

Semi-automated Feature- Debloating of Binary Software*

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ONR TPCP Software Security Summer School (SSSS)

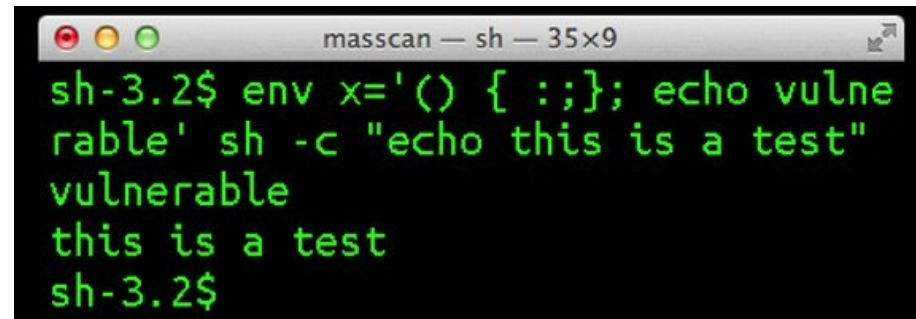
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Binary Control-flow Trimming

- **Objective:** Erase (“debloat”) unwanted/unneeded features in binary software without the aid of source code
- **Motivating Example:** Linux Bash + Shellshock

A terminal window titled 'masscan — sh — 35x9' showing a Shellshock exploit. The user enters the command 'sh-3.2\$ env x='() { :; }; echo vulnerable' sh -c "echo this is a test"'. The output is 'vulnerable' followed by 'this is a test' on a new line, and the prompt returns to 'sh-3.2\$'.

- Discovered September 2014
- Bash shells execute certain environment variable texts as code(!!)
- Allows attackers to remote-compromise most Linux systems
- Window of vulnerability: 25 years(!!)
- Probably NOT originally a bug!
 - introduced in 1989 to facilitate function-import into child shells
 - never clearly documented, eventually forgotten



Research Challenges

➤ Can we automatically erase unneeded (risky) functionalities from binary software?

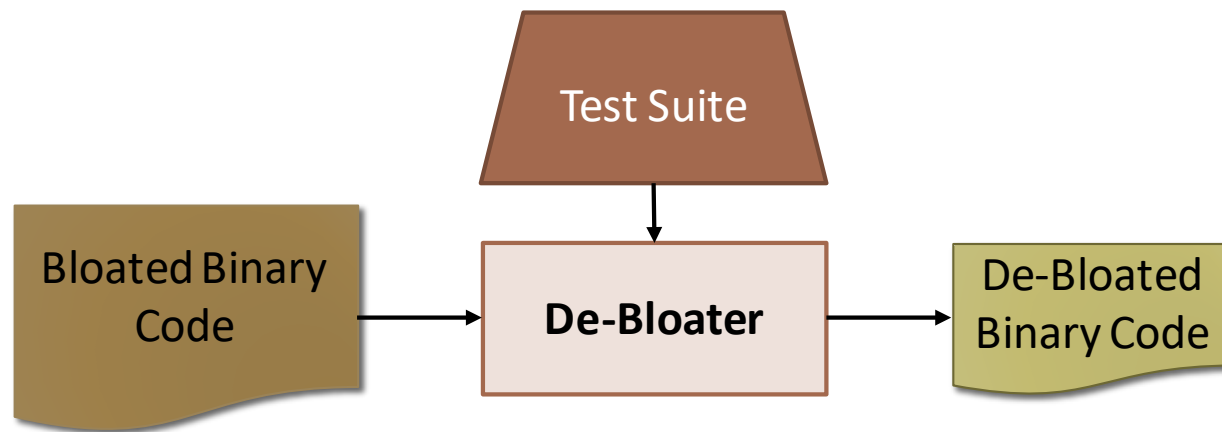
- Admins might not even know that the undesired functionality exists, and therefore *cannot necessarily demonstrate bugs/vulnerabilities*.
- Demonstration of desired functionalities will usually be incomplete.
 - large input spaces (e.g., unbounded streams of network packets)
- No assumptions about code design/provenance
 - arbitrary source languages
 - arbitrary compilation toolchains
 - simplifying assumption: not obfuscated (we can at least disassemble it)

➤ Can we do so without introducing significant inefficiencies?

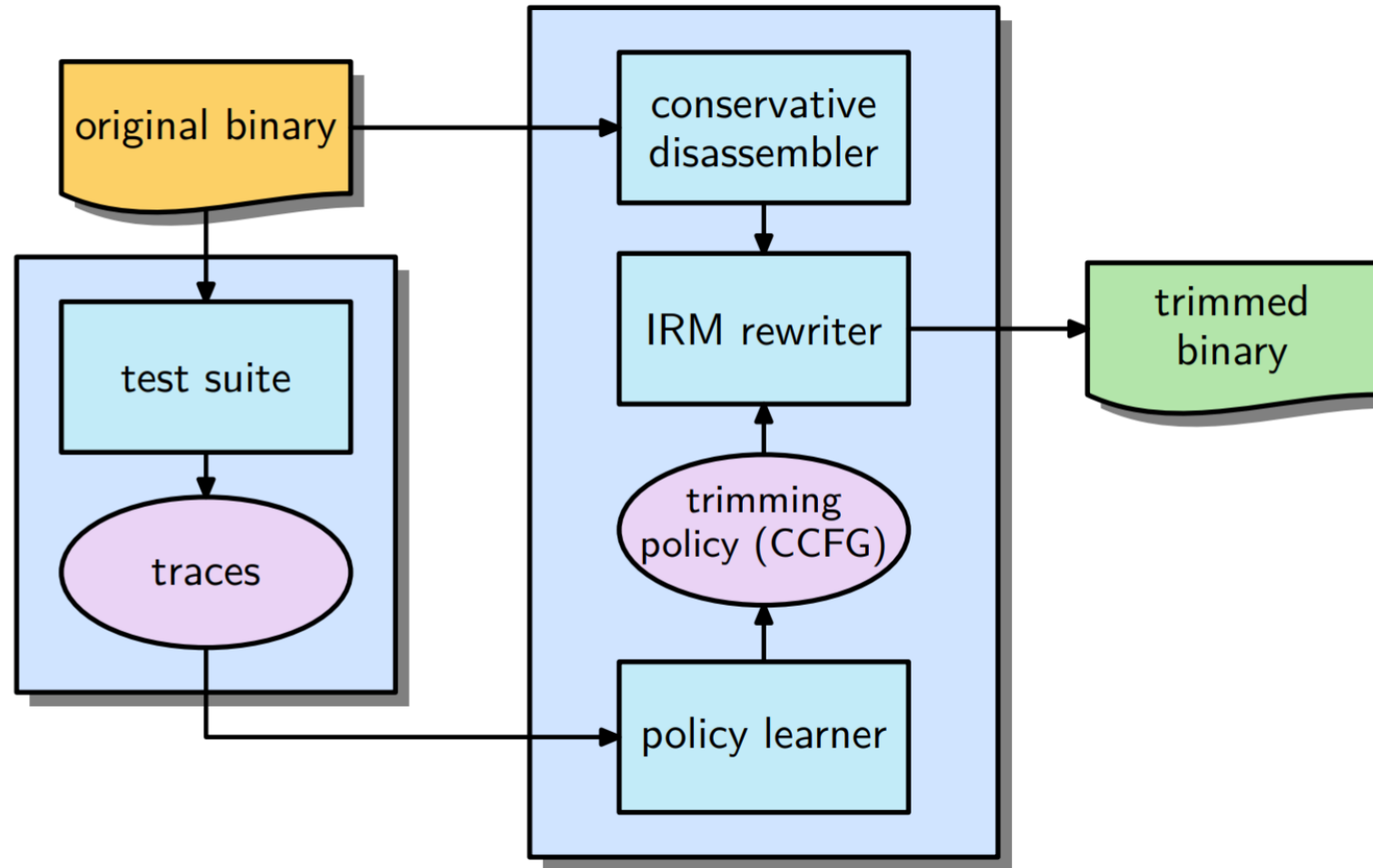
- no virtualization layers introduced
- “debloated” code should be runnable on bare hardware

Basic Workflow

- (1) Demonstrate representative desired functionalities by running the target software on various inputs in an emulator/VM.
- (2) Submit resulting logs along with original binary code to de-bloater.
- (3) If resulting de-bloated binary is unsatisfactory (e.g., needed functionalities missing), then repeat with more/better tests.



