



# Data Mining a Mountain of Vulnerabilities

Chris Wysopal

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# 10 Biggest Breaches of 2011

Organization	Cause	Application Vulnerability Details
Comodo	Application Vulnerability	SQL Injection
RSA	Spearphishing + Application Vulnerability	Memory corruption
Epsilon	Unknown Hack	
Wordpress	Unknown Hack	
Sony Playstation Network	Application Vulnerability	Unknown
Citibank	Application Vulnerability	Authorization Error
Cyworld	Unknown Hack	
Tricare	Lost media	
Facebook	Social Engineering	
Steam	Unknown Hack	

# Why so many application related breaches?

Question:

Who would release a product riddled with security problems simply to make money?

Answer:

Pretty much every vendor out there.

- Andrew Hay, Senior Security Analyst



# Building a Secure Application

- ✓ Even educated developers make mistakes
- ✓ It is difficult but easier than in the past
- ✓ Automation can detect and point to about 2/3 of the top vulnerability categories
- ✓ It's a dereliction of duty to not perform adequate security testing before shipping

# Waterholing trend

- ✓ Attackers increasing vectors for breaching perimeter security:
  - ✓ Bribe insider
  - ✓ Removeable media (USB. The floppy is back)
  - ✓ Email attachment
  - ✓ Compromised website: the waterhole.
- ✓ RSA recently reported on VOHO campaign
- ✓ Could waterholes overtake spearphishing?

So let's mine some data!

# The Data Set

- ✓ Applications from over 300 commercial and US government customers
- ✓ **Scanned** 9,910 applications over past 18 months
- ✓ Ranged in size from 100KB to 6GB
- ✓ Software was pre-release and in production
- ✓ Internally built, outsourced, open source, and commercial ISV code



## Application Metadata

- ▶ Industry vertical
- ▶ Application supplier (internal, third-party, etc.)
- ▶ Application type
- ▶ Assurance level
- ▶ Language
- ▶ Platform

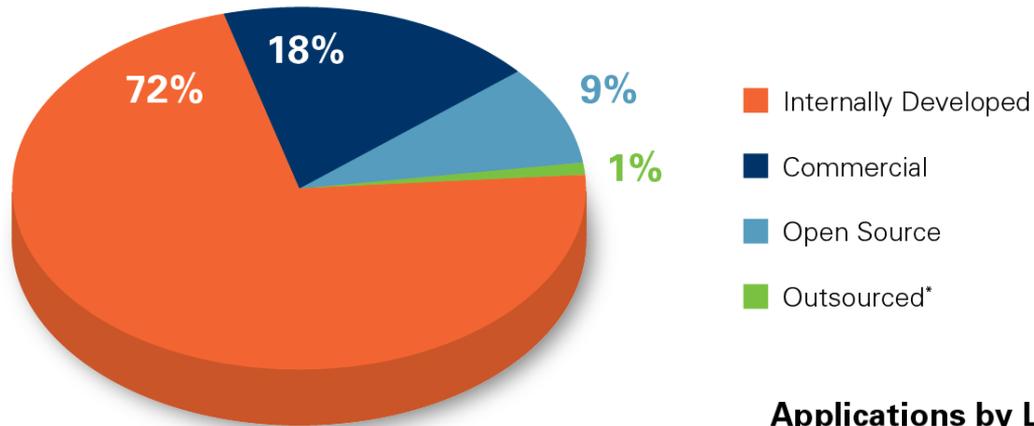
## Scan Data

- ▶ Scan number
- ▶ Scan date
- ▶ Lines of code
- ▶ Flaw type

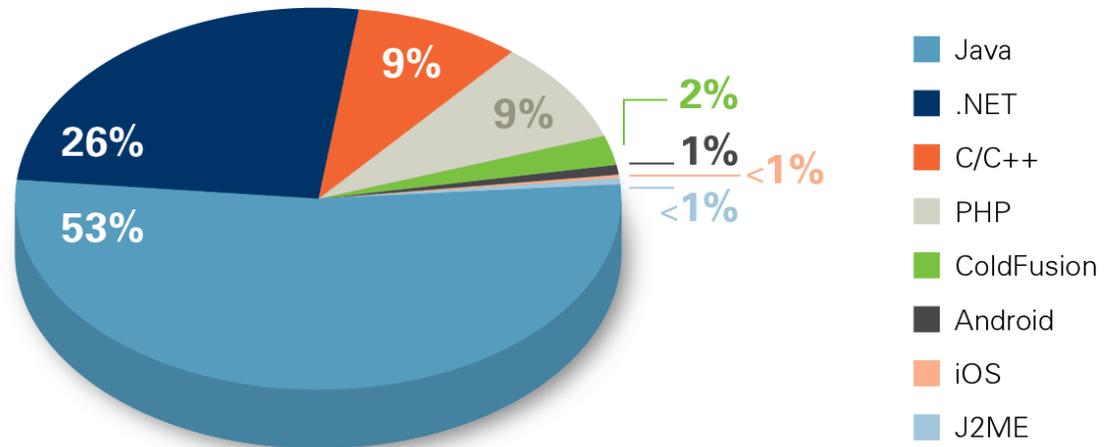
## Application Security Metrics

- ▶ Flaw counts
- ▶ Flaw percentages
- ▶ Application count
- ▶ Risk-adjusted rating
- ▶ First scan acceptance rate
- ▶ Time between scans
- ▶ Days to remediation
- ▶ Scans to remediation
- ▶ CWE/SANS Top25 (pass/fail)
- ▶ OWASP Top Ten (pass/fail)
- ▶ Custom policies

