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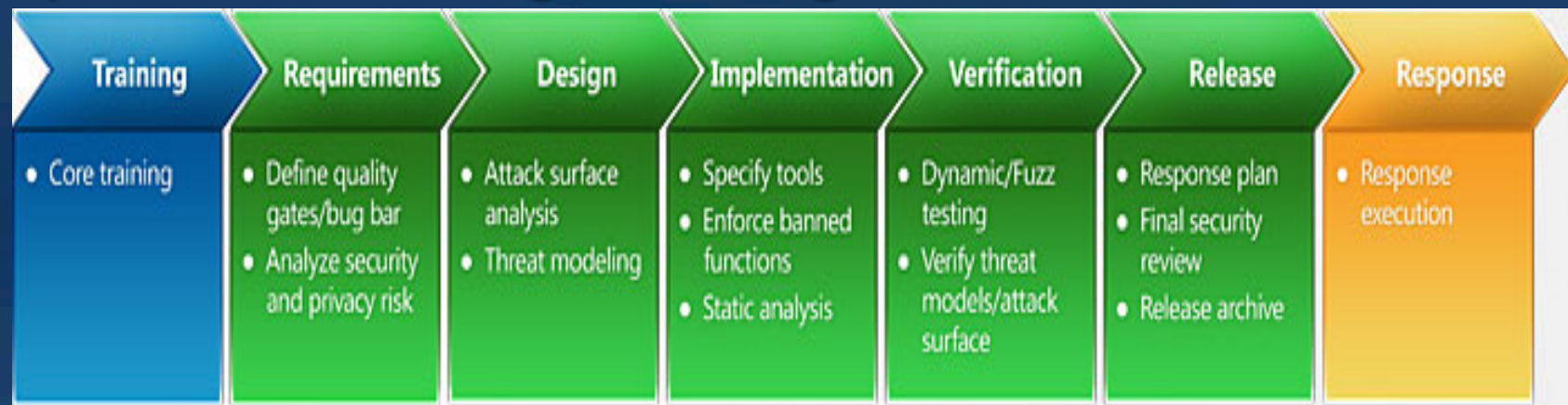
# Effective Fuzzing Strategies

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# Security is a journey, not a destination

- The Security Development Lifecycle (SDL) was created to build security into the process of engineering software



- Part of the process is verifying that the security measures in place actually work
- Fuzzing can be used for verification

# Answer These Questions First

- How do I know if my fuzzing is effective?
- Have to answer 3 other questions first
  - What approach should I take?
  - What do I look for when I fuzz?
  - How much is enough?
- Then an effective strategy can be built

# Define the Target

- What are you really fuzzing?
  - Web Service
  - Protocol Parser
  - File Parser
  - Local Service
- What Type of Data is Being fuzzed?
  - Binary
  - Text
- Are there Layered Attack Surfaces?
  - Is there a wrapper?
  - Compressed?
  - Initial validation that would reject fuzzed data?

# What are the Tools?

- Dumb Fuzzers
  - Easy to build and easy to use
  - Relatively low-investment to find a lot of bugs
  - Penetration may not be very deep
  - Preferred method by many in the industry
- Smart Fuzzers
  - High cost of entry
  - Format aware
  - Highly configurable
  - Better penetration in some cases
  - Find different bugs
  - “Grammar based” & “Whitebox”

# Smart Fuzzing Case Study

- MS07-017 had to do with repeating ANI headers
  - 1<sup>st</sup> ANIH 😊
  - 2<sup>nd</sup> ANIH ☹️
  - Wrapped by an Exception Handler
- Fuzz the framework, not just the values
- A dumb fuzzer would never find this issue
- A *grammar based* fuzzer could find it
  - Need a grammar for ANI (from where?)
  - If the grammar is too strict, it wouldn't fuzz the headers and could miss this type of issue
- The debugger has to be smart enough to catch first chance exceptions

# “Whitebox” fuzz testing

- Watch program run on seed file
  - Pick your favorite ANI file
- Treat program input as “tainted”
  - See program compare input bytes to ‘anih’
- Create constraints on tainted input
  - Constraint: bytes so-and-so equal to ‘anih’
- Solve for new input
  - State of the art constraint solver Z3
  - Solve for code coverage or buffer overflows

