

# The Automated Exploitation Grand Challenge

Tales of Weird Machines

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**You are an inspiration for the Automated Exploitation Grand Challenge**

**Thank you**

# What is Automated Exploitation?

- The ability to generate a successful computer attack with reduced or entirely without human interaction.
- It is important to understand the hardness of AE to measure the risk on critical infrastructure and online properties.
- There are many domains of attack: network, web, kernel, system, hardware, applications. Our focus today is on **software security**.

# What are Weird Machines?

- Weird Machine (WM): “The underlying capacity of a program to perform runtime computations that escape the program specification”
  - (1) If extra computations are consistent with the intended program specification, the WM can lead to a covert execution of code within the program.
  - (2) If extra computations violate the intended program specification, the WM can lead to a security exploit (what we will talk about today).

# Today's exploits techniques

Modern history of exploit techniques :

- Code-reuse attacks: Computations without code injection
  - Started with “Return into Libc” (Solar Designer’s 1997)
  - Advanced by “Return into PLT” (Rafal Wojtczuk’s 1998)
  - Generalized by Chunk reuse (“borrowing”) technique (Richarte 2000, Kraemer 2005)
  - Since 2008, known as “Return Oriented Programming”
- Meta-data corruption
  - “Smashing C++ VPTRs” (Eric Landuyt, 2000)
  - “V00d00 malloc tricks” (Michel Kaempf, 2001)
  - Many, many other papers.

# Today's exploits techniques (2)

- Information disclosure attacks
  - Format bugs (tf8 wu-ftpd 2.6 site-exec exploit, ~ 2000)
  - Weaknesses where content or address of target variables/functions can be read (BIND TSIG Exploit by LSD-PL, Openssl-too-open exploit by Sotirov, ~ 2001)
  - “Return into printf/send” (“Bypassing PaX ASLR protection”, Vanegue 2002)
- Heap chunks alignment techniques
  - “Advanced DL malloc exploit” (JP @ core-st , 2003)
  - “Heap Feng Shui”, (Sotirov, 2007)
- JIT attacks : make target generate “chosen” new code
  - “Pointer inference and JIT spraying” (Blazakis, 2010)

# Exploit Mitigations

- Data Execution Prevention (DEP/Openwall/PaX/W^X/etc)
- Address Space Layout Randomization (ASLR)
- Control-Flow Integrity (CFI)
- Intra-modular displacement randomization (IDR)
- Heap randomization (non-deterministic fitness algorithms)
- Many others targeted protections (UDEREF, SEHOP, canary insertion, meta-data encoding, etc)

**Full AE Models:** The Automated Exploitation (AE) problem is solved if mitigations can be bypassed using minimal to no human interaction.

**Restricted AE Models:** Academic exercise where mitigations are ignored. Not the subject of this talk.

# Control Flow Integrity

- Early implementation by Determina called “Program Shepherding” early 2000. Formalized by Martin Abadi et al. in 2005. A lot of work done at Microsoft, Intel, and more to make it practical – its hard.
- In a nutshell (idealized) :
  - Enforce strict transitions on the control flow graph, in particular between functions.
  - If  $A \rightarrow B$  and  $B \text{--ret}\rightarrow A$ , then  $A \rightarrow C$  is forbidden, so is  $B \text{--ret}\rightarrow D$  (for C and D any other two functions)
- Consequence: Exploit cannot easily corrupt a function pointer or a return address and execute a ROP payload.

# Intra-modular Displacement Randomization

- [Miller, Johnson, Goel, Vanegue, 2011] at Microsoft Security. (<http://ip.com/IPCOM/000210875>)
- Core idea: randomize address space not only using module base address randomization, but also within a module (ex: between functions).
  - Ability to change function relative address from the base address every time a program is executed.
- Consequences:
  - Base address information disclosure is not enough to predict addresses of ALL gadgets in a module.
  - Attacker worst case: need one information disclosure per randomization point inserted in the module.