Binary Control-flow Trimming Architecture



Stepwise Usage

1. CCFI-protect binary with a permit-all policy

- `rewriter-makeout.py --learn --target $BCFT_TARGET_BINARY ...`

2. run new binary in emulator (PIN) on training inputs

- `pin -i ... -o ... -- $PROGRAM $ARGS`

3. learn a CCFI policy from the traces logged by the emulator

- `learner.py $PROGRAM_TRACES_DIR`

4. replace the permit-all policy with the learned policy

- `rewriter-makeout.py --policy $POLICY_FILE --target $BCFT_BINARY`

Experiments and Evaluations

➤ Performance:

- SPEC CPU Benchmark.
- Lighttpd, Nginx web-servers.
- Proftpd, pureftpd, vsftpd ftp-servers.

➤ Test-suite for accuracy and security:

Program	Test Suite	Debloated Functionalities
GCC	Its own source code.	-m32 (accuracy)
Ftp-servers	Random files mixed with commands (e.g. rm).	SITE, DELETE (security, accuracy)
Browsers	Quantcast top 475K URLs.	Incognito, cookies add/delete(accuracy)
ImageMagic convert	Converting random jpgs to png.	resizing(accuracy)
Exim	Random emails to a specific address.	-ps (security), -oMs(accuracy)
Node.js	Java scrip code not using <code>serialize()</code> .	<code>serialize()</code> (security)

Vulnerabilities Removed

Successfully removed Shellshock vulnerability using only the pre-Shellshock test-suite shipped with bash.

Program	CVE numbers
Bash	CVE-2014-6271, -6277, -6278, -7169
ImageMagic	CVE-2016-3714, -3715, -3716, -3717, -3718
Proftpd	CVE-2015-3306
Node.js	CVE-2017-5941
Exim	CVE-2016-1531

Limitations and Scope

➤ **DON'T** use this if...

- ... you have full source code and can recompile all system components.
- ... you want to shrink the software's memory image.
- ... it is difficult/impossible to demonstrate all critical functionalities.
 - (In future research we want to relax this restriction.)

➤ **DO** use this if...

- ... you don't have or don't trust some/all of the source code for the software.
- ... the software has *no formal specification* of correctness/security.
- ... you have no developer cooperation for finding/fixing bugs/features.
- ... you want to run the code natively (no VM).

Obvious Approach: Code Byte Erasure

```
0749eb90 f0 32 7d 60 95 48 d0 62 08 80 4b 67 b4 4a 21 dc |.2}^ .H.b..Kg.J!.|
0749eba0 80 3f 6c dd 4a f5 a3 d4 ce 32 8d e4 21 d7 a5 5a |.|?l.J....2...!..Z|
0749ebb0 92 93 4b f1 ca 0a ce 3c b9 14 20 a5 00 a4 4a 3e |..K....<... ..J>|
0749ebc0 bd 4b 8c b4 d1 90 2b 25 a9 c8 f4 c8 10 85 fb d6 |.K....+%. ....|
0749ebd0 fc 2a 1f c6 8a 7f 25 e7 47 f4 95 01 e2 d7 82 fe |.*....%.G. ....|
0749ebe0 22 95 fa 8e 49 e4 50 98 d3 84 95 a7 97 1d 97 92 |"...I.P. ....|
0749ebf0 25 32 9f 90 0c a9 07 73 c2 2b 49 06 4c 1a 26 69 |%2....s.+I.L.&i|
0749ec00 b2 75 3e 20 db 65 bf 22 68 cf 29 1b 8a 65 8d 54 |.u> .e."h.)..e.T|
0749ec10 91 ba 33 f3 05 59 07 39 cd 43 96 6f 5d 88 bb 7a |..3..Y.9.C.o]..z|
0749ec20 aa ae d2 04 b1 c6 33 25 8c 68 f7 c7 79 23 ef 66 |.....3%.h..y#.f|
0749ec30 7a aa 41 e7 99 55 1d 46 79 64 2a 6c 1f a9 64 63 |z.A..U.Fyd*l..dc|
0749ec40 ef f9 87 72 3f d9 5a 9f 48 0d 92 96 72 0d 1b a4 |...r?.Z.H...r...|
0749ec50 a6 2e 08 b0 96 cc e6 37 88 f0 57 32 3b 21 6d d9 |.....7..W2;!m.|
0749ec60 e4 6b f1 ef 14 25 65 e3 3c b3 ee 60 bc a4 ea 44 |.k...%e.<...`...D|
0749ec70 64 49 0d 59 0b 45 3f f0 75 a4 24 be 41 f5 52 ad |dI.Y.E?.u.$..A.R.|
0749ec80 32 65 33 4d 9c 83 8e 97 69 57 f2 5d 72 93 dd b1 |2e3M....iW.]r...|
0749ec90 d0 c6 dc c8 43 89 6e 1e 8b d9 2e 67 52 3e 26 3f |....C.n....gR>&?|
0749eca0 46 cc 92 a7 e1 f3 af 9c c8 b3 17 fe ff 8a bb 7a |F. ....z|
0749ecb0 f6 e9 99 6d 8b 24 dc 84 97 67 b6 d5 5b 73 a6 fc |...m.$...g..[s..|
0749ecc0 50 a6 cf fe 92 7d c3 2f 2e 7e e8 b7 8f 9b 71 5f |P....)./.~....q_|
0749ecd0 b0 43 79 5c f1 63 9d b7 2f 7e b1 f3 f6 87 5f b0 |.Cy\..c../~...._|
0749ece0 64 84 86 98 59 f7 d2 96 42 28 5a 96 8e d1 17 4f |d...Y...B(Z...O|
0749ecf0 f4 2d a6 94 06 0f fb 57 83 fe 60 59 8e 32 70 23 |.-....W...`Y.2p#|
0749ed00 c1 8a 98 43 0b 90 26 24 03 ce 3d 21 79 0b 75 f9 |...C...&$...=!y.u.|
```