# Tool: Microsoft SAGE

- “Scalable, Automated, Guided, Execution”
- Daily Win7 fuzzing on 100s of machines
- Credit due to entire SAGE team & users!
  - Center for Software Excellence
    - Michael Levin, Chris Marsh, Lei Fang, Stuart de Jong, Dennis Jeffries
  - Microsoft Research
    - Patrice Godefroid, Ella Bounimova, David Molnar, Adam Kiezun, Bassem Elkarablieh, more...
    - Solver: Nikolaj Bjorner, Leonardo de Moura
  - Windows, Office, many other users



# SAGE and the ANI bug

```
RIFF...ACONLIST
B...INFOINAM....
3D Blue Alternat
e v1.1..IART....
.....
1996..anih$...$.
.....
.....
..rate.....
.....seq ..
.....
..LIST...framic
on.....
```

```
RIFF...ACONB
B...INFOINAM....
3D Blue Alternat
e v1.1..IART....
.....
1996..anih$...$.
.....
.....
..rate.....
.....seq ..
.....
..anih...framic
on.....
```

Seed  
7 hours 36 minutes, single core 2GHz box  
7706 total test cases generated  
No grammar or human guidance needed

# Fuzzing at Microsoft

- We Use Semi-Dumb Mutational Fuzzers First
  - Mutating existing data gives us a high probability of the fuzzed data being accepted by the target
- SAGE highly effective in Windows
  - Run after dumb fuzzing finished → multiple new bugs!
- Developing custom grammar based fuzzers has not provided a very good ROI
  - Needs domain knowledge to build, configure
  - Providing a minimal amount of initial “Fix-up” in a script is much easier than trying to define a type (e.g. CRC’s)
  - Dumb fuzzers are easy to deploy
- Research has led us to use a combined approach – Illustrated by the Fuzzing Olympics

# Microsoft Fuzzing Olympics

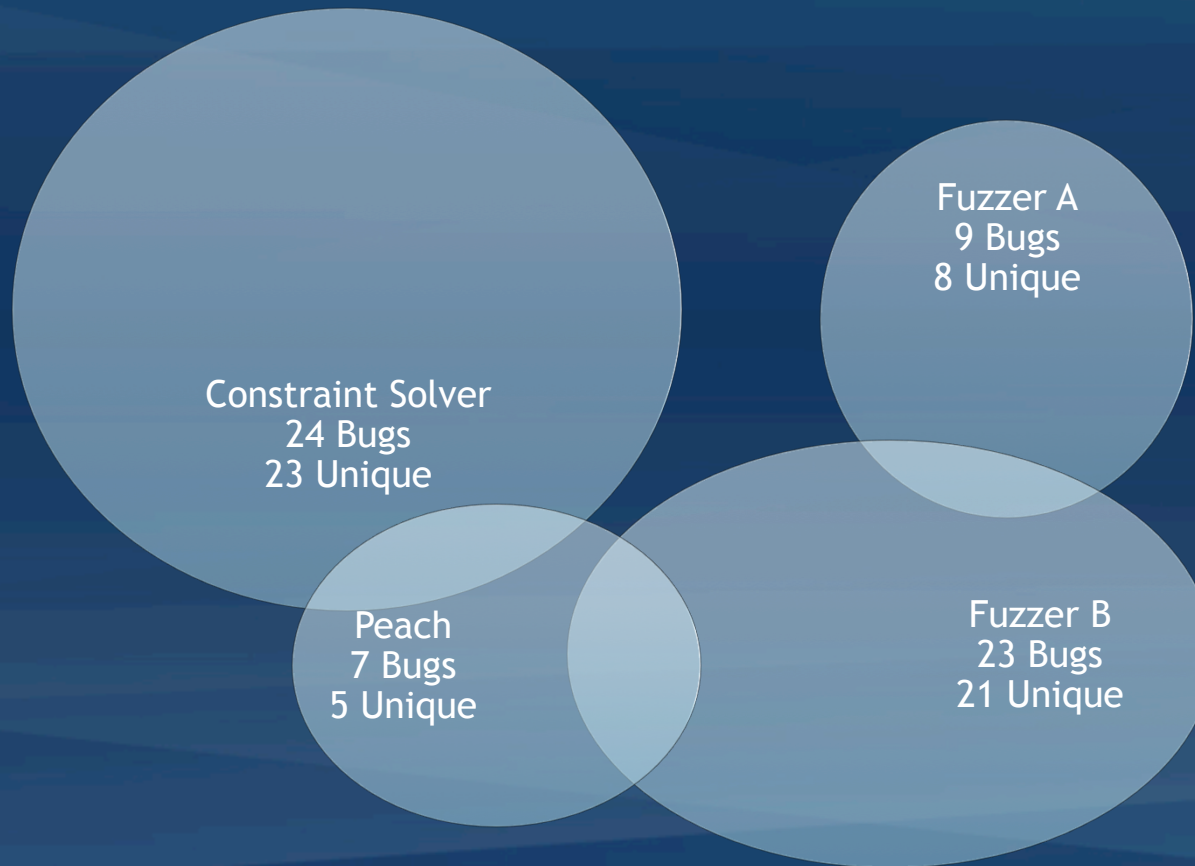
- Competition held for Bluehat 8 (Fall 2008)
- Several tools competed head-to-head
  - Several Internal Mutational Fuzzers
  - SAGE constraint solver
  - Peach – An External Mutational/Generation
- Level playing field
  - Same timeframe
  - Same targets
    - 1 text parser, 1 binary parser – both previously untested