# Exploit primitives

- Two major families of exploit primitives are write primitives (write address space) and read primitives (read address space).
- Early classification done by Gerardo Richarte at core-st : “About exploit writing”, 2002.
- Modern classification done by Matt Miller: “Modeling the exploitation and mitigation of memory safety vulnerabilities”, 2012.

# Exploit write primitive

**General form:**  $*(\text{basepointer} + \text{offset}) = \text{value}$

## **(1) Base, offset and values are attacker-controlled**

→ Write controlled value at controlled location

## **(2) Base and offset are controlled**

→ Write uncontrolled value at controlled relative location

→ With an information disclosure, can always be used to uncover new state space or elevate privileges

## **(3) Only RHS Value is controlled (totally or partially)**

→ Write anything at fixed location

→ Can be useful if value is:

- Later used as base pointer, index, or offset (we fall into case 1 or 2)
- Used in a control predicate and can uncover new “weird” state space
- Controlling privilege level of application

# Exploit read primitive

**General form:**  $\text{value} = \text{*(basepointer + offset)}$

## **(1) Base, offset and values are attacker-controlled**

→ Read value at desired location and store it at desired location

## **(2) Base and offset are controlled**

→ Read value at desired location, store it at uncontrolled location

→ Only useful if uncontrolled location can be read by attacker

## **(3) Only LHS Value is controlled**

→ Read internal program value and store it at desired location

→ Can be useful if value is:

- Internal program value is a direct code or data address
- Internal program value contains credentials (password, key, token, etc)
- Internal program value help deduce useful address info or credentials

# Rising exploit techniques

- Data-only attacks (DOA)
  - Change internal program values to elevate privileges without changing Program control flow.
  - Infer address of data in program without direct memory read primitives.
- Program Likelihood Inference (PLI)
  - Probabilistic attacks: discover most likely executions to successful exploitation in non-deterministic environment.
  - Timing attacks: discover internal program information via run time execution measurements.

# Tools Armory

# Exploit Generation

- Automated Exploitation focuses on discovery and combination of write primitives and read primitives.
- Automated Exploitation in Full Model is a very hard problem. Anybody telling you otherwise is a fool or an impostor.
- Existing AE work focused on Restricted Models:
  - Sean Heelan’s “Automatic Generation of Control Flow Hijacking Exploits for Software Vulnerabilities” :  
<http://www.cprover.org/dissertations/thesis-Heelan.pdf>
  - David Brumley et al. (AEG, MAYHEM, etc)  
<http://users.ece.cmu.edu/~dbrumley/pubs.html>

# Analysis and Exploit Automation

- Compilers (Program transformation)
- Fuzz testers (Input generation)
- SMT solvers (Symbolic reasoning)
- Model Checkers (State space exploration)
- Symbolic Execution Eng (Path generation)
- Emulators (Machine modeling)
- Abstract interpreters (Abstraction)

# SMT solvers

SMT = Satisfiability Modulo Theories

- Give it a list of variables and constraints on them, will tell you whether the set of constraints is satisfiable.
- A good representation to reason about a program (e.g. translate a program into an SMT formulae)
- Can track feasibility of predicates, eliminate impossible program paths, etc.

**EXAMPLE 1:**  $(B \geq A) \ \&\& \ (A \leq B)$  is SAT

**EXAMPLE 2:**  $A \ \&\& \ B \ \&\& \ \text{NOT}(A\&\&B)$  is UNSAT

# An open-source SMT solver : Z3

- Z3 is a state-of-the-art SMT solver developed in Microsoft Research RiSE group.
- Understand equalities, arrays, bitvectors, uninterpreted functions, and custom theories.
- Makes SMT a good symbolic representation to reason about programs (e.g. by translating it into SMT formulae).