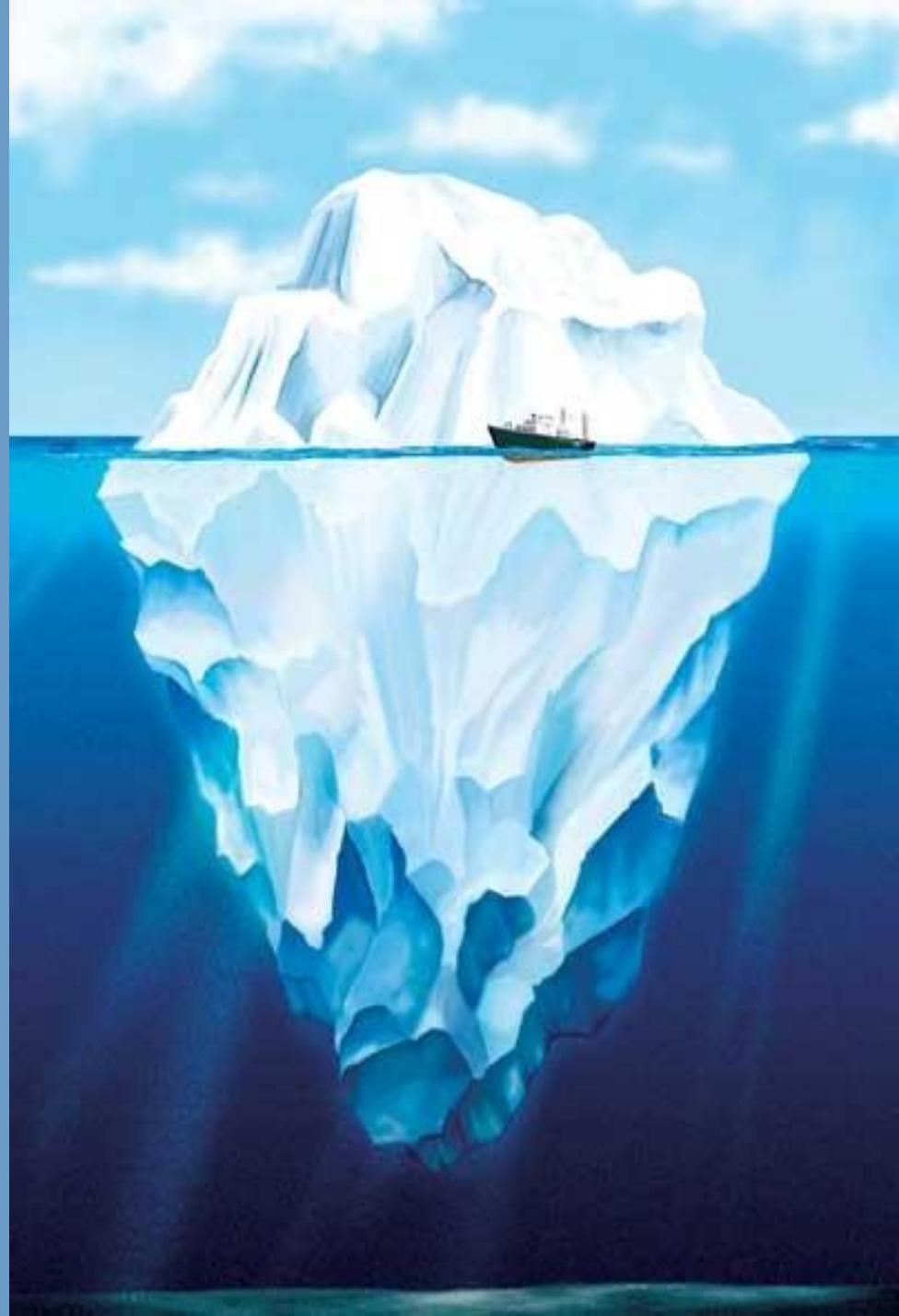
## Applications by Supplier Type



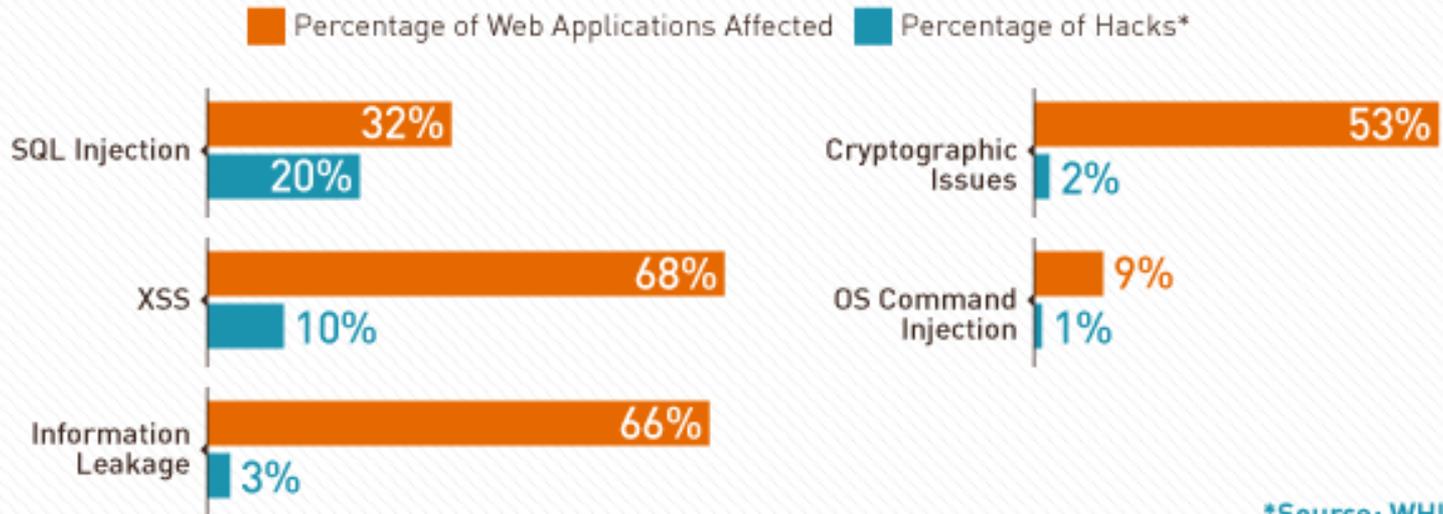
## Applications by Language Family



The latent  
Vulnerabilities  
vs.  
The Attacks

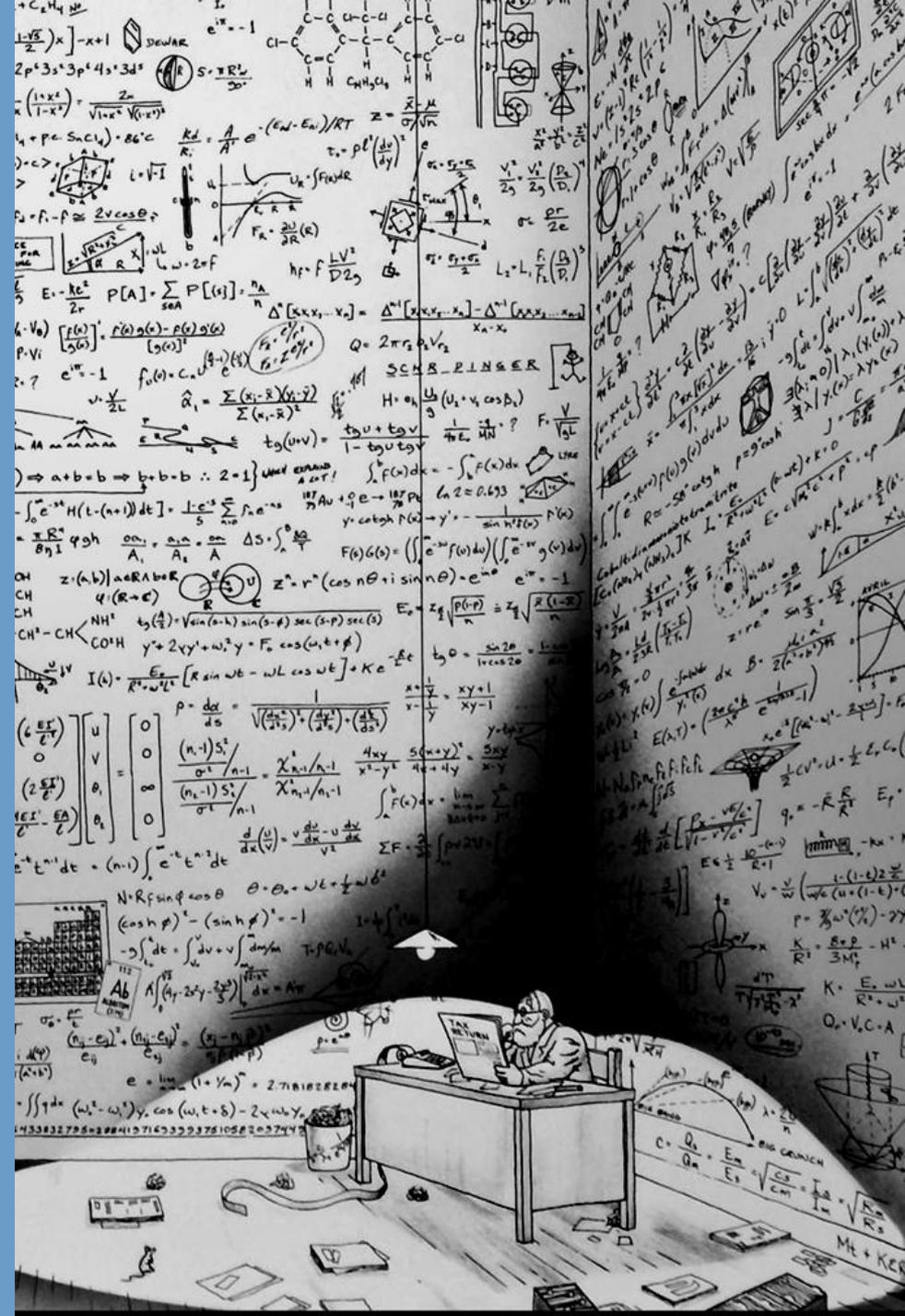


# Top 5 Attacked Web Application Vulnerabilities