# Olympics Findings

- No one fuzzer found ALL of the bugs
  - There was a lot of overlap in the bugs found
  - Many bugs were discovered, including one MSRC grade issue
  - Many of the bugs found were in close proximity to others in the code (major hashes)
- Developing custom grammars did not appear to provide a very good ROI
  - Dumb Fuzzing found the majority of the bugs
  - Other internal fuzzing efforts support this as well
- SAGE found more bugs (minor hashes) than any other fuzzer, but it's more complicated than that...

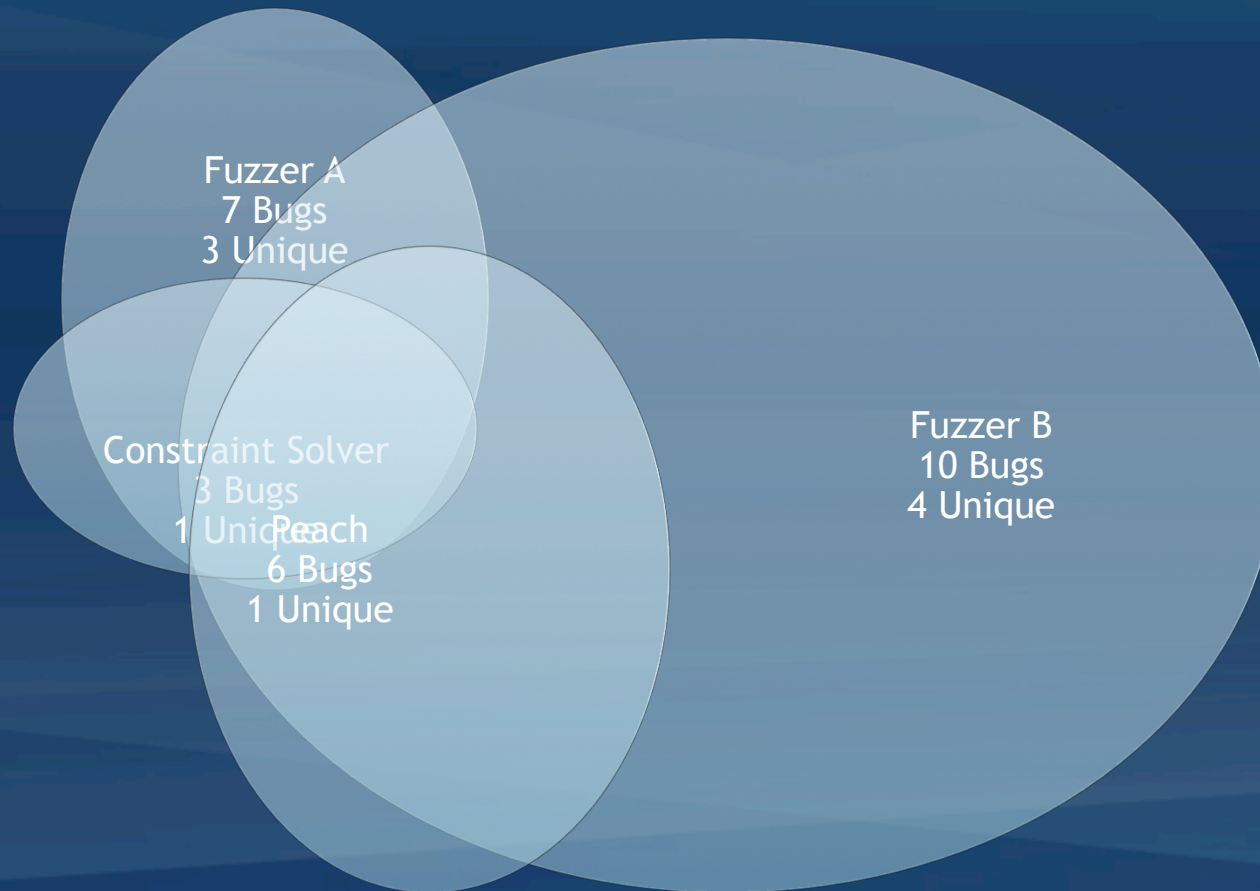
# Olympic Results – Text Parser

## 60 distinct crashes



# Olympic Results – Text Parser

## 16 underlying bugs



# Diversify!

- A Primary Rule of Fuzzing:
  - Change your approach, find different bugs
- Try a different method
  - Mutational
  - Generation
  - Sequential
  - Constraint Solving
- Fuzzing with a second approach measurably increased effectiveness
  - 10%-300% in this case

# Make the Most of Your Tools

- Check for penetration
  - Validate code coverage
  - Consider bypassing or proxying any tricky authentications, and test those separately
- Create custom fuzzers for small hard-to-reach areas
- Template Optimization (Mutation only)
  - Using the smallest number of templates with the maximum amount of Coverage
  - Template Optimization increases effectiveness by ~100%\*

\*Based on research by Gavin Thomas, MSRC Engineering



# Template Optimization Detail

- Measure code coverage for each template
- Use the following algorithm (“Greedy Search”)

```
while (FullTemplateList.count>0) {  
    BestTemplate=FullTemplateList.TemplateWithHighestCoverage();  
    OptimalTemplateList.Add(BestTemplate);  
    FullTemplateList.Remove(BestTemplate);  
    foreach (Template t in FullTemplateList) {  
        t.Coverage.Exclude(BestTemplate.Coverage);  
        if (t.BlocksCovered == 0)  
            FullTemplateList.Remove(t);  
    }  
}
```

- Use resulting templates for mutation fuzzing
- Double effectiveness in many experiments