Try by yourself on <http://rise4fun.com/Z3/>

# Example of translation from C to SMT

```
F(int c)
{
  int ret;
  if (c < 10)
    ret = 1;
  else
    ret = 2;
}
```

```
(declare-fun x () Int)
(declare-const ret Int)
(declare-const c Int)
(assert (=> (>= c 10) (= ret 2)))
(assert (=> (< c 10) (= ret 1)))
(assert (= ret 1)) // check me!
(check-sat)
(get-model)
```

# Output model for constraint set

- A model is a valuation of the variables for which a (SMT) formula is true.
- In this example, the constraints set is satisfiable if variable  $C = 9$  and  $RET = 1$
- Change the last assertion of previous slide and see what happens to the model.

## Z3 output:

```
sat (model  
  (define-fun c () Int 9)  
  (define-fun ret () Int 1) )
```

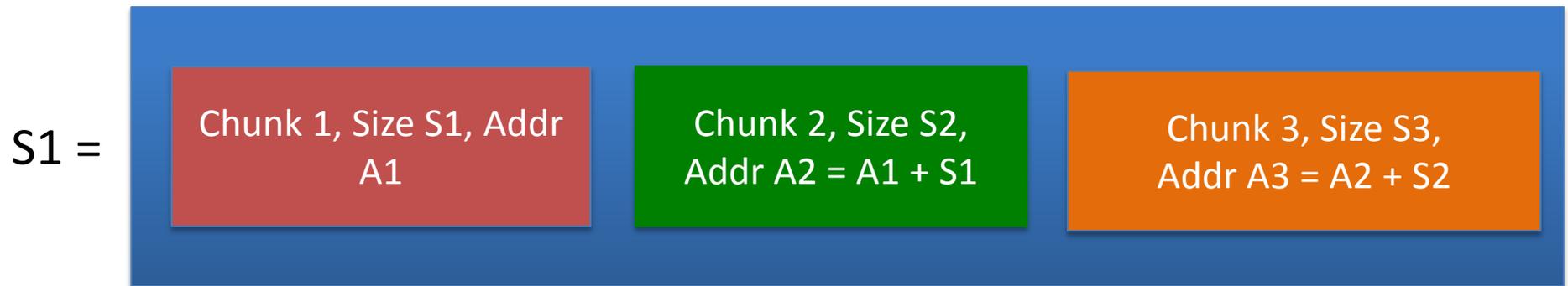
# HAVOC: static analysis for C/C++

- HAVOC: Verifier for C(++) programs  
<http://research.microsoft.com/en-us/projects/havoc/>
- Translate C/C++ code to Boogie IR  
(Open source at: <http://boogie.codeplex.com>)
- Boogie IR is then translated to SMT formulae understood by Z3, which performs SMT check and give you a model.
- At Microsoft, HAVOC helped found 100+ security vulnerabilities in Windows and Internet Explorer.
- Experiments documented in: “Towards practical reactive security audit using extended static checkers” (Vanegue / Lahiri, 2013)  
<http://research.microsoft.com/pubs/185784/paper.pdf>

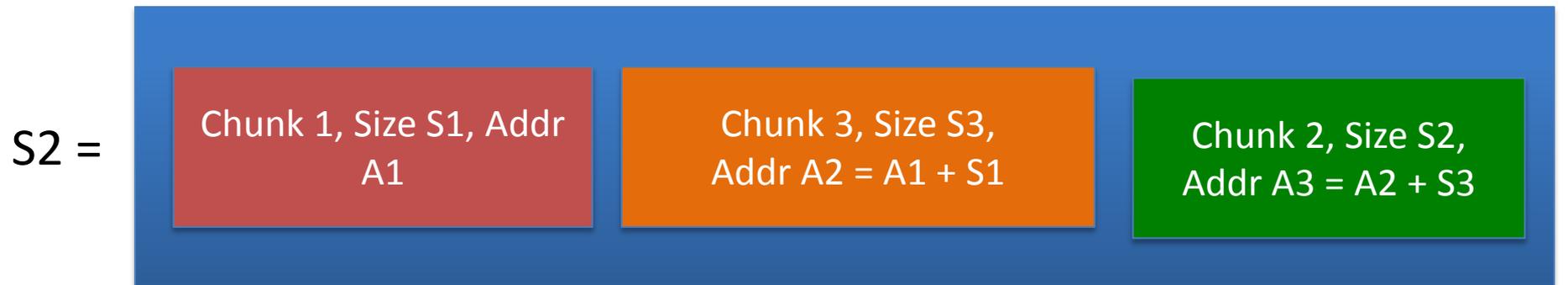
# Problem: non-deterministic programs

Assume an attacker can overflow chunk 1 and chunk 3 is a target:

