randomized code can't be used for ROP
- But ASLR implementations do not randomize all code...



(Typical) Randomized Code in Linux



Modern Exploitation using ROP

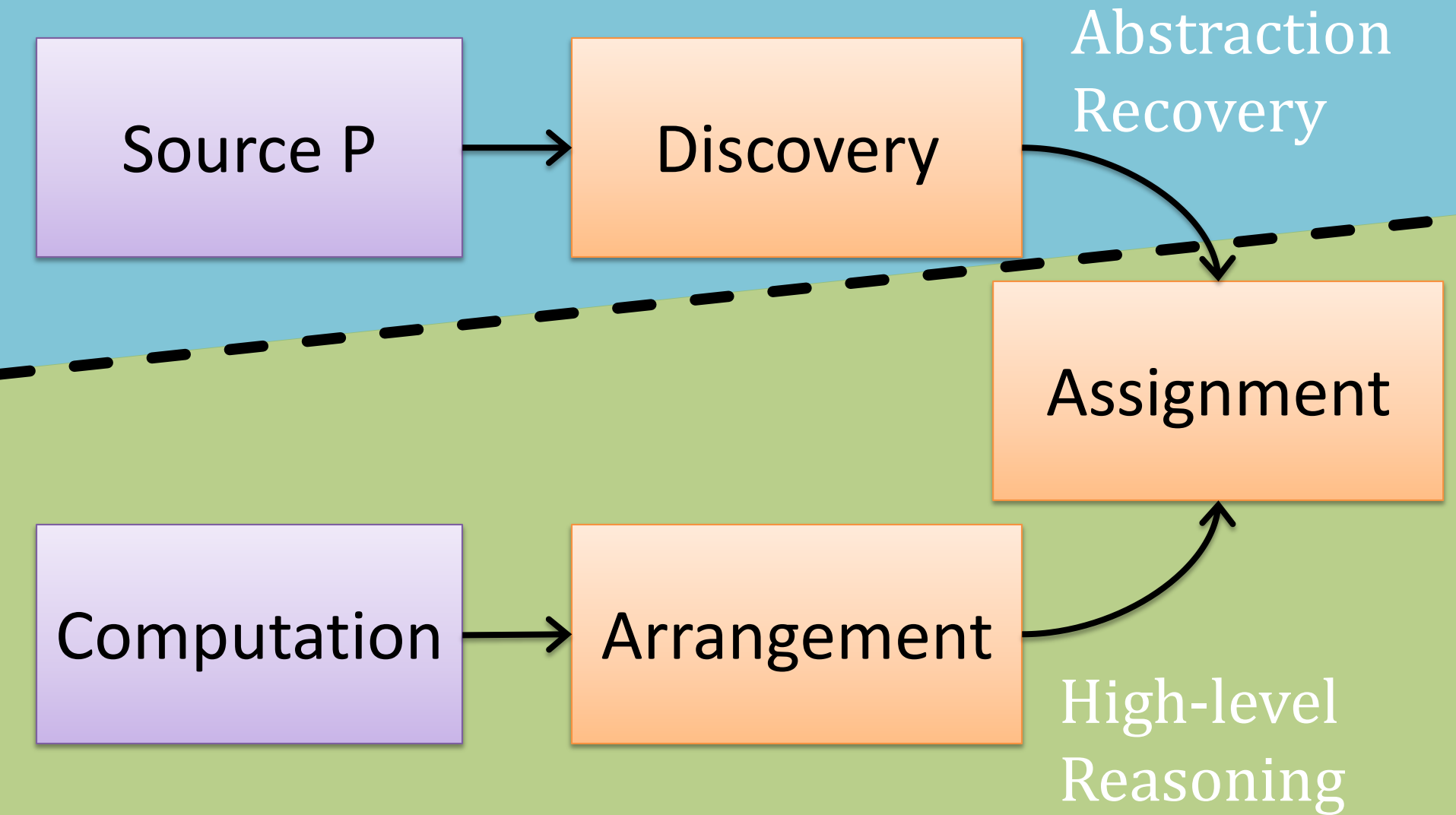
- Program image is often the only unrandomized code
 - Small
 - Program-specific
- How much unrandomized code does an attacker need to use ROP?