# WHAT DO I LOOK FOR WHEN I FUZZ?

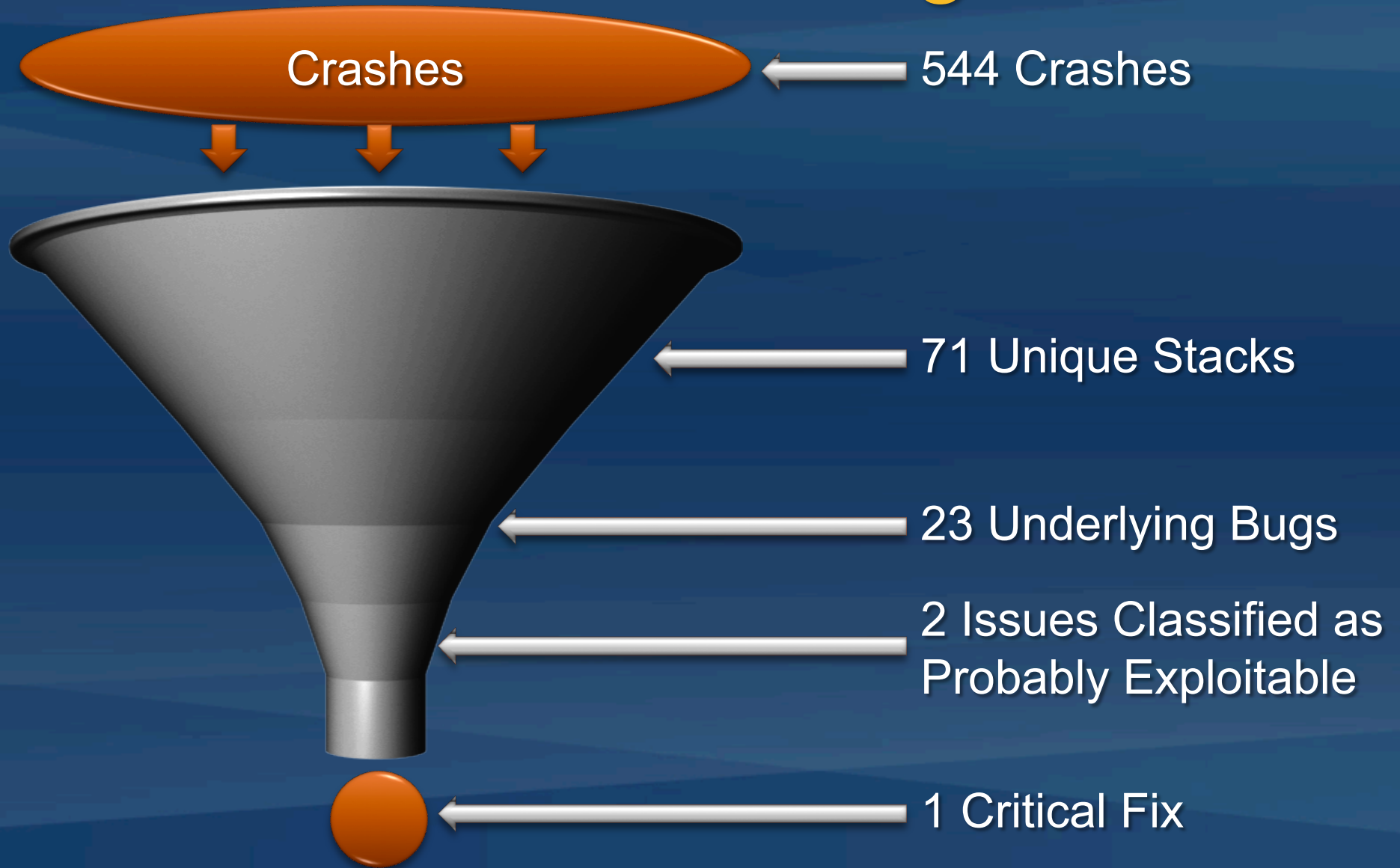
# Scaling a Difficult Problem

- Problems exist with identifying unique crashes
  - The same issue can arise multiple times
  - The same issue can arise through multiple code paths
  - The same issue can be found across multiple machines
- Classifying the crashes is another issue entirely
  - Manual inspection of crash dumps does not scale
  - Identifying security issues takes experienced resources
  - Takes a lot of time to manually analyze the crash
- Testing produces more crashes than there are resources to triage
  - Automation can help trim down the triaging
  - Grouping crashes by location in code helps

# *!exploitable* Crash Analyzer

- What is it?
  - Windows debugger extension (Windbg.exe)
  - Provides automated crash analysis
  - Provides security risk assessment
- How does it work?
  - A live crash or dump is examined using a debugger on Windows
  - !exploitable analyzes crash data
  - Identifies the uniqueness of each crash
  - Provides reliable guidance on exploitability
- What is the output? (Bucketizing)
  - An exploitability indicator identifies whether the crash is:
    - Exploitable
    - Probably Exploitable
    - Probably Not Exploitable
    - Unknown