Heap in 90% of executions of program P :



Heap in 10% of executions of program P :



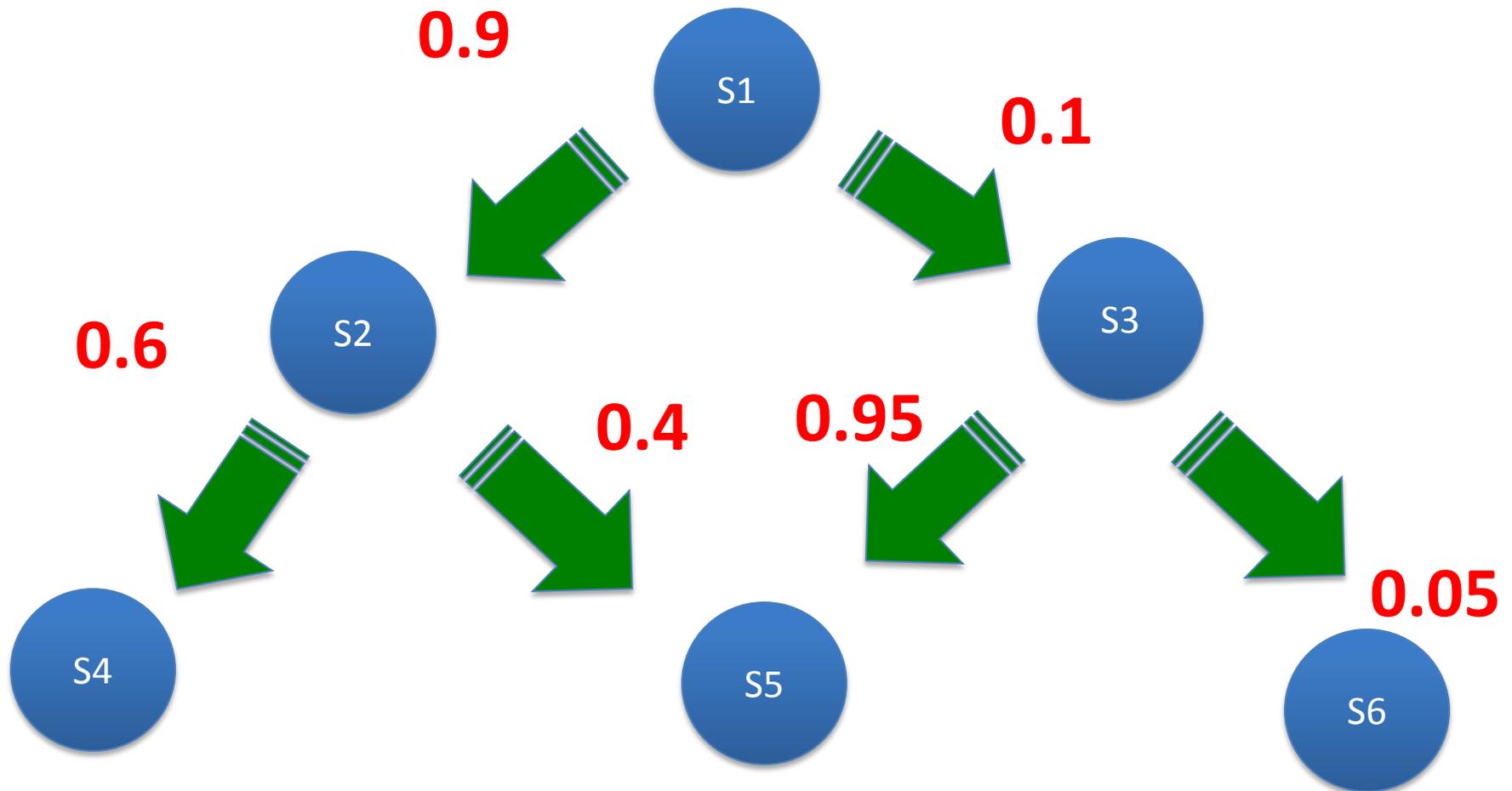
**SMT solvers are unable to reason about non-determinism**