While other flaws such as XSS account for a higher volume of findings, SQL injection accounts for 20 percent of hacks.

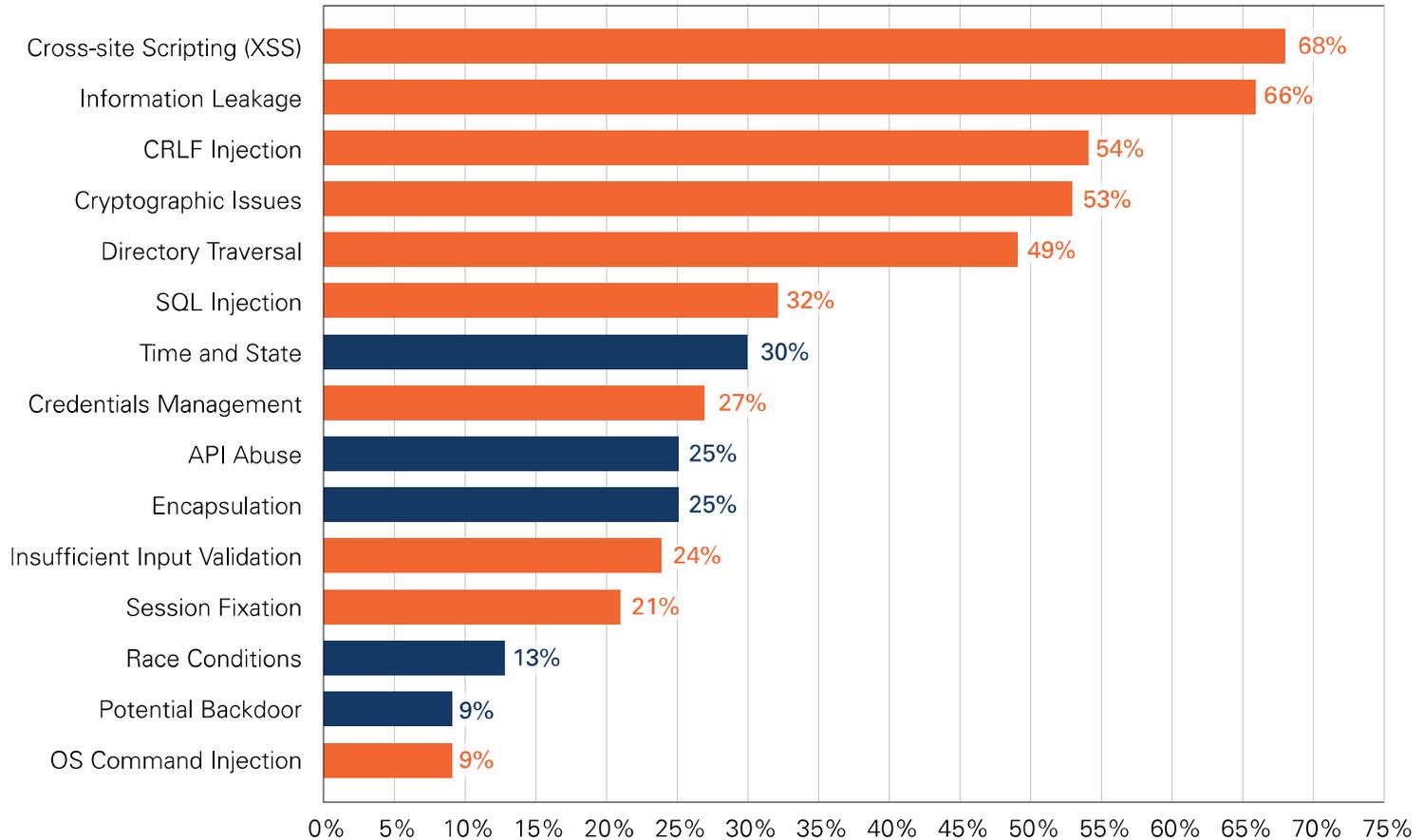
Let's take a closer look at the numbers



## Top Vulnerability Categories

(Percent of Applications Affected for Web Applications)