  - A set of identifying uniqueness indicators
    - Hashes

# Automated Crash Triage



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!exploitable Crash Analyzer

*Walkthrough*

```
C:\Users\Public\CrashTools\lav.exe - WinDbg:6.11.0001.402 X86
File Edit View Debug Window Help
Command
0:000> g
(1d2c.5e8): Access violation - code c0000005 (first chance)
First chance exceptions are reported before any exception handling.
This exception may be expected and handled.
eax=00000000 ebx=20000000 ecx=0000000c edx=00000000 esi=20000000 edi=0017feb0
eip=00401145 esp=0017fe94 ebp=0017ff40 iopl=0         nv up ei pl zr na pe nc
cs=0023  ss=002b  ds=002b  es=002b  fs=0053  gs=002b             efl=00010246
image00400000+0x1145:
00401145 f3a5          rep movs dword ptr es:[edi],dword ptr [esi]
0:000> !exploitable
Exploitability Classification: PROBABLY_EXPLOITABLE
Recommended Bug Title: Probably Exploitable - Read Access Violation on Block Data Move starting at image00400000+0x1145
(Hash=0x4262220b.0x42057021)
This is a read access violation in a block data move, and is therefore classified as probably exploitable.
0:000>
```

!exploitable is run against a crash. The exploitability classification is set as Probably Exploitable, and an explanation is offered below.