Obvious Approach: Code Byte Erasure

0749eb90	f0	32	7d	60	95	48	d0	62	08	80	4b	67	b4	4a	21	dc	.2}^` .H.b..Kg.J!.
0749eba0	80	3f	6c	dd	4a	f5	a3	d4	ce	32	8d	e4	21	d7	a5	5a	. ?l.J....2...!..Z
0749ebb0	92	93	4b	f1	ca	0a	ce	3c	b9	14	20	a5	00	a4	4a	3e	..K....<... ..J>
0749ebc0	bd	4b	8c	b4	d1	90	2b	25	a9	c8	f4	c8	10	85	fb	d6	.K....+%.
0749ebd0	fc	2a	1f	c6	8a	7f	25	e7	47	f4	95	01	e2	d7	82	fe	.*....%.G.
0749ebe0	22	95	fa	8e	49	e4	50	98	d3	84	95	a7	97	1d	97	92	"....I.P.
0749ebf0	25	32	9f	90	0c	a9	07	73	c2	2b	49	06	4c	1a	26	69	%2.....s.+I.L.&i
0749ec00	b2	75	3e	20	db	65	bf	22	68	cf	29	1b	8a	65	8d	54	.u> .e."h.)..e.T
0749ec10	91	ba	33	f3	05	59	07	39	cd	43	96	6f	5d	88	bb	7a	..3...Y.9.C.o]..z
0749ec20	aa	ae	d2	04	b1	c6	33	25	8c	68	f7	c7	79	23	ef	663%.h..y#.f
0749ec30	7a	aa	41	e7	99	55	1d	46	79	64	2a	6c	1f	a9	64	63	z.A..U.Fyd*L..dc
0749ec40	ef	f9	87	72	3f	d9	5a	9f	48	0d	92	96	72	0d	1b	a4	...r?.Z.H...r...
0749ec50	a6	2e	08	b0	96	cc	e6	37	88	f0	57	32	3b	21	6d	d97..W2;!m.
0749ec60	e4	6b	f1	ef	14	25	65	e3	3c	b3	ee	60	bc	a4	ea	44	.k...%e.<...`...D
0749ec70	64	49	0d	59	0b	45	3f	f0	75	a4	24	be	41	f5	52	ad	dI.Y.E?.u.\$..A.R.
0749ec80	32	65	33	4d	9c	83	8e	97	69	57	f2	5d	72	93	dd	b1	2e3M....iW.]r...
0749ec90	d0	c6	dc	c8	43	89	6e	1e	8b	d9	2e	67	52	3e	26	3fC.n....gR>&?
0749eca0	46	cc	92	a7	e1	f3	af	9c	c8	b3	17	fe	ff	8a	bb	7a	F.....z
0749ecb0	f6	e9	99	6d	8b	24	dc	84	97	67	b6	d5	5b	73	a6	fc	...m.\$...g..[s..
0749ecc0	50	a6	cf	fe	92	7d	c3	2f	2e	7e	e8	b7	8f	9b	71	5f	P....)./.~....q_
0749ecd0	b0	43	79	5c	f1	63	9d	b7	2f	7e	b1	f3	f6	87	5f	b0	.Cy\.c../~....
0749ece0	64	84	86	98	59	f7	d2	96	42	28	5a	96	8e	d1	17	4f	d...Y...B(Z...O
0749ecf0	f4	2d	a6	94	06	0f	fb	57	83	fe	60	59	8e	32	70	23	.-.....W...`Y.2p#
0749ed00	c1	8a	98	43	0b	90	26	24	03	ce	3d	21	79	0b	75	f9	...C...&\$...=!y.u.

Obvious Approach: Code Byte Erasure

```
0749eb90 f0 32 7d 68 95 48 d0 c2 88 88 4b 67 b4 4a 21 dc | (2) ^ M B K g J |
0749eba0 88 3f 6c dd 4a f5 a3 d4 ce 32 8d e4 21 d7 a5 5a | ? 1 . J . . . . 2 . . ! . . Z |
0749ebb0 92 93 4b f1 ca 0a ce 3c b9 14 20 a5 00 a4 4a 3e | . . K . . . . < . . . . J > |
0749ebc0 bd 4b 8c b4 d1 90 2b 25 a9 c8 f4 c8 10 85 fb d6 | . K . . . . + % . . . . . |
0749ebd0 fc 2a 1f c6 8a 7f 25 e7 47 f4 95 01 e2 d7 82 fe | . * . . . . % . G . . . . . |
0749ebe0 22 95 fa 8e 49 e4 50 98 d3 84 95 a7 97 1d 97 92 | " . . . . I . P . . . . . |
0749ebf0 25 32 9f 90 0c a9 07 73 c2 2b 43 86 1c 1a 26 69 | % 2 . . . . . 5 . . I . L . & |
0749ec00 b2 75 3c 28 db 65 bf 22 68 cf 29 1b 8a 65 8d 54 | ( a ^ ( e " h ) . . e . T |
0749ec10 91 ba 33 f3 05 59 07 39 cd 43 96 6f 5d 88 bb 7a | . . 3 . . Y . 9 . C . o | . . 2 |
0749ec20 6a ac d2 84 b1 c6 33 25 8a c8 47 c7 79 23 cf 66 | . . . . . 3 % . h . y # . f |
0749ec30 7a aa 12 c7 99 55 1d 18 79 64 2a 6c 1f 49 64 63 | 2 . h . 0 . F . y & * 1 . d |
0749ec40 cf 13 87 72 3f d3 5a 3f 48 8d 32 38 72 8d 1b a4 | . . . . . 2 . h . . . . . |
0749ec50 45 2c 88 b8 36 cc c6 37 88 f8 57 32 3b 21 8d d9 | . . . . . 7 . . h 2 . h . |
0749ec60 c4 6b f1 cf 14 25 65 c3 3c b3 cc 68 bc a4 ca 44 | . k . . . % e . . . . . B |
0749ec70 64 49 8d 33 8b 43 3f f0 75 a4 24 be 41 f5 52 ad | d 1 . Y . E . . u . $ . A . R . |
0749ec80 32 65 33 4d 9c 83 8e 97 69 57 f2 5d 72 93 dd b1 | 2 e 3 M . . . . i W . ] r . . |
0749ec90 d0 c6 dc c8 43 89 6e 1e 8b d9 2e 67 52 3e 26 3f | . . . . C . n . . . . g R > & ? |
0749eca0 46 cc 92 a7 c1 f3 af 9c c8 b3 17 fc ff 8a bb 7a | F . . . . . . . . . . . 2 |
0749ecb0 f6 c9 99 6d 8b 24 dc 84 97 67 b6 45 5b 73 a6 fc | . . h m $ . . i g n . [ 3 . |
0749ecc0 50 ac ef fe 92 7d c3 2f 2e 7c c8 b7 8f 9b 71 5f | ( . . . . ) . . . . . q _ |
0749ecd0 b0 13 79 5c f1 63 9d b7 2f 7c b1 f3 16 87 5f b8 | . G y h e n n / . . . . . |
0749ece0 64 84 86 98 59 f7 d2 96 42 28 5a 96 8e d1 17 4f | d . . . . Y . . . B ( Z . . . . 0 |
0749ecf0 f4 2d a6 94 06 0f fb 57 83 fe 60 59 8e 32 78 23 | . . . . . W . . . . Y . 2 p # |
0749ed00 c1 8a 98 13 8b 98 26 24 83 cc 3d 21 79 8b 75 f9 | . . . C . . & $ . . . . h y a . |
```

Obvious Approach: Code Byte Erasure

```
0749eb90 f0 32 7d 68 95 48 d0 62 88 88 4b 67 b4 4a 21 d2 | (2) ^HrbrKgrJr |
0749eba0 00 3f 6c dd 4a f5 a3 d4 ce 32 8d e4 21 d7 a5 5a | ?1.J....2..!..Z |
```

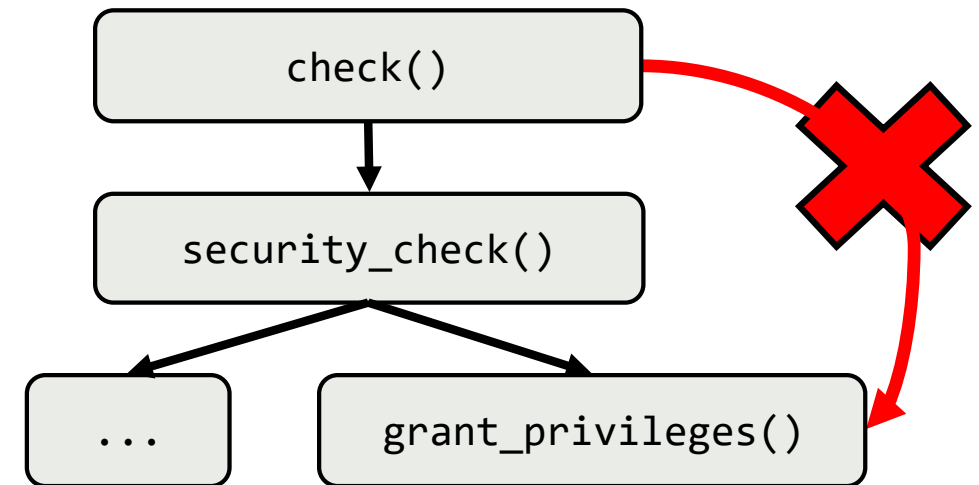
Two Problems:

- (1) Too much gets erased (needed functionalities broken)
- (2) Too many “bad” functionalities retained!

```
0749ecf0 f4 2d a6 94 06 0f fb 57 83 fe 60 59 8e 32 78 23 | .....W...Y.p# |
0749ed00 c1 8a 98 43 8b 98 26 24 83 ee 3d 21 79 8b 75 f9 | ...Cn&$...lgrat |
```

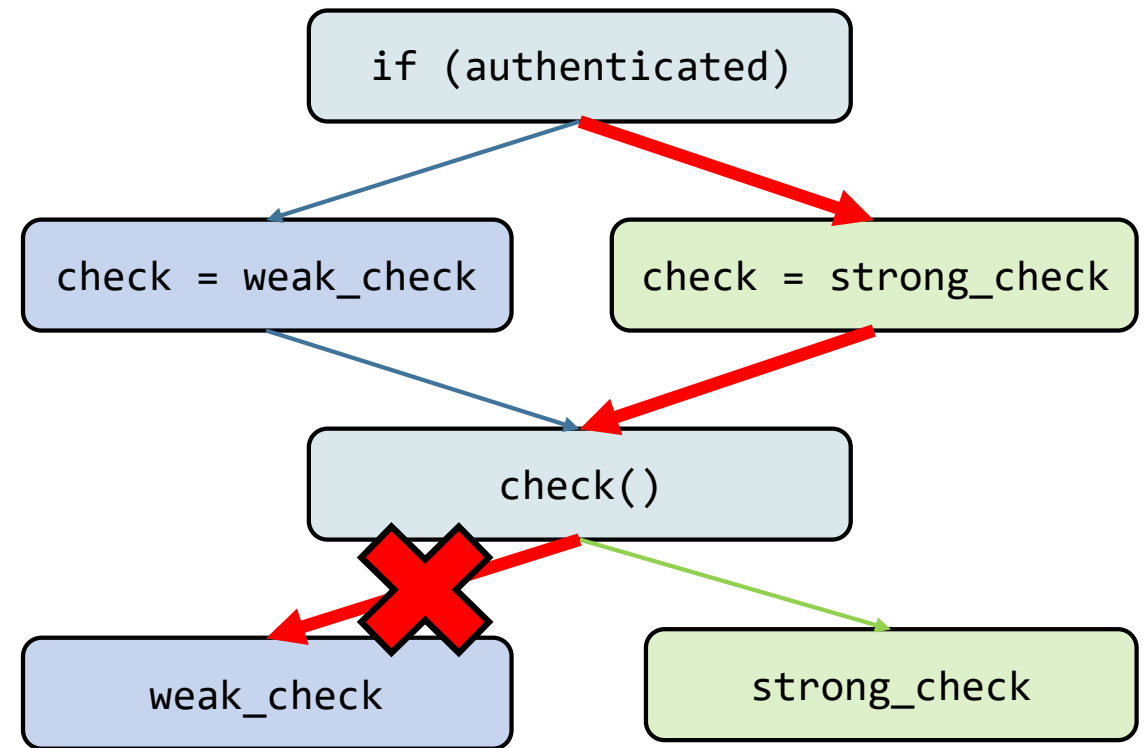
Code Erasure vs. Edge Erasure

```
1 void access_database() {
2
3     bool (*check)(void);
4     char vul_buf[N];
5
6     check = &security_check;
7
8     ...
9
10
11     scanf("%s", vul_buf);
12
13     if (check()) {
14         grant_privileges();
15     }
16 }
```



Edge Erasure vs. Flow Erasure

```
1 void access_database() {  
2  
3     bool (*check)(void);  
4     char vul_buf[N];  
5  
6     if (authenticated)  
7         check = weak_check;  
8     else  
9         check = strong_check;  
10  
11     scanf("%s", vul_buf);  
12  
13     if (check()) {  
14         grant_privileges();  
15     }  
16 }
```



Contextual Control-flow Integrity (CCFI)

➤ Basic implementation strategy

- Replace each jump/branch/call instruction in the original code with a *check-then-jump* sequence
- The “check” code updates and consults a saved *context history* of previous jumps.

➤ Requirements

- ALL jump/branch/calls must be replaced
- saved context history must be protected from attacker modification

➤ Prior work

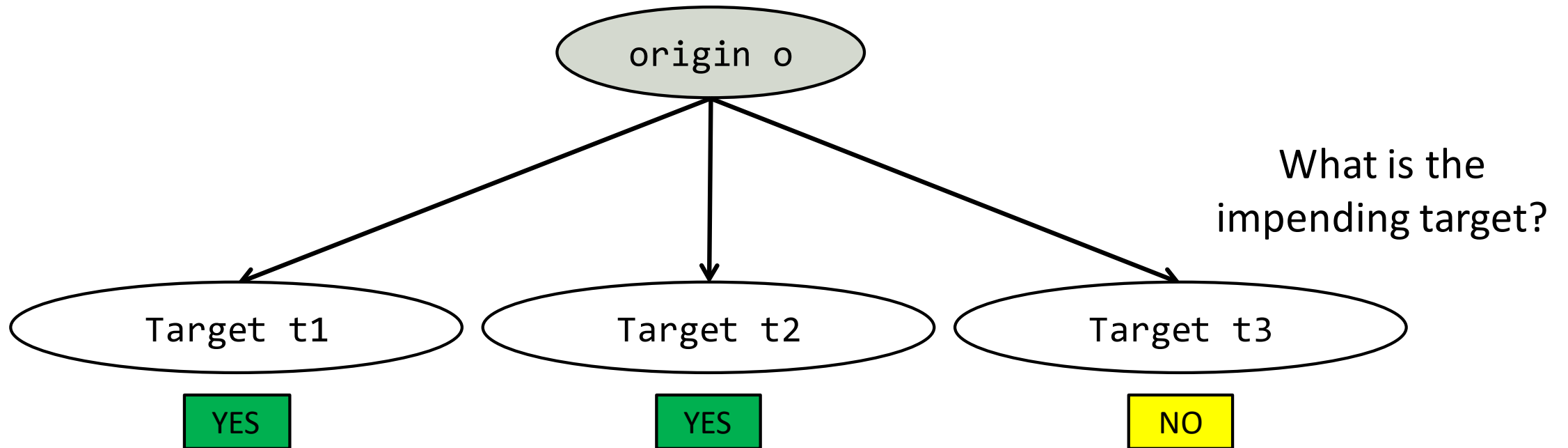
- non-contextual CFI enforcement is well-established
- contextual CFI is very hard to implement efficiently
 - PathArmor [Van Der Veen et al.; USENIX Sec '15]: only checks system API calls, has high overhead

➤ Main challenge #1: How to learn a CCFI policy without a spec?