~~We need a graduate student with a lot of free time~~
We need automatic ROP techniques that can work
with the program image

Q: Automatic ROP System



Q: ROP Overview



Gadget Discovery

- Discovery: Does instruction sequence do something we can use for our computation?
- Fast randomized test for every program location (thousands or millions)

```
sbb %eax, %eax;  
neg %eax; ret
```



Randomized Testing

Before

EAX 0x0298a7bc

CF 0x1

ESP 0x81e4f104

```
sbb %eax, %eax;  
neg %eax; ret
```

After

EAX 0x1

ESP 0x81e4f108

EBX 0x0298a7bc

OutReg <- InReg

Semantic
Definition
For Move



Q's Semantic Definitions/ Gadget Types

Gadget Type	Semantic Definition	Real World Example
MoveRegG	$\text{Out} \leftarrow \text{In}$	<code>xchg %eax, %ebp; ret</code>
LoadConstG	$\text{Out} \leftarrow \text{Constant}$	<code>pop %ebp; ret</code>
ArithmeticG	$\text{Out} \leftarrow \text{In1} + \text{In2}$	<code>add %edx, %eax; ret</code>
LoadMemG	$\text{Out} \leftarrow \text{M}[\text{Addr} + \text{Offset}]$	<code>movl 0x60(%eax), %eax; ret</code>
StoreMemG	$\text{M}[\text{Addr} + \text{Offset}] \leftarrow \text{In}$	<code>mov %dl, 0x13(%eax); ret</code>
ArithmeticLoadG	$\text{Out} \leftarrow \text{M}[\text{Addr} + \text{Offset}]$	<code>add 0x1376dbe4(%ebx), %ecx; (...); ret</code>
ArithmeticStoreG	$\text{M}[\text{Addr} + \text{Offset}] \leftarrow \text{In}$	<code>add %al, 0x5de474c0(%ebp); ret</code>



Randomized Testing

- Randomized testing quickly rules out non-gadgets
 - Fast
 - Enables more expensive second stage
- Second stage: program verification



Connection to Program Verification

```
sum = 0
while (n > 0) {
  sum += n;
  n--;
}
```

$$\text{sum} = \sum_{i=0}^n i$$

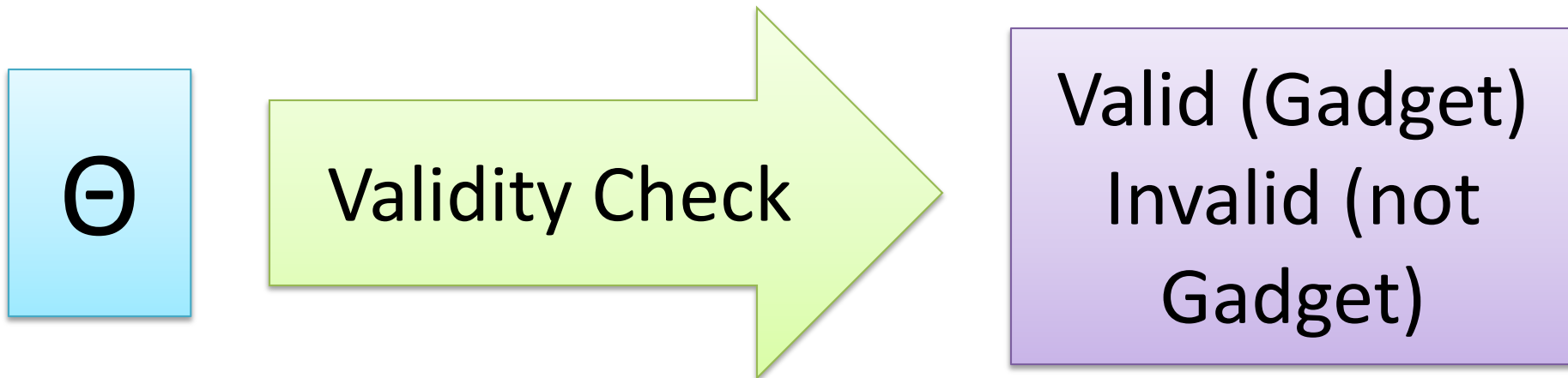
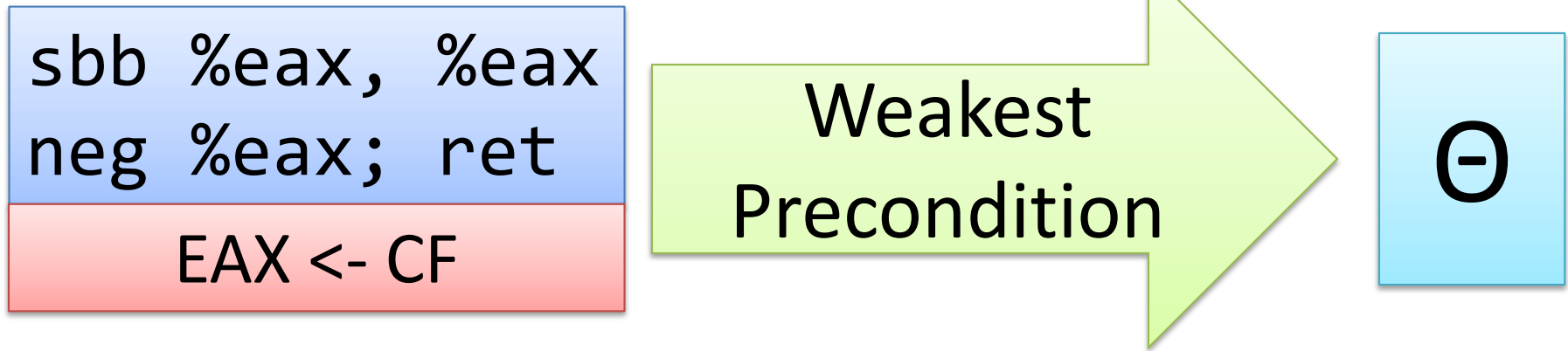
```
sbb %eax, %eax
neg %eax; ret
```