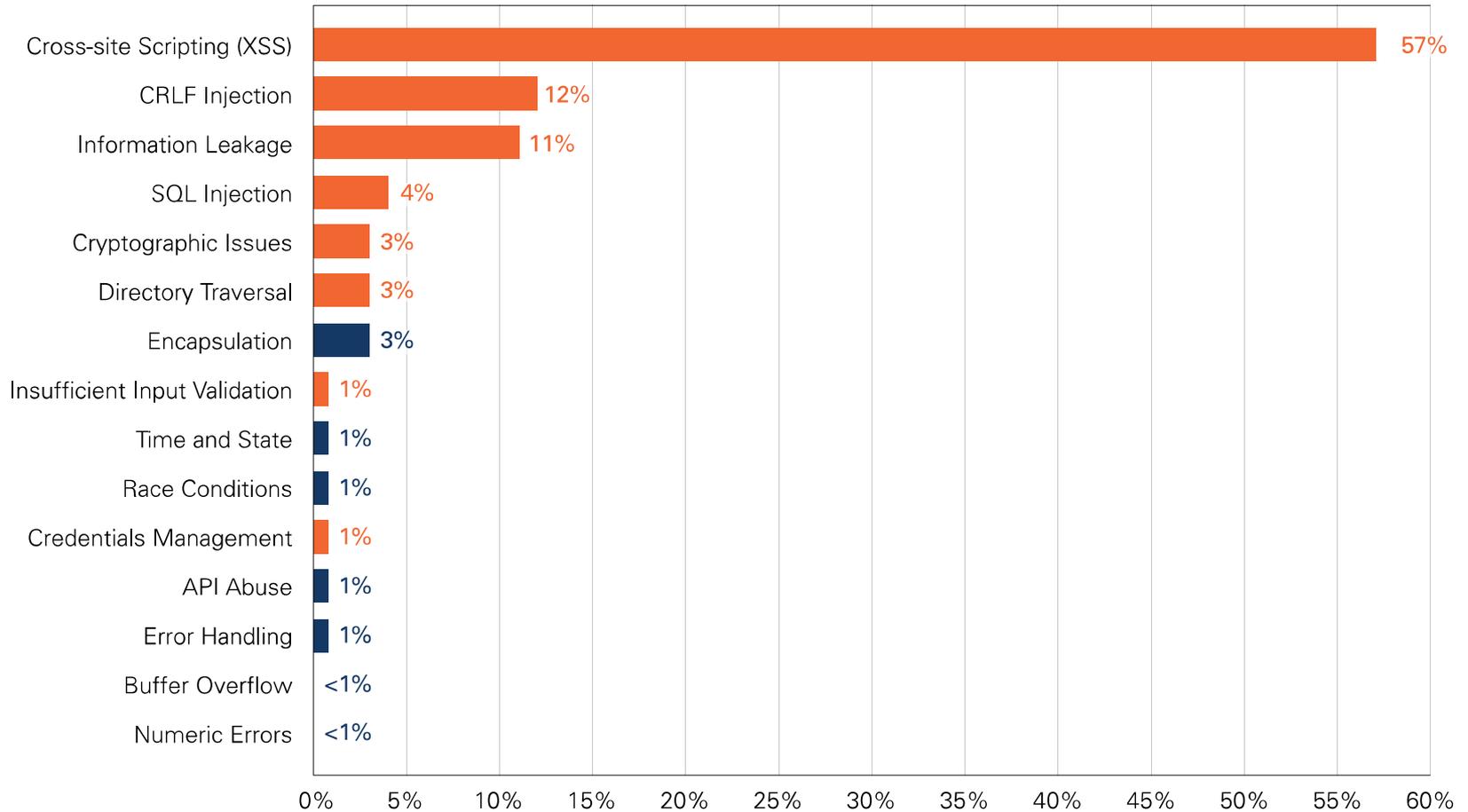
■ Indicate categories that are in the OWASP Top 10



## Top Vulnerability Categories

(Overall Prevalence for Web Applications)

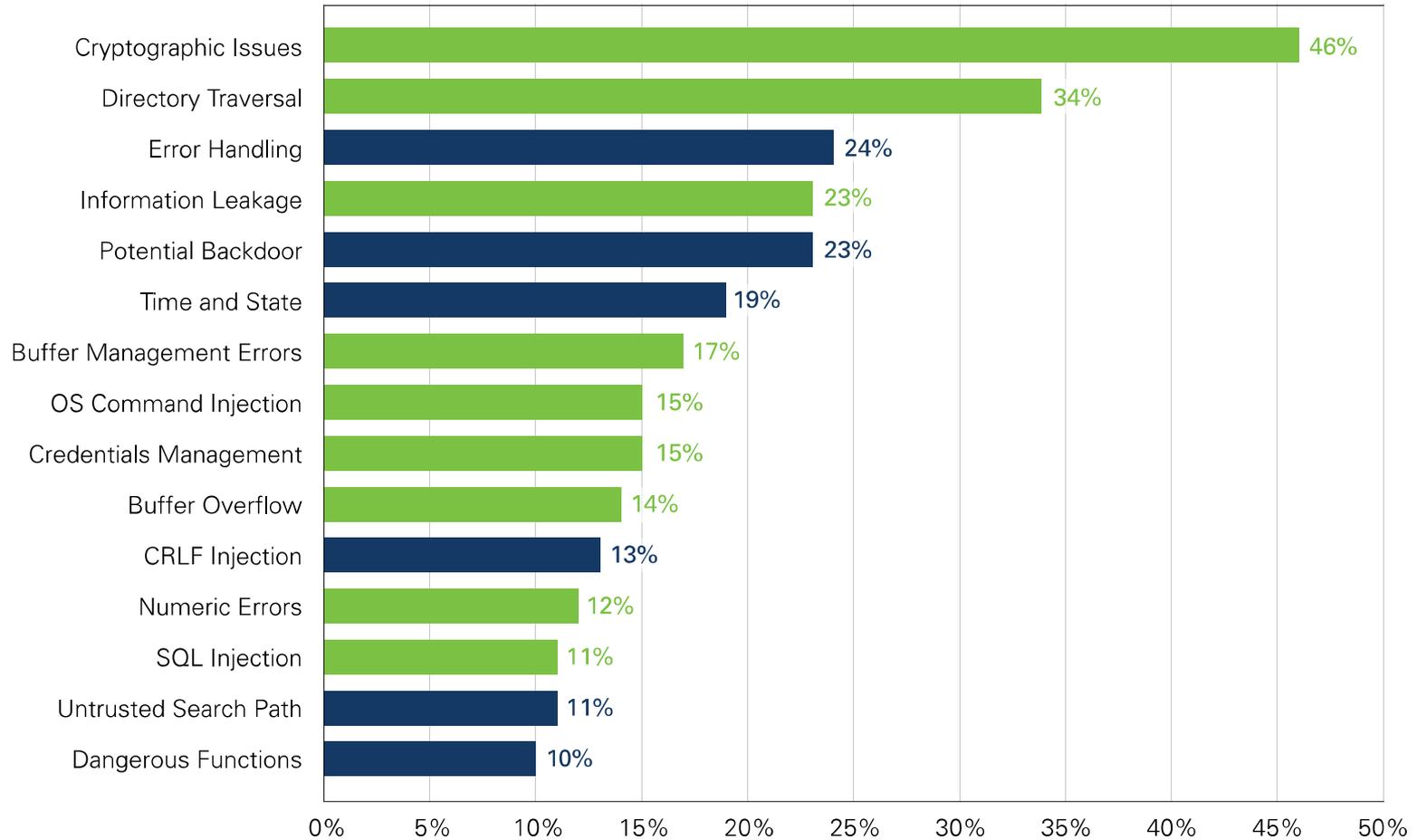
■ Indicate categories that are in the OWASP Top 10