# Idea: Markov exploits



- Andrei Markov (1856-1922)
- Systems (Programs) may seem to act randomly, but have a hidden probabilistic regularity.
- Instrument program and deduce from sampling which paths have most chance to bring the heap in a desired exploitable state.

# Markov transition system



The transition system models the set of all possible random walks.

# Markov transition system

Previous slide explained:

- We computed the probability of reaching every heap states in a maximum of two heap interactions (malloc, free, etc)
- Probability of reaching S4 is:  
$$P(S4) = P(S4 | S2) * P(S2 | S1) = 0.6 * 0.9 = 0.54 \text{ (54\%)}$$
- Probability of reaching S5 is:  
$$P(S5) = P(S5 | S2) * P(S2 | S1) + P(S5 | S3) * P(S3 | S1)$$
$$= 0.9 * 0.4 + 0.95 * 0.1 = 0.455 \text{ (45.5\%)}$$
- Probability of reaching S6 is:  
$$P(S6) = P(S6 | S3) * P(S3 | S1) = 0.1 * 0.05 = 0.005 \text{ (0.5\%)}$$

Assuming S5 and S6 are the only two desired exploitable states, the most exploitable random walk ends in S5.

# Markov Exploit Food for thoughts

- Paths exploration strategy can be static or dynamic (planned, or constructed on the fly)
- If one creates an accurate heap manager specification, heap state measurement could be static, but this is a very hard and allocator-dependent task.
- Most likely, one needs to execute program and instrument debugger to measure heap state when heap operations are performed.
- After monitoring, one can construct the Markov transition system based on sampled program paths. More samples means heap model is more accurate.

# Markov Exploit Food for thoughts (2)

- Determine list of possible heap interactions (malloc, free, etc) sequences in a given program. A single unique sequence may be represented by multiple random walks due to non-deterministic heap manager behavior.
- Determine sequence maximizing probability of reaching desired heap state in a minimum amount of steps. A SMT solver can be used to craft corresponding input based on encountered path predicates.
- A range of Markov models can be used to facilitate encoding of heap structure into a probabilistic transition system (Markov chain, Markov network, etc)

# Challenge problems



## Hilbert's program

- In 1900, German mathematician David Hilbert formulates a list of 23 hard problems touching the foundations of mathematics. Five of these problems remain unsolved today.

[http://en.wikipedia.org/wiki/Hilbert's\\_program](http://en.wikipedia.org/wiki/Hilbert's_program)

# A Program for Automated Exploitation

- Inspired by David Hilbert and many ones after him, we define a list of problems whose solutions pave the way for years to come in the realm of automated low-level software analysis.
- The Grand Challenge consists of a set of 11 problems in the area of vulnerability discovery and exploitation that vary in scope and applicability.
- Most problems relate to discovering and combining exploit primitives to achieve elevation of privilege.

# Exploit challenges are not new

- Gerardo Richarte's insecure programming (from 10 years ago!) constitutes great training for manual exploit writing:

<http://community.coresecurity.com/~gera/InsecureProgramming/>

- Many of the “Capture the Flag” events are, in essence, manual exploit challenges.
- In this challenge, we expect exploits to be generated automatically instead of written manually.

# Nature of Grand Challenge problems

- Exploit Specification problem (A, H)
- Input generation problems (B, C, D, E)
- Exploit Primitive composition problem (F)
- Environment determination (I, J, K)
- State space representation (G)

Not all problems need to be resolved for a given target as different problems cover different exploit scenarios.