EAX <- CF

Does the post-condition always hold after executing program?



Gadget Verification



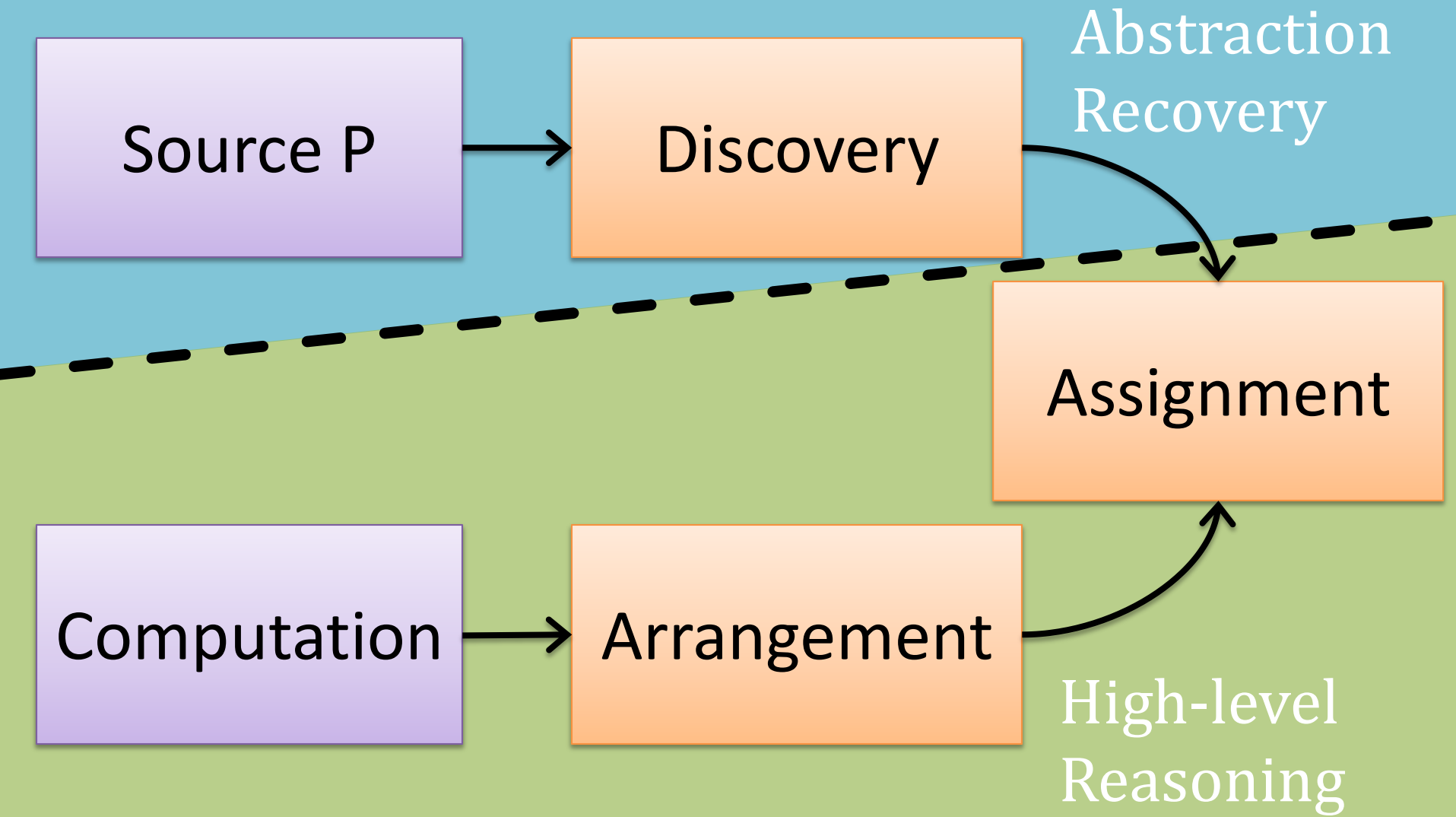
Semantic-based Gadget Discovery

- Q is better at finding gadgets than I am!

<code>imul \$1, %eax, %ebx ret</code>	Move %eax to %ebx