This is a read access violation in a block data move, and is therefore classified as probably exploitable.

```
C:\Users\Public\CrashTools\lav.exe - WinDbg:6.11.0001.402 X86
File Edit View Debug Window Help
Command
eax=20000000 ebx=7efde000 ecx=00000000 edx=00000000 esi=00000000 edi=00000000
eip=0040106f esp=0017fe94 ebp=0017ff40 iopl=0         nv up ei pl zr na pe nc
cs=0023  ss=002b  ds=002b  es=002b  fs=0053  gs=002b             efl=00010246
*** WARNING: Unable to verify checksum for image00400000
*** ERROR: Module load completed but symbols could not be loaded for image00400000
image00400000+0x106f:
0040106f 8a09          mov     cl,byte ptr [ecx]          ds:002b:00000000=??
0:000> !exploitable -v
HostMachine\HostUser
Executing Processor Architecture is x86
Debuggee is in User Mode
Debuggee is a live user mode debugging session on the local machine
Event Type: Exception
Exception Faulting Address: 0x0
First Chance Exception Type: STATUS_ACCESS_VIOLATION (0xc0000005)
Exception Sub-Type: Read Access Violation

Faulting Instruction:0040106f mov cl,byte ptr [ecx]

Basic Block:
  0040106f mov cl,byte ptr [ecx]
    Tainted Input Operands: ecx
  00401071 mov byte ptr [ebp-91h],cl
    Tainted Input Operands: cl
  00401077 mov esi,0fffffffh
  0040107c mov dword ptr [ebp-4],esi
  0040107f jmp image00400000+0x1098 (00401098)

Exception Hash (Major/Minor): 0x4262220b.0x42052021

Stack Trace:
image00400000+0x106f
image00400000+0x1560
kernel32!BaseThreadInitThunk+0xe
ntdll!_RtlUserThreadStart+0x23
ntdll!_RtlUserThreadStart+0x1b
Instruction Address: 0x40106f

Description: Read Access Violation near NULL
Short Description: ReadAccessViolation
Exploitability Classification: PROBABLY_NOT_EXPLOITABLE
Recommended Bug Title: Read Access Violation near NULL starting at image00400000+0x106f (Hash=0x4262220b.0x42052021)

This is a user mode read access violation near null, and is probably not exploitable.

0:000>
```

The description includes a simple assessment of what happened. The exploitability classification shows that this is probably not exploitable, and the reason is explained briefly below.



```
C:\Users\Public\CrashTools\lav.exe - WinDbg:6.11.0001.402 X86
File Edit View Debug Window Help
Command
0:000> g
(1b18.1ec4): Access violation - code c0000005 (first chance)
First chance exceptions are reported before any exception handling.
This exception may be expected and handled.
eax=00000000 ebx=20000000 ecx=00000000 edx=00000000 esi=004011fe edi=00000000
eip=00401215 esp=0017fe94 ebp=0017ff40 iopl=0         nv up ei pl zr na pe nc
cs=0023  ss=002b  ds=002b  es=002b  fs=0053  gs=002b             efl=00010246
image00400000+0x1215:
00401215 ff13          call     dword ptr [ebx]          ds:002b:20000000=????????
0:000> !exploitable
Exploitability Classification: EXPLOITABLE
Recommended Bug Title: Exploitable - Read Access Violation on Control Flow starting at image00400000+0x1215 (Hash=0x4262220b.0x42057621)
Access violations not near null in control flow instructions are considered exploitable.

0:000> |
```

The title in this instance tells the user what any reasonable security expert could at a simple glance, the crash happened because the user controls execution. The title is appropriately "scary" to get the proper attention.