# Grand Challenge Evaluation

Two main problems of Automated Exploitation are **Vulnerability Discovery** and **Vulnerability Exploitation**. Solutions to challenge problems must be evaluated on their varying degree of:

- Soundness (Precision and Signal/Noise ratio)
- Expressivity (Applicable domain and Configurability)
- Scalability (Automation and Performance)
- Completeness (Coverage)
- Resilience (to Environment and Exploit Mitigations)

# Exploit specification

**Problem A:** Given a program  $P$ , determine the set of assertions  $S$  for which satisfying any  $a$  in  $S$  is equivalent to corrupting the program.

In other words,

what is the program  $P$  **anti-specification** ?

# Problem A code

```
F(int x, int y)
{
    int loc[4];
    int idx = G(x, y);
    if (idx > 4)
        return -1;
    assert(idx >= 4);           // do infer assertion
    loc[idx] = 0x00;
}
```

# Pre/post-conditions inference

**Problem B:** Given a program function and an assertion in the function, determine the necessary and sufficient pre/post conditions such as the assertion is true if and only if the pre/post conditions is true.

This is equivalent to the input generation problem (we start with loop-free programs).

**Note:** May need to walk over call graph to resolve problem transitively from entry point to assertion.

# Problem B code

**PRECOND (?)**

F(int x, int y)

{

int array[4];

int idx = G(x + y);

**assert(idx >= 4);**

array[idx] = 0;

}

**PRECOND (?)**

Int G(int x, int y)

{

if (x < y) return x;

else return 0;

}

**POSTCOND (?)**

# Problem B code

**PRECOND (?)**

F(int x, int y)

{

int array[4];

int idx = G(x + y);

**assert(idx >= 4);**

array[idx] = 0;

}



**PRECOND (?)**

Int G(int x, int y)

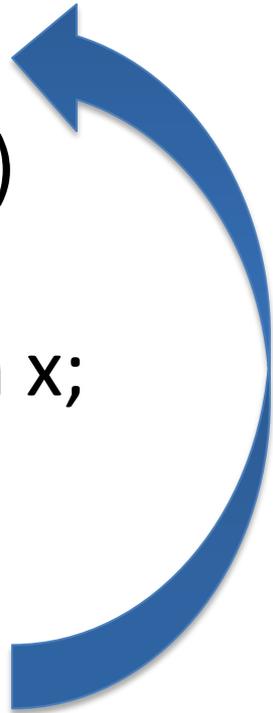
{

if (x < y) return x;

else return 0;

}

**POSTCOND (?)**



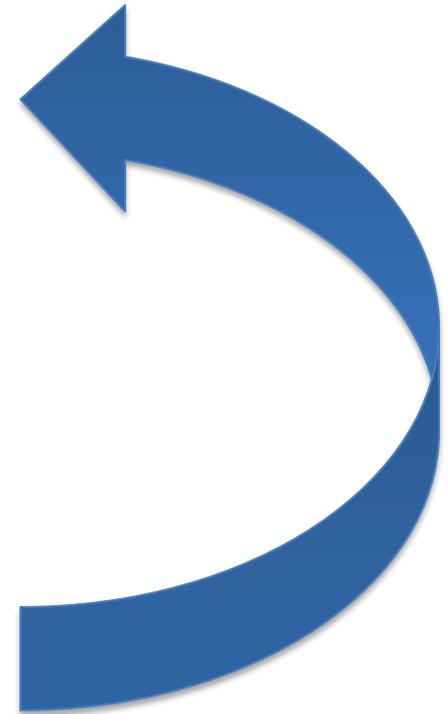
# Loop assertion inference

**Problem C:** Given a program loop and an assertion  $A_1$  within or at the loop exit-node, determine loop-assertion  $A_2$  such as  $A_1$  is true if and only if  $A_2$  is true.

**Note:** A loop invariant is an assertion that must be verified at every iteration of the loop. Given that we work on a program anti-specification, the desired exploit loop assertion may not be necessarily a loop invariant (it could just be true at some iterations).