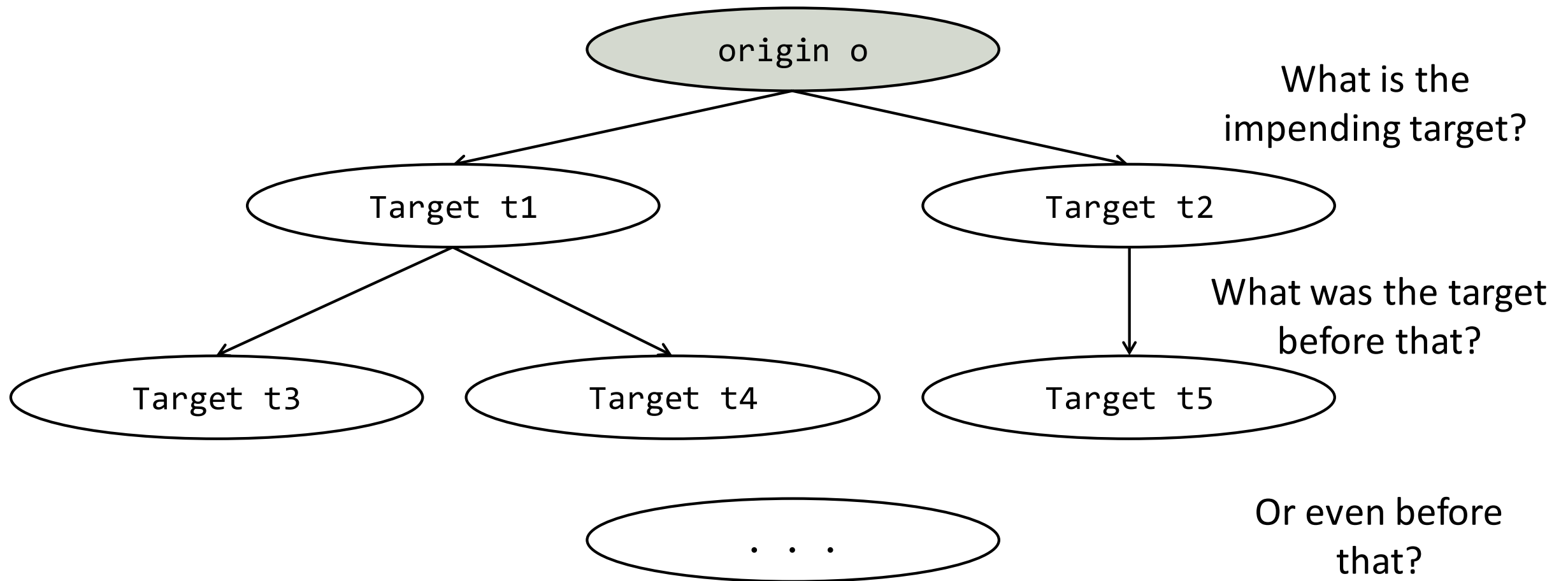
➤ Main challenge #2: How to enforce such fine-grained CCFI efficiently?

Learning CFG Policy

- Decision Trees at every branch site.

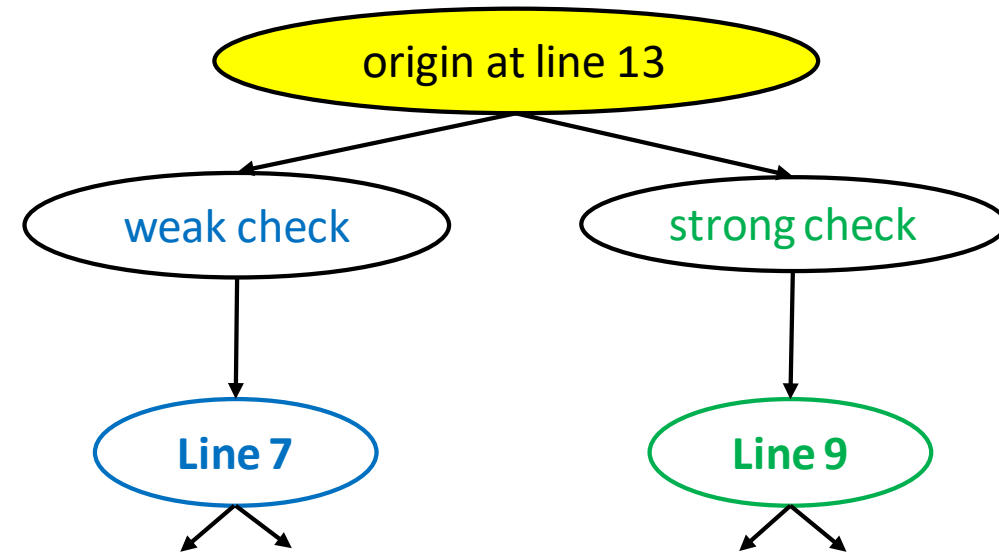


Learning Contextual CFG Policy



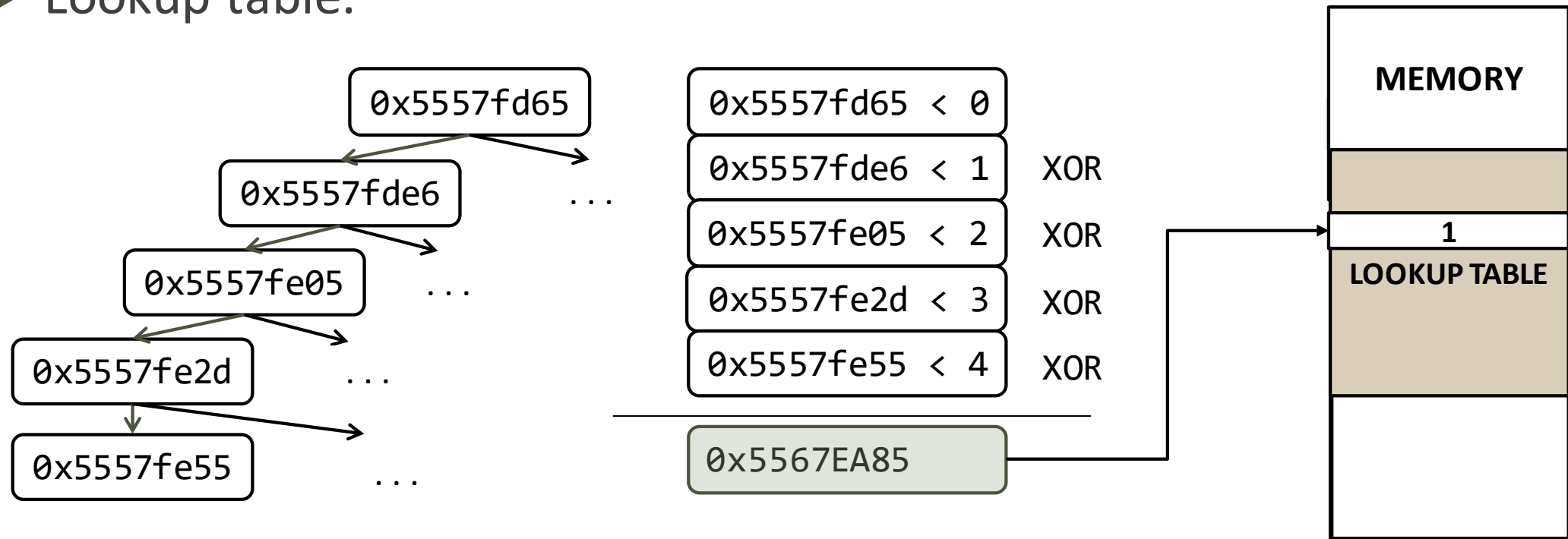
Contextual CFG Trees

```
1 void access_database() {  
2  
3     bool (*check)(void);  
4     char vul_buf[N];  
5  
6     if (authenticated) e1  
7         check = weak_check;  
8     else  
9         check = strong_check;  
10  
11     scanf("%s", vul_buf);  
12  
13     if (check()) {  
14         grant_privileges();  
15     }  
16 }
```



Policy Representation

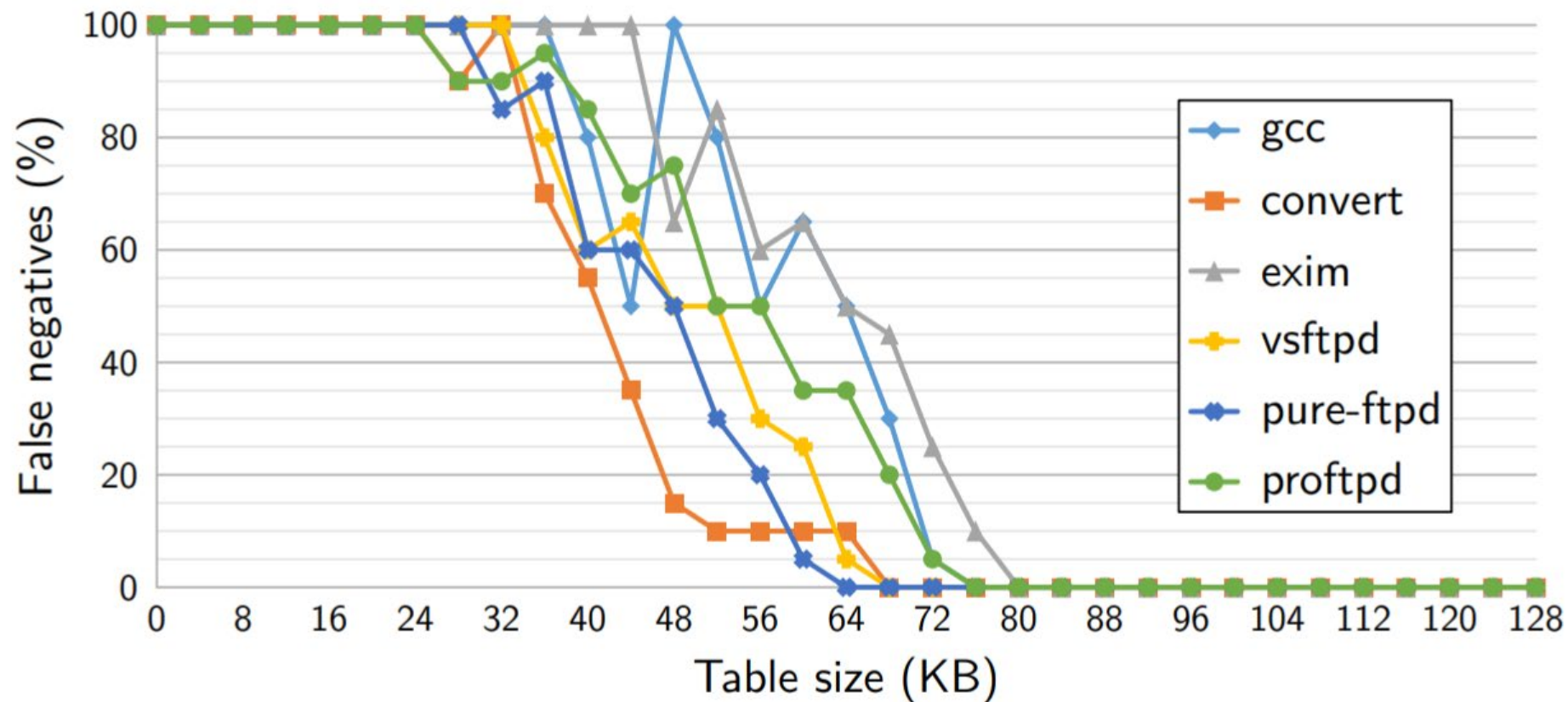
➤ Lookup table.



$$hash(\chi) = \bigoplus_{i=1}^{|\chi|} ((\pi_2 \chi_i) \ll (|\chi| - i)s) \quad hash(\chi e) = (hash(\chi) \ll s) \oplus (\pi_2 e)$$

Hash Table Sizes

A table of size n B can whitelist $8n$ contexts.



Guard Checks

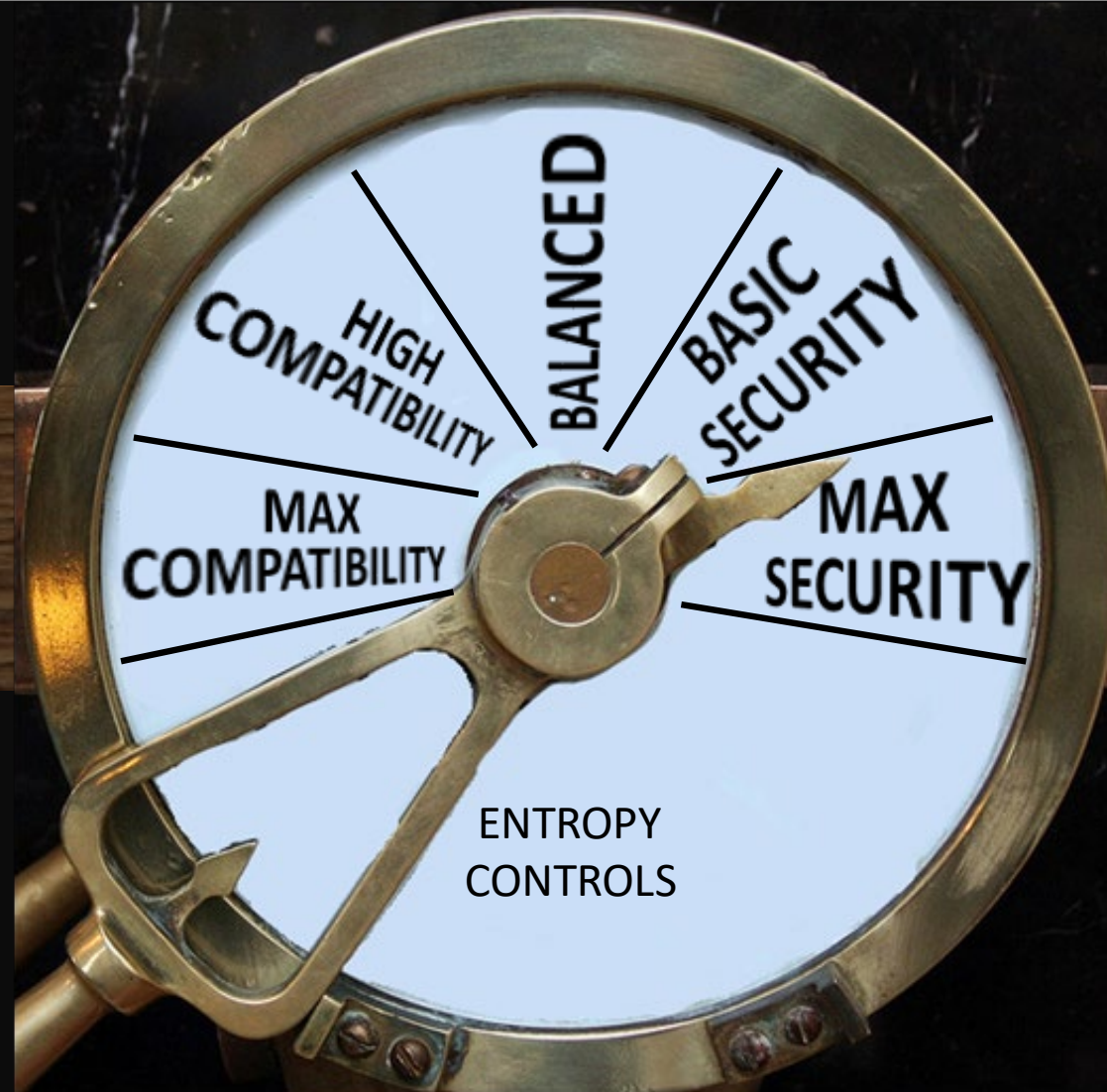
Description	Original code	Rewritten Code
Conditional Jumps	<i>jcc l</i>	call <i>jcc_fall</i> .quad <i>l</i>
Indirect calls	call <i>r/[m]</i>	mov <i>r/[m]</i> , %rax call indirect_call
Indirect Jumps	jmp <i>r/[m]</i>	mov %rax, -16(%rsp) mov <i>r/[m]</i> , %rax call indirect_jump
Variable Returns	ret <i>n</i>	pop %rdx lea <i>n</i> (%rsp), %rsp push %rdx jmp return
Returns	ret	mov (%rsp), %rdx jmp return

Label	Assembly Code
indirect_jump:	push %rax common-guard mov -8(%rsp), %rax ret
indirect_call:	push %rax common-guard ret
return:	common-guard ret
<i>jcc_fall</i> :	<i>jcc</i> jump_l jmp fall_l
<i>jcc_back</i> :	<i>jcc</i> jump_l jmp back_l
jump_l:	xchg (%rsp), %rax mov (%rax), %rax jmp condition_jump
fall_l:	xchg (%rsp), %rax lea 8(%rax), %rax jmp condition_jump
back_l:	xchg (%rsp), %rax lea 8(%rax), %rax xchg (%rsp), %rax ret
condition_jump:	push %rax common-guard pop %rax xchg (%rsp), %rax ret