<code>lea (%ebx,%ecx,1), %eax ret</code>	Store %ebx+%ecx in %eax
<code>sbb %eax, %eax; neg %eax ret</code>	Move carry flag to %eax



Q: ROP Overview



Research Questions

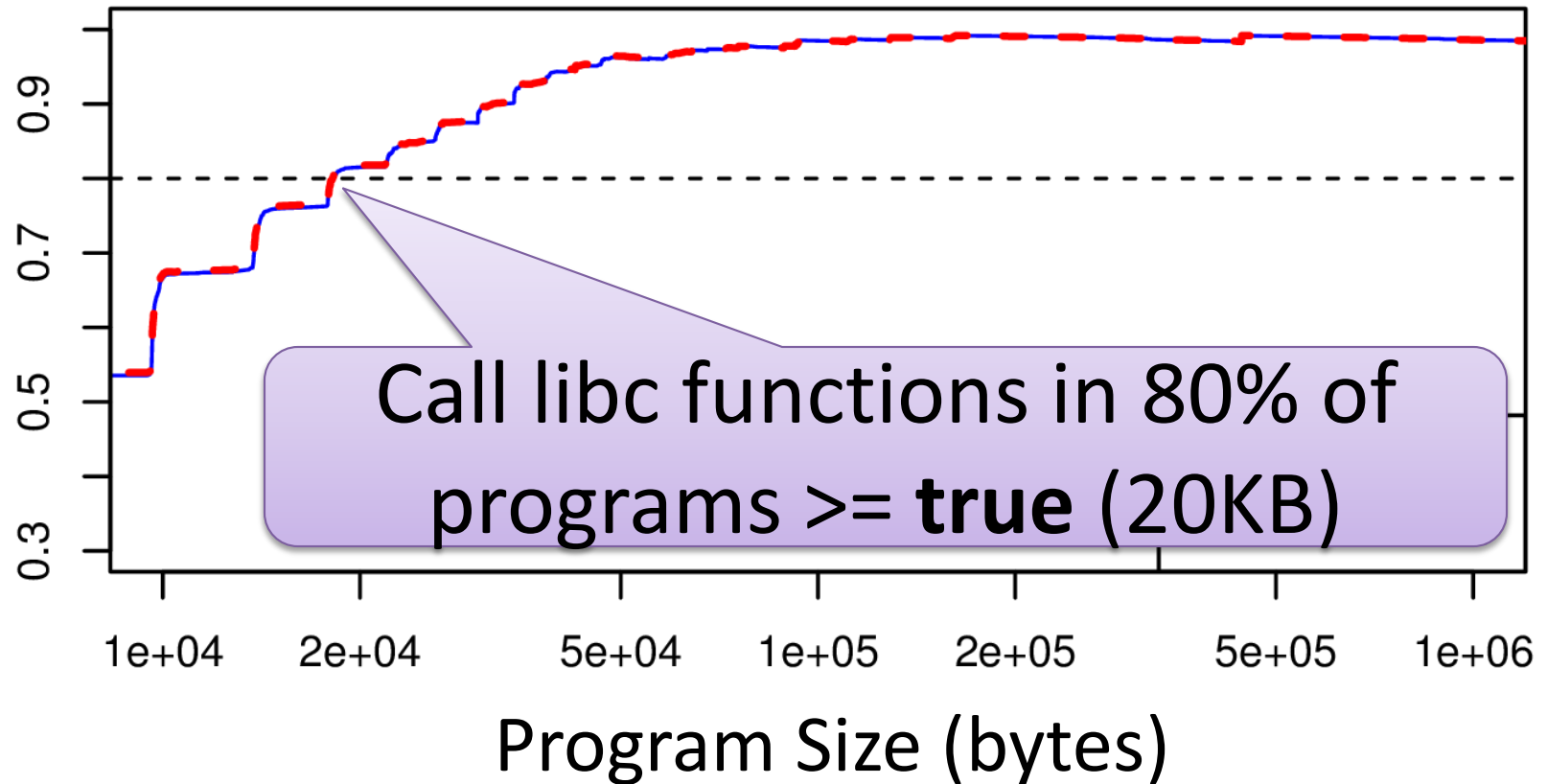
How much unrandomized code is sufficient to create ROP payloads?