# Who Benefits from !exploitable?

- !exploitable Crash Analyzer helps 3<sup>rd</sup> party software Developers and Testers working on Microsoft® platforms to manage their workload
  - Developers and Testers don't have to be security experts in order to identify many security issues
  - Can identify and categorize crashes with security implications quickly
  - Helps to prioritize work based on exploitability of crashes
    - "Exploitable" Elevation of Privilege bug may need immediate attention
    - "Probably Not Exploitable" Divide by Zero bug is likely a lower priority
  - Decreases the amount of time needed to analyze crashes for exploitability
- Security Ecosystem
  - Helps standardize exploitability reporting within companies and across the Security Ecosystem
  - Integrated into fuzzers inside and outside of Microsoft

# CLOUD FUZZ TESTING

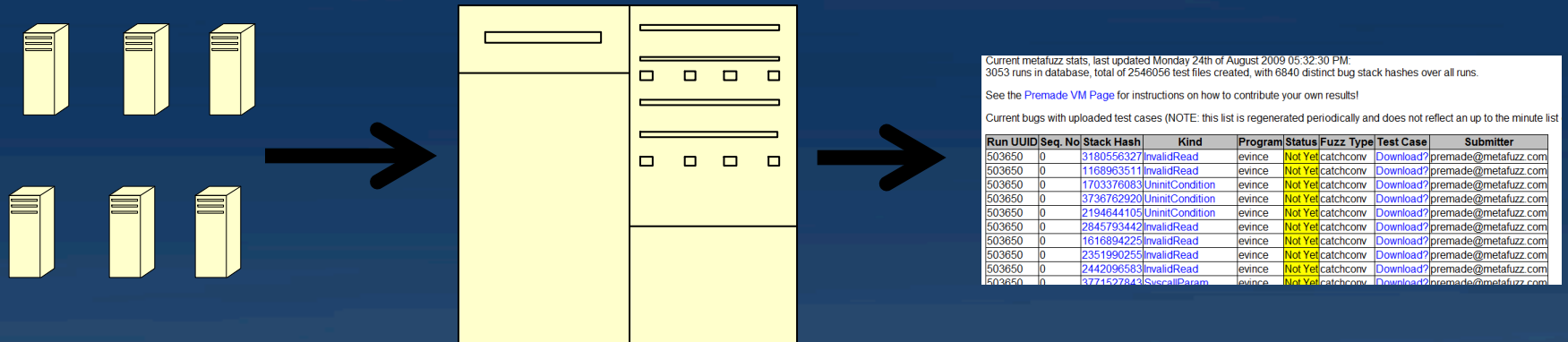
# Challenge: Fuzzing at Scale



- You need to try millions of test cases!
- “[R]unning peach on one laptop with 30 ninjas standing around it with IDA Pro open is not going to work.” – Ben Nagy
- Building infrastructure is expensive

# Rent Scale With Cloud Providers

- Rent machines from cloud provider
- Each machine fuzzes, reports data
- Organize results, feed to your test team



- D. Molnar PhD: <http://www.metafuzz.com>
  - Fuzzing on Amazon Elastic Compute Cloud
  - MySQL DB for results, PHP front end

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# Minifuzz Plus Visual Studio Team Foundation Server

Cloud Fuzzing Demo

Minifuzz:

<http://edge.technet.com/Media/minifuzz-overview-and-demo/>

Team Foundation Server 2008 trial:

<http://www.microsoft.com/downloads/details.aspx?>

FamilyId=B0155166-B0A3-436E-  
AC95-37D7E39A440C&displaylang=en

# Conclusions – A Practical Guide to Fuzzing

- Invest up front in choosing your approach
  - Identify targets
  - Choose the best tools
  - Choose optimal inputs (Template Reduction)
  - Consider leveraging Cloud resources
- Diversify
  - Consider a mix of fuzzing tools and approaches
- Use !exploitable Crash Analyzer
  - Reduces triage time
  - Highlights important security issues quickly

# Links

- For more information on Microsoft's Security Science and !exploitable Crash Analyzer, please visit:
  - <http://www.microsoft.com/security/msec/>
- For more information about SAGE:
  - <http://channel9.msdn.com/posts/Peli/Automated-Whitebox-Fuzz-Testing-with-SAGE/>
  - [http://research.microsoft.com/en-us/um/people/pg/public\\_psfiles/ndss2008.pdf](http://research.microsoft.com/en-us/um/people/pg/public_psfiles/ndss2008.pdf)
- And the Security Research & Defense (SRD) blog:
  - <http://blogs.technet.com/srd>



**QUESTIONS?**

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