# Problem C code

```
F(char *buf, int bufsz)
{
    int limit = bufsz;
    int idx = 0;
    loop_assertion(?)
    while (i < limit)
    {
        if (buf[i] == '{') limit++;
        else if (buf[i] == '}') limit--;
        i++;
    }
    assert(i >= sizeof(buf));
    buf[i] = 0;
}
```



# Exploit input definability

**Problem D:** Given an initial state  $I$  of a program  $P$  with functions and loops, exhibit an algorithm converging to a desired sink state.

A desired sink state can be defined as an assertion in the program (more weakly: as a set of chosen variables values).

# Problem D code

```
Precondition(?)           // D = A + B + C
F(int x, int y)
{
    int loc[4];
    int idx = G(x, y);
    if (idx > 4)
        return -1;
    while (x < y) idx++;
    assert(idx >= 4);       // how to reach this?
    loc[idx] = 0x00;
}
```

# Exploit derivability

**Problem E:** Given a concrete program input and associated program crash/log, find the longest crash trace prefix from which the desired exploitable program state can be reached.

The available program crash/log can be:

- (1) Full (unlimited access to all values ever)
- (2) Partial (only active values are tracked)
- (3) Control-only (ex: a stack or instructions trace)

# Problem E code

```
/* Crash possibly generated by fuzz testing */  
F(int x, int y)  
{  
    int loc[4];  
    if ((x + y) > 4) // buggy check  
        return (loc[x]); // program crash here  
    else if ((x + y) <= 4) { // still buggy check  
        x = G(x, y);  
        loc[x] = 0; // how to reach here?  
        return (0);  
    }  
}  
  
Int G(int x, int y) { while (x < y) x++; return (x); }
```

# Multi-interaction exploit

**Problem F:** Given a program initial state  $I$ , a desired program state  $U$  unreachable from  $I$  within any single program interaction  $R$ , determine all intermediate states  $T$  such as multiple interactions  $R_i$  can be composed to reach  $U$  as in :  $R_1(I,T) + R_2(T,U)$

**Transitive decomposition:** determine minimum number of interactions to reach  $U$  from  $I$  .

# Problem F code

```
Char *glob;
F(int x, int y)           // Ex: F and G are syscalls
{
    glob = malloc(x + y); // integer overflow
}
G()
{
    glob[x] = 0;          // array OOB access
}
```

**How to construct Trigger() = { F(); G(); } ?**

# Minimal concurrent exploit

**Problem G:** Given a program  $P$ , a desired exploit state  $S$ , and a thread count  $C$ , find the minimal state space representation to reach  $S$  in some execution of  $P$  **while retaining ability to generate corresponding concrete input.**

Note 1: *Partial Order Reduction* is a generic framework that can help control state space explosion.

Note 2: Minimal state space representation is dependent on desired sink state (as in *Abstract Interpretation*).

Example of research in this area: “Identifying and Exploiting Windows Kernel Race Conditions via Memory Access Patterns” (Jurczyk / Coldwind, 2013)

# Problem G code

```
/* Example of basic TOC/TOU vulnerability */  
/* ptr holds a valid non-volatile pointer */  
F(unsigned int *ptr)  
{  
    if (*ptr > 0x10) return;  
    global->ptr = malloc(*ptr + 1);  
    if (global->ptr == NULL) return;  
    global->ptr[*ptr] = 0x00;    // double-fetch!  
}
```

**If *ptr* is “modified under” by another thread, the second array access can go OOB.**

# Privilege Separation Inference

**Problem H:** Given a program P, determine code privilege partitioning. For each partition, determine entry points.

- (1) Determine variables guarding privilege level (PL)
- (2) Partition functions so that all elements of a given partition share the same PL. If static partitioning does not exist, determine parameters of dynamic partitioning.