## Top Vulnerability Categories

(Percentage of Applications Affected for Non-Web Applications)

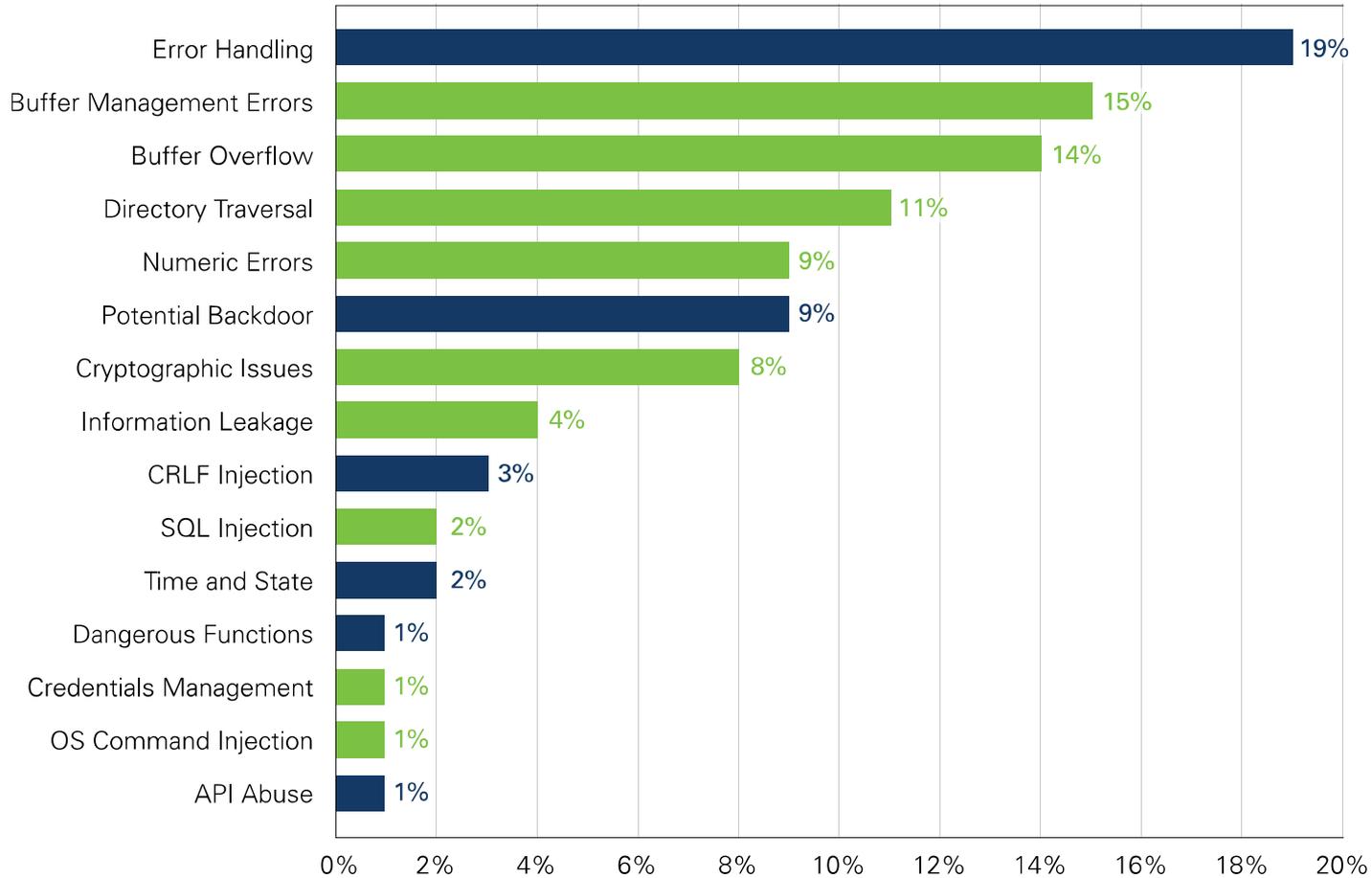
■ Indicate categories that are in the CWE/SANS Top 25



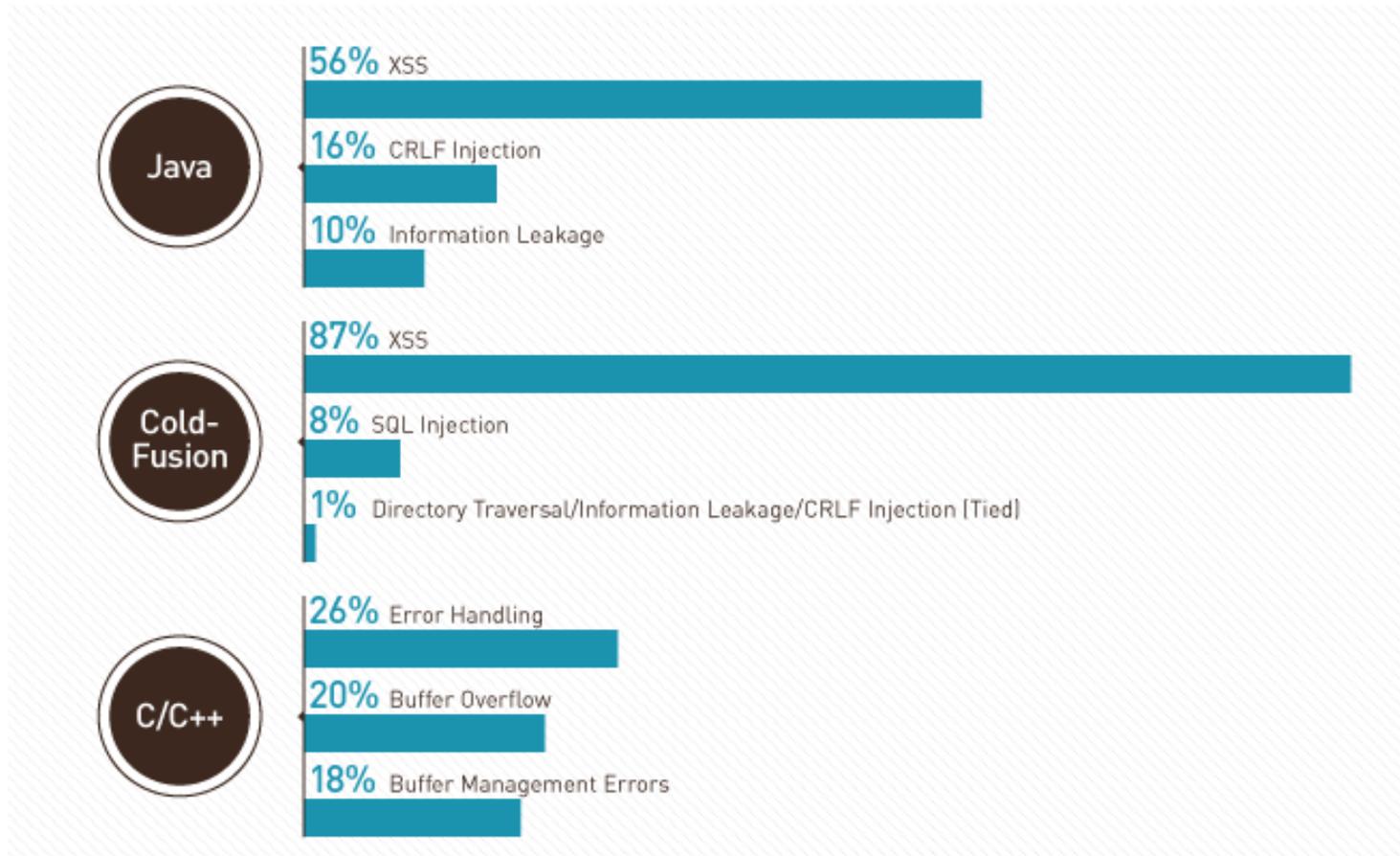
## Top Vulnerability Categories

(Overall Prevalence for Non-Web Applications)

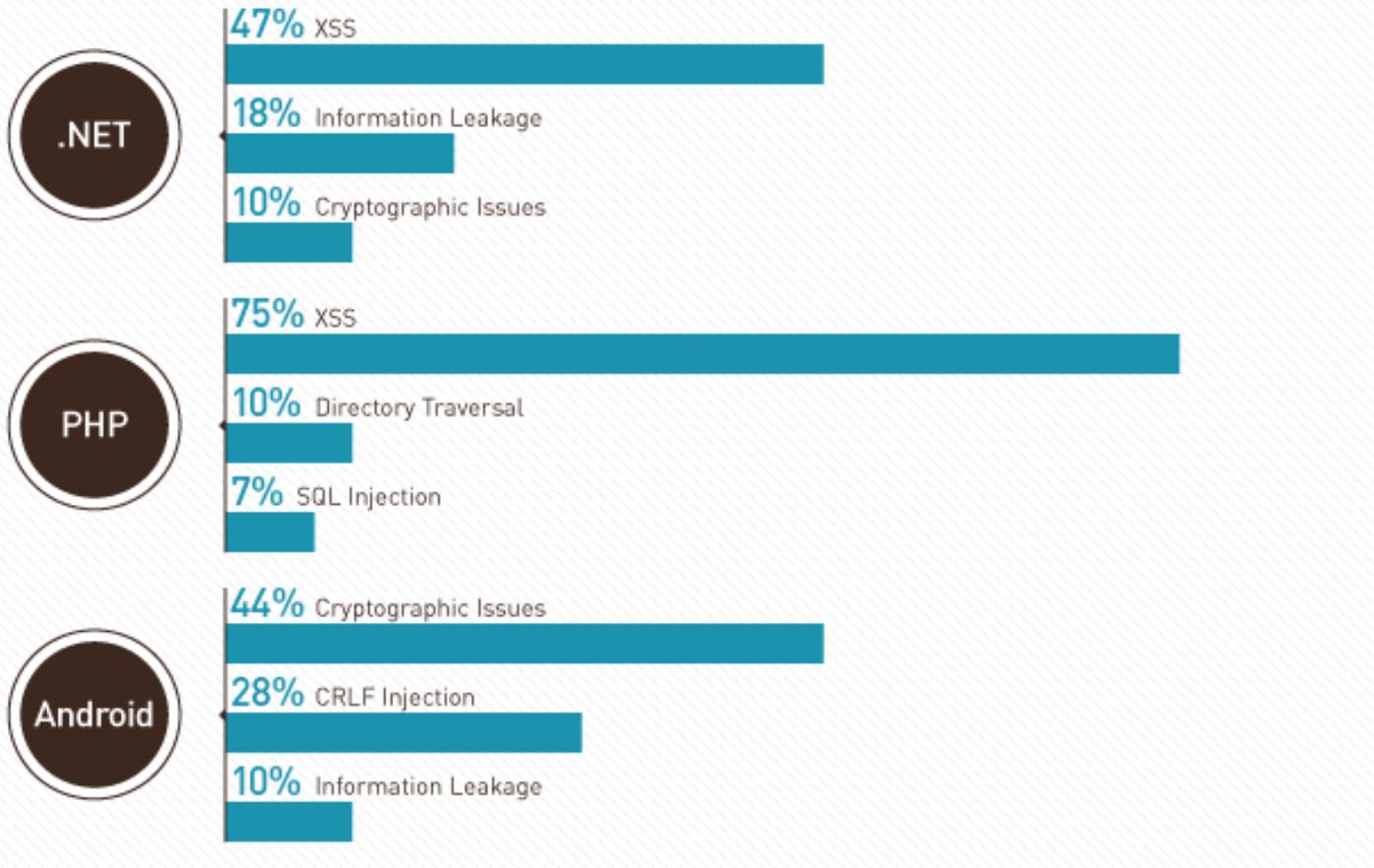
■ Indicate categories that are in the CWE/SANS Top 25



# Top 3 Vulnerabilities by Language



# Top 3 Vulnerabilities by Language



# Different developers deliver different vulns

Vulnerability Distribution by Supplier

Internally Developed	Commercial	Open Source	Outsourced*
Cross-site Scripting (XSS) 58%	Cross-site Scripting (XSS) 44%	Cross-site Scripting (XSS) 41%	CRLF Injection 47%
CRLF Injection 12%	Information Leakage 11%	Directory Traversal 13%	Cross-site Scripting (XSS) 28%
Information Leakage 10%	CRLF Injection 8%	Information Leakage 13%	Information Leakage 6%
SQL Injection 4%	Directory Traversal 6%	CRLF Injection 11%	Encapsulation 6%
Cryptographic Issues 3%	Error Handling 5%	Cryptographic Issues 8%	Cryptographic Issues 5%
Encapsulation 3%	Cryptographic Issues 5%	SQL Injection 3%	Credentials Mgmt 3%
Directory Traversal 3%	Buffer Mgmt Errors 4%	Error Handling 2%	Directory Traversal 2%
Insufficient Input Validation 1%	Buffer Overflow 3%	Time and State 2%	API Abuse 1%
Time and State 1%	Potential Backdoor 3%	API Abuse 2%	Time and State 1%
Race Conditions 1%	SQL Injection 3%	Insufficient Input Validation 1%	Insufficient Input Validation 1%

Table 2: Vulnerability Distribution by Supplier  
(\*Small sample size)

# Different industries accept different vulns

Vulnerability distribution by industry

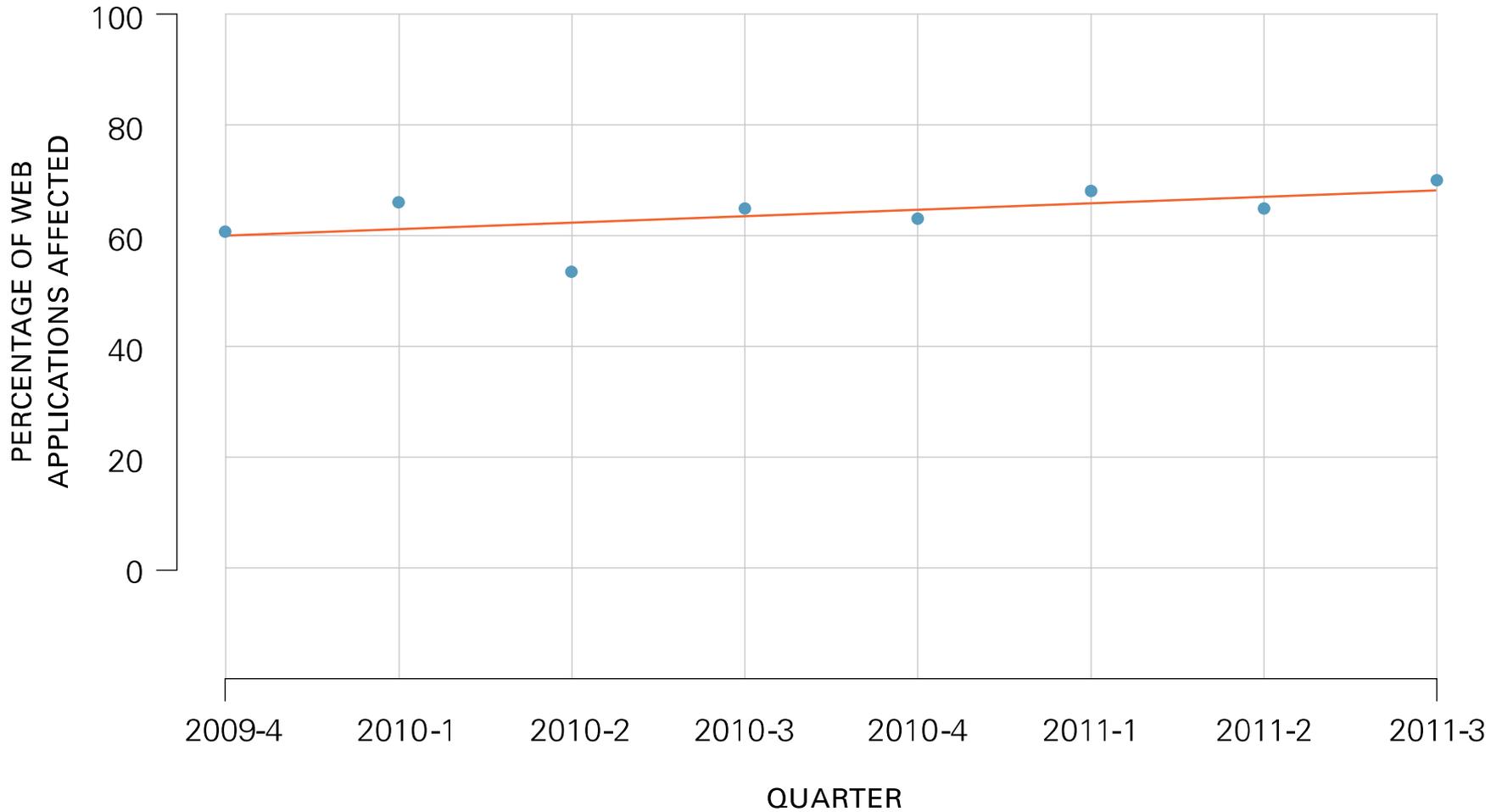
Government ▼		Finance		Software	
<b>Cross-site Scripting (XSS)</b>	75%	Information Leakage	68%	Cryptographic Issues	59%
<b>Information Leakage</b>	66%	Cross-site Scripting (XSS)	67%	Information Leakage	59%
<b>SQL Injection</b>	40%	Cryptographic Issues	53%	Cross-site Scripting (XSS)	55%
<b>Cryptographic Issues</b>	35%	CRLF Injection	51%	CRLF Injection	54%
<b>Directory Traversal</b>	31%	Directory Traversal	47%	Directory Traversal	54%
<b>Insufficient Input Validation</b>	27%	Insufficient Input Validation	30%	Time and State	39%
<b>CRLF Injection</b>	27%	SQL Injection	29%	Credentials Mgmt	31%
<b>OS Command Injection</b>	19%	Time and State	28%	SQL Injection	30%
<b>Time and State</b>	18%	API Abuse	26%	API Abuse	25%
<b>Credentials Mgmt</b>	16%	Encapsulation	25%	Encapsulation	23%
<b>API Abuse</b>	14%	Credentials Mgmt	24%	Session Fixation	18%
<b>Potential Backdoor</b>	12%	Session Fixation	19%	OS Command Injection	14%
<b>Session Fixation</b>	11%	Race Conditions	13%	Potential Backdoor	14%
<b>Encapsulation</b>	11%	Potential Backdoor	10%	Race Conditions	13%
<b>Untrusted Search Path</b>	3%	OS Command Injection	6%	Insufficient Input Validation	13%

Are  
DEVELOPERS  
making any  
progress at  
eradicating  
cross-site  
scripting or  
sql  
injection?



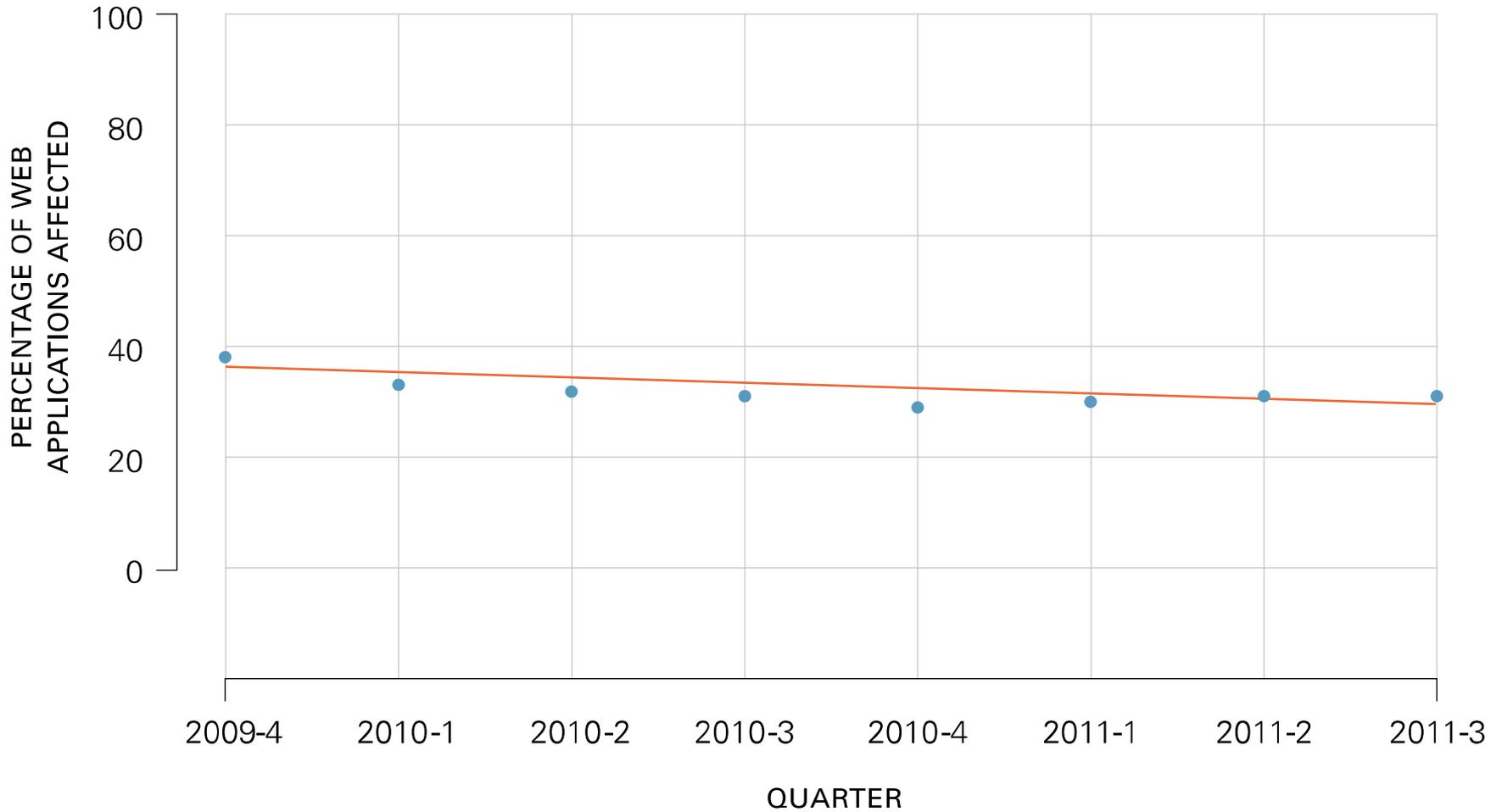
## Quarterly Trend for XSS

pvalue = 0.124: Statistically, the trend is flat.



## Quarterly Trend for SQL Injection

pvalue = 0.048: Statistically, the trend is down.

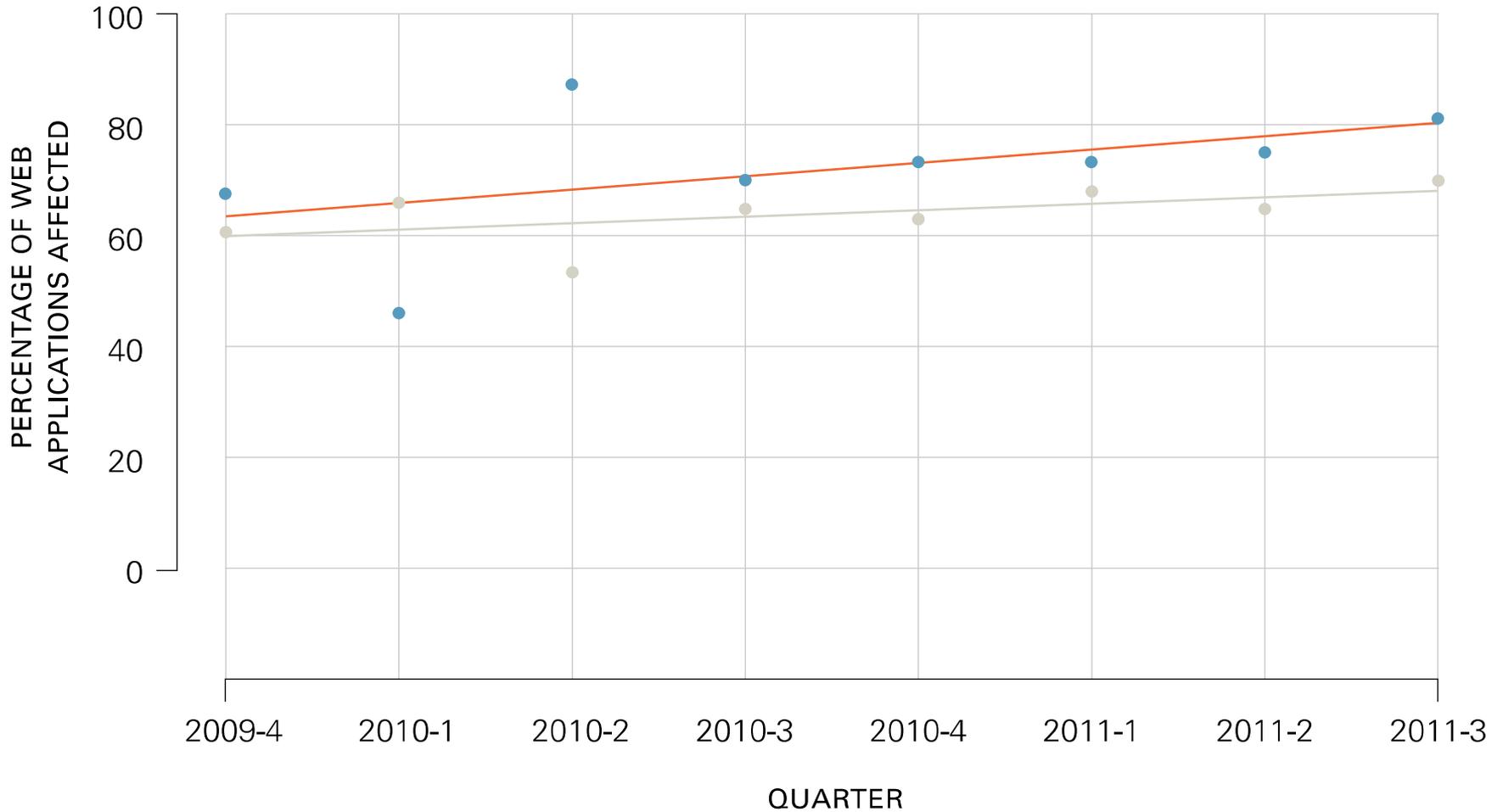


Dare we ask,  
How is the  
U.S.  
government  
sector doing?



## Quarterly Trend for XSS in Government Web Applications

pvalue = 0.215: Statistically, the trend is flat.



What  
percentage of  
WEB  
applications  
fail OWASP  
TOP TEN?

a) 34%

b) 57%