Context Protection with Wide Registers

Guard Name	Guard Code			
	Legacy-mode		SHA-extension	
before-check	1:movd	<i>r</i> , %xmm11	1:movd	<i>r</i> , %xmm11
	2:psubd	%xmm12, %xmm11	2:psubd	%xmm12, %xmm11
			3:sha1msg1	%xmm14, %xmm13
			4:sha1msg2	%xmm13, %xmm13
			5:pslrdq	\$4, %xmm13
	3:pxor	%xmm11, %xmm13	6:pxor	%xmm11, %xmm13
check	4:movd	%xmm13, <i>r</i>	7:movd	%xmm13, <i>r</i>
	5:and	(<i>max_hash</i> - 1), <i>r</i>	8:and	(<i>max_hash</i> - 1), <i>r</i>
	6:bt	<i>r</i> , (HASH_TABLE)	9:bt	<i>r</i> , (HASH_TABLE)
	7:jnb	TRAP	10:jnb	TRAP
after-check	8:pextrd	\$3, %xmm14, <i>r</i>	11:pslldq	\$4, %xmm14
	9:pslldq	\$4, %xmm14	12:psllw	\$1, %xmm14
	10:pxor	%xmm11, %xmm14	13:pxor	%xmm11, %xmm14
	11:movd	<i>r</i> , %xmm11		
	12:pxor	%xmm11, %xmm13		
	13:pslld	\$1, %xmm13		
	14:pslld	\$1, %xmm14		

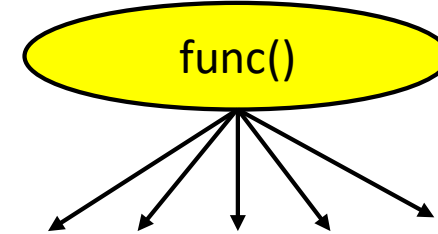
Tuning Policy Strictness



Decision Trees and Entropy

- High entropy node = high uncertainty = incomplete testing

```
1 void dispatch(void (*func)()) {  
2     func();  
3     LOG();  
4 }
```



Relaxing the policy

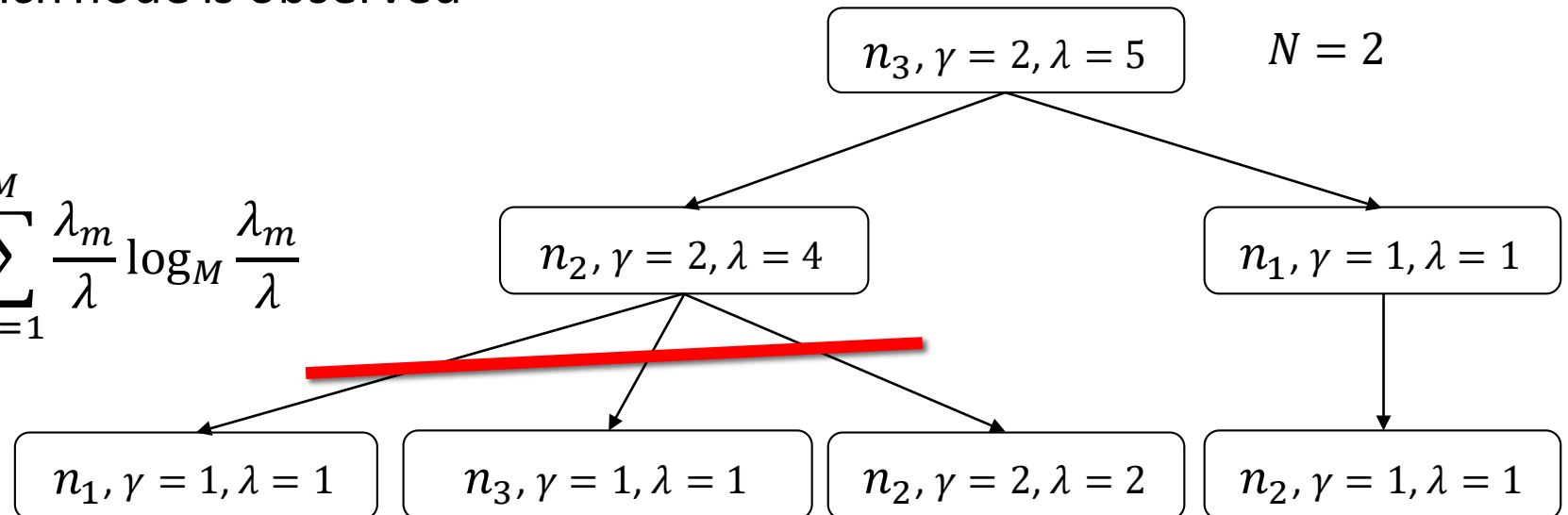
➤ Relaxation philosophy:

- Relaxed policy is always as strict as non-contextual CFI.
- Relaxations merely identify some context as irrelevant to the enforcement decision.

➤ Parameters

- λ = # times the node observed in all traces
- γ = # traces in which node is observed
- N = total traces
- M = # children

$$score(n) = \frac{\gamma}{N} \times -\frac{1}{M^2} \sum_{m=1}^M \frac{\lambda_m}{\lambda} \log_M \frac{\lambda_m}{\lambda}$$

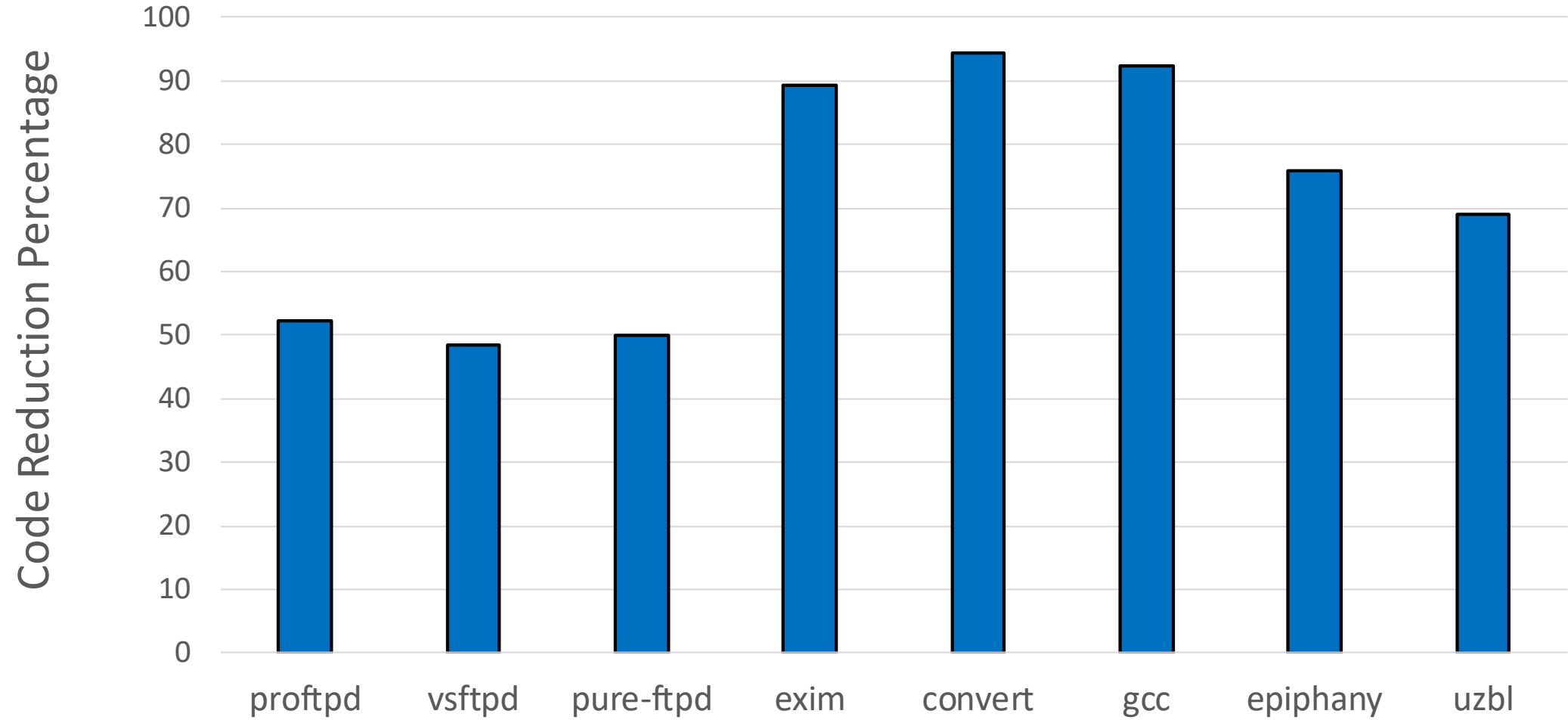


Accuracy

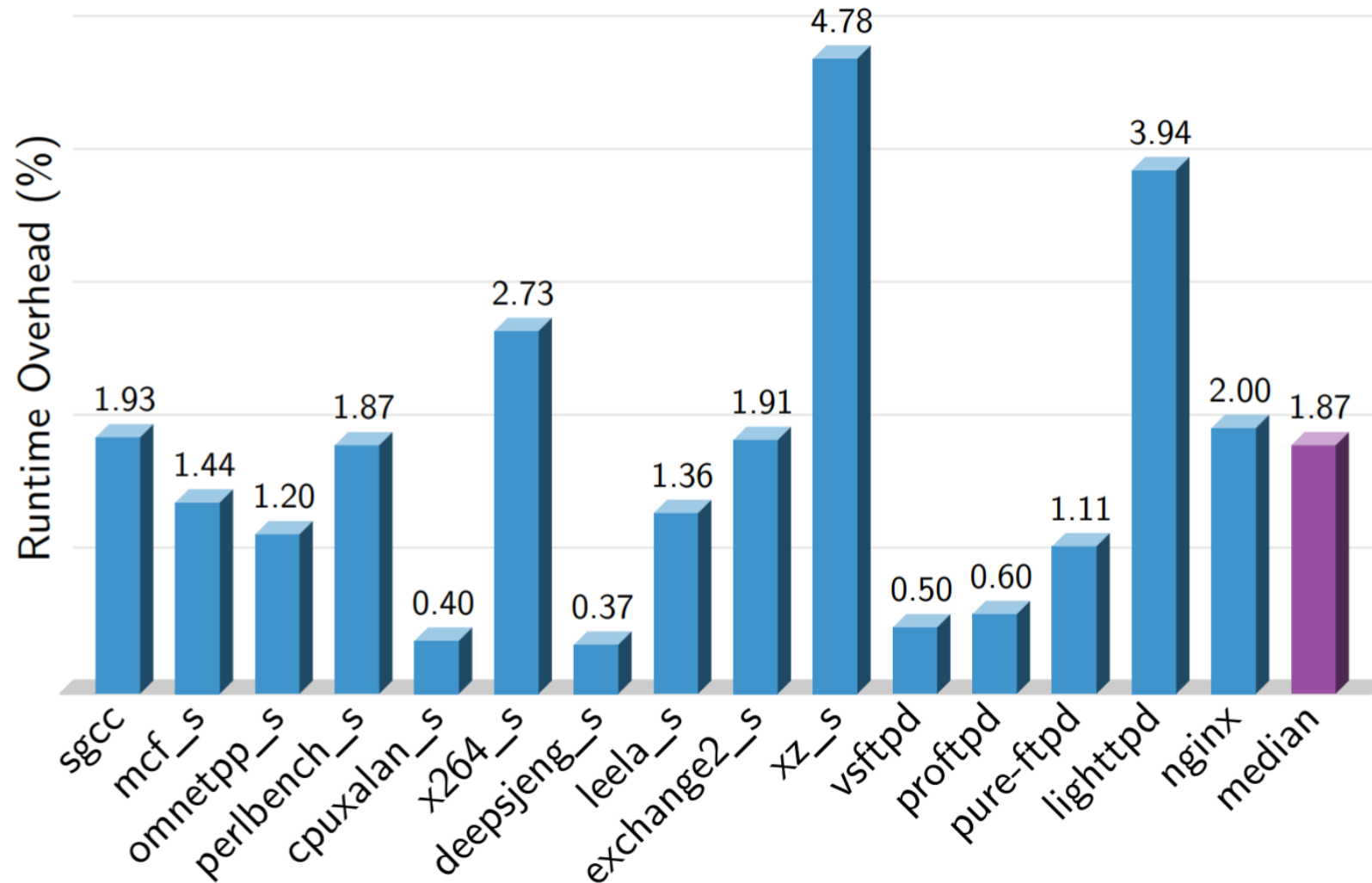
		Program											
		proftpd			vsftpd			pure-ftp			exim		
Sample Size		10	100	500	10	100	500	10	100	500	10	100	200
	t^*	0.48	0.37	0.00	0.38	0.23	0.00	0.41	0.28	0.00	0.25	0.53	0.00
FP	$t=0.00$	45.00	3.00	0.00	35.00	2.00	0.00	25.00	2.50	0.00	35.00	7.50	0.00
	$t=0.25$	30.00	1.50	0.00	25.00	1.50	0.00	25.00	1.50	0.00	15.00	1.00	0.00
	$t=t^*$	25.00	1.00	0.00	25.00	1.50	0.00	10.00	1.50	0.00	20.00	0.00	0.00
FN		0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00

		Program											
		epiphany				uzbl				convert		gcc	
Sample Size		10	100	500	1000	10	100	500	1000	10	100	200	10
	t^*	0.93	0.81	0.33	0.00	0.92	0.83	0.65	0.45	0.64	0.54	0.00	0.00
FP	$t=0.00$	85.00	40.00	8.70	0.00	90.00	50.50	10.70	4.30	20.00	2.50	0.00	0.00
	$t=0.25$	40.00	10.00	0.40	0.00	40.00	3.50	0.90	0.85	15.00	1.00	0.00	0.00
	$t=t^*$	0.00	6.50	0.30	0.00	30.00	2.50	0.60	0.35	10.00	0.00	0.00	0.00
FN		0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00	0.00

Reachable Code Reduction



Run-time Overhead



CFI \neq Debloating

- Policies enforced by prior CFI works:
 - Source-aware CFI solutions: CFG derived from source code semantics
 - Binary-only CFI solutions: Approximate the source CFG from binary semantics
 - Both approaches preserve developer-intended, consumer-unwanted edges.
- Prior contextual CFI solution:
 - PathArmor [Van Der Veen et al.; USENIX Security 2015]
 - Contextual checks only performed at system call sites
 - Insufficient granularity to debloat fine-grained code blocks from software
 - Performance overhead too high if applied to every branch instruction

Comparison with RAZOR [Qian et al. (USENIX'19)]

	RAZOR	Control-flow Trimming
Strategy	Heuristics applied to code structure and traces	Machine learning (decision trees)
Policy Expressiveness	Static CFI	Contextual CFI
Debloating rate	~71%	~71%
Performance Overhead	1.7%	1.9%

Conclusion

- Main achievements
 - Binary software debloating using incomplete test-suite and no source code
 - First fine-grained contextual CFI enforcement at every branch site with high performance (1.8% overhead)
- Challenges for Future Research / Transition
 - Highly interactive software (diverse traces) can create high training burden. Could couple with directed fuzzers to improve training effectiveness.
 - Training process automatically detects uncertainties and ambiguities. Feed this information back to (non-expert) users to help them refine the training?

THANK YOU

QUESTIONS?