Partitioning can determine multi-stage exploits paths:

- Remote → Local → Kernel
- Remote → Sandboxed → Unsandboxed
- Remote → Non-authenticated → Authenticated

# Problem H code

```
bool authenticated = false;
Int F()
{
    authenticated = check_creds();
    // execute at authenticated level
    if (authenticated)
    {
        bool res = serve_client();
        if (!res) return (send_error(E_FUNC));
        return (0);
    }
    // execute at non-authenticated level
    return (send_error(E_AUTH));
}
```

**Note:** send\_error() can execute at multiple privilege levels.

# Heap likelihood inference

**Problem I:** Given a program  $P$  using a non-deterministic heap allocator, determine most exploitable random walk(s) for  $P$  to reach “aligned” exploitable heap state.

- (1) Assume existence of heap corruption  $C$  in  $P$
- (2) Identify set  $S$  of exploitable heap states w.r.t.  $C$
- (3) Minimize steps to reach any element of  $S$

**See previous Markov exploit description. This problem is particularly relevant in presence of heap randomization.**

# Problem I code

```
Struct s1 { int *ptr; } *p1a = NULL, *p1b = NULL, *p1c = NULL;  
Struct s2 { int authenticated; } *p2 = NULL;
```

```
F() {  
    p1a = (struct s1*) calloc(sizeof(struct s1), 1);  
    p1b = (struct s1*) calloc(sizeof(struct s1), 1);  
    p1c = (struct s1*) calloc(sizeof(struct s1), 1);  
}  
G() { p2 = (struct s2*) calloc(sizeof(struct s2), 1); }  
H() { free(p1b); }  
I() { memset(p1a, 0x01, 32); }  
J() { if (p2 && p2->authenticated) puts("you win"); } // Print this  
K() { if (p1a && p1a->ptr) *(p1a->ptr) = 0x42; } // Avoid crash here
```

**Iff allocator reuses p1b's memory to allocate p2 with max probability:  
Automate best walk = { F(); H(); G(); I(); J(); }**

# Generalized program timing attack

**Problem J:** Define the necessary and sufficient execution time analysis conditions to infer value, size, or location of:

(1) A program control structure

– Return address, Function Pointer, Exception Handler, etc.

(2) A program data structure

– Heap chunk, Stack Frame, Global variable, etc.

(3) A program code fragment

– Instruction, Function, Method, etc.

In other words, automate program time inference to defeat address space randomization.

# Problem J examples

The problem is stated in very generic terms on purpose.

Resolution depends on target-specific implementation.

For two great starting point on timing inference, see:

Cryptographic timing attacks on DH, RSA, DSS and other systems  
(Paul C. Kocher, 1996)

<http://www.cryptography.com/public/pdf/TimingAttacks.pdf>

Program timing attacks on Firefox hash tables

(Paul @pa\_kt, 2012)

<http://gdtr.wordpress.com/2012/08/07/leaking-information-with-timing-attacks-on-hashtables-part-1/>

# Indirect information disclosures

**Problem K:** Define the necessary and sufficient conditions to infer the value or address of a variable without a direct read primitive, such as:

(1) Data reuse attacks

(example: partial pointer overrides)

(2) Pointer value prediction attacks

(example: pointer inference)

# Problem K examples

Resolution of Problem K depends on target-specific implementation.

Prior art on Indirect information disclosures includes:

Flash Pointer Inference (Blazakis, 2010)

<http://www.semanticscope.com/research/BHDC2010/BHDC-2010-Paper.pdf>

Garbage Collection marking attack (Blazakis, 2013)

<http://www.trapbit.com/talks/Summerc0n2013-GCWoah.pdf>

# Conclusion

- We decomposed the problem of Automated Exploit Generation in a set of challenges with clear intermediate assumptions.
- Resolving one such sub-problem is a step towards automated end-to-end solutions of larger and larger sub-classes of exploits.
- Even though Automated Exploitation is an undecidable problem, observing that most vulnerabilities are shallow allows the problem to be approached.

# Questions / Discussion

- Thanks for attending H2HC's 10<sup>th</sup> anniversary



- Questions and feedback welcomed by email