- Detail: payloads call any functions in libc
 - system, execv, connect, mprotect



ROP Success Probability

Probability that attack works



Research Questions

Can Q automatically add ROP payloads to existing exploits for real programs?

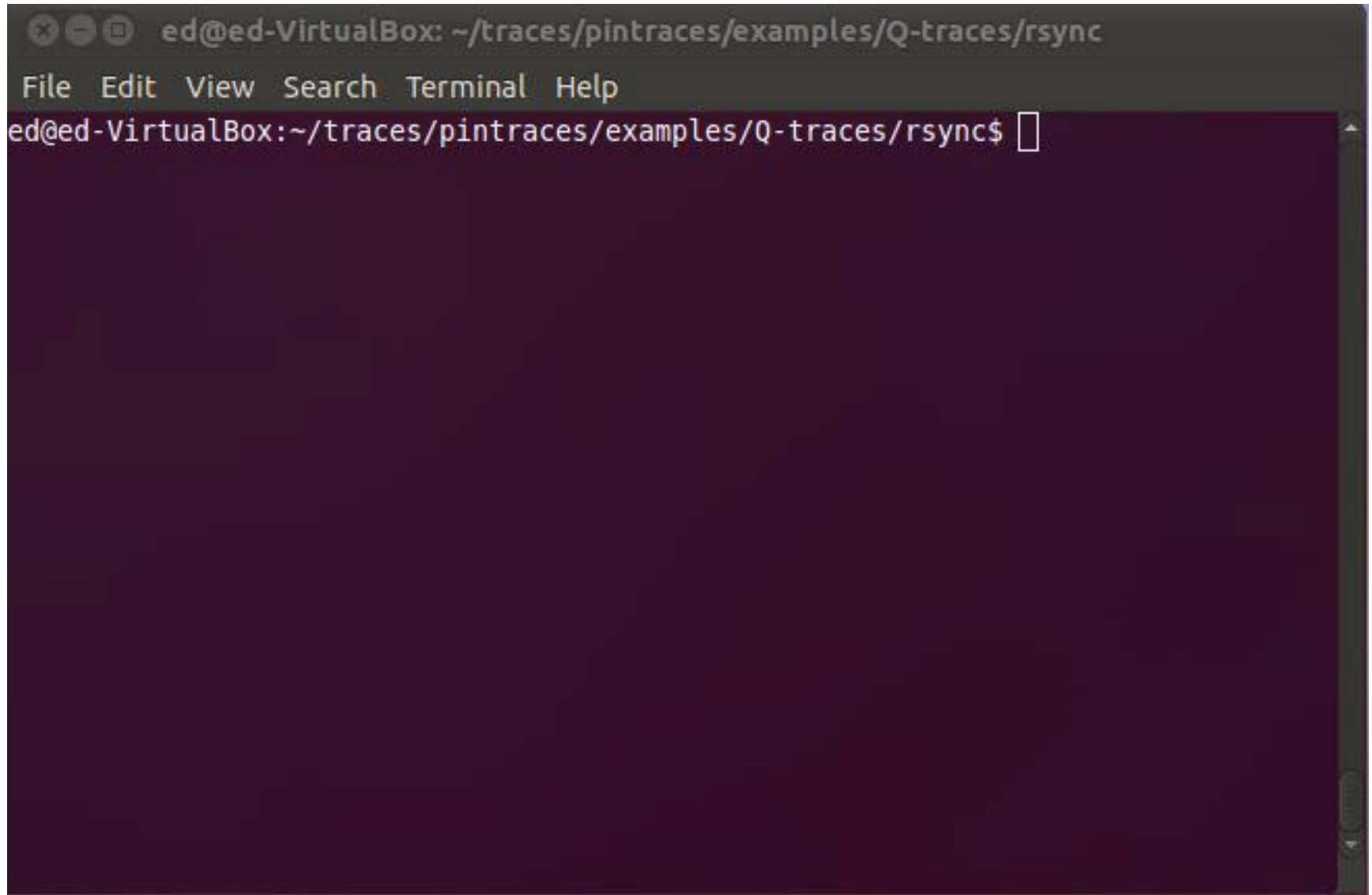


Real Exploits

- Q was able to automatically add ROP to nine exploits downloaded from exploit-db.com

Name	Total Time	OS
Free CD to MP3 Converter	130s	Windows 7
Fatplayer	133s	Windows 7
A-PDF Converter	378s	Windows 7
A-PDF Converter (SEH exploit)	357s	Windows 7
MP3 CD Converter Pro	158s	Windows 7
rsync	65s	Linux
opendchub	225s	Linux
gv	237s	Linux
Proftpd	44s	Linux

Demo!

A screenshot of a terminal window within a virtual machine. The title bar at the top reads "ed@ed-VirtualBox: ~/traces/pintraces/examples/Q-traces/rsync". Below the title bar is a menu bar with the options "File", "Edit", "View", "Search", "Terminal", and "Help". The main area of the terminal shows the command prompt "ed@ed-VirtualBox:~/traces/pintraces/examples/Q-traces/rsync\$" followed by a white cursor box. The terminal background is dark purple.

```
ed@ed-VirtualBox: ~/traces/pintraces/examples/Q-traces/rsync
File Edit View Search Terminal Help
ed@ed-VirtualBox:~/traces/pintraces/examples/Q-traces/rsync$
```



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Abstraction Recovery Questions

- Systems: How do we build systems that
 - Recover abstractions?
 - Use abstractions?
- Theory: When is it possible to recover abstractions?
 - Observable behaviors preserved by compilation
- Scalability: How does recovering and utilizing abstractions improve scalability?
 - ROP (150x)
 - C verification (15x)



Future Work

- Certified decompilation
 - Prove that binary \rightarrow C translation is correct
- Optimal abstraction recovery
 - Provably optimal algorithms (i.e., minimum gotos)
- Additional abstractions & architectures
 - C++, ARM, Dalvik



Thanks to My Great Co-authors



Thanassis
Avgerinos



David
Brumley



JongHyup
Lee



Maverick
Woo



Conclusion

- Abstraction Recovery
 - Recovering abstractions helps static binary analysis
- Phoenix decompiler
 - Goal: Correct, effective decompilation
 - New control-flow structuring algorithm
- Q ROP Compiler
 - Takeaway: Unrandomized code is dangerous
 - 20KB makes DEP+ASLR ineffective



Thanks ☺

- Questions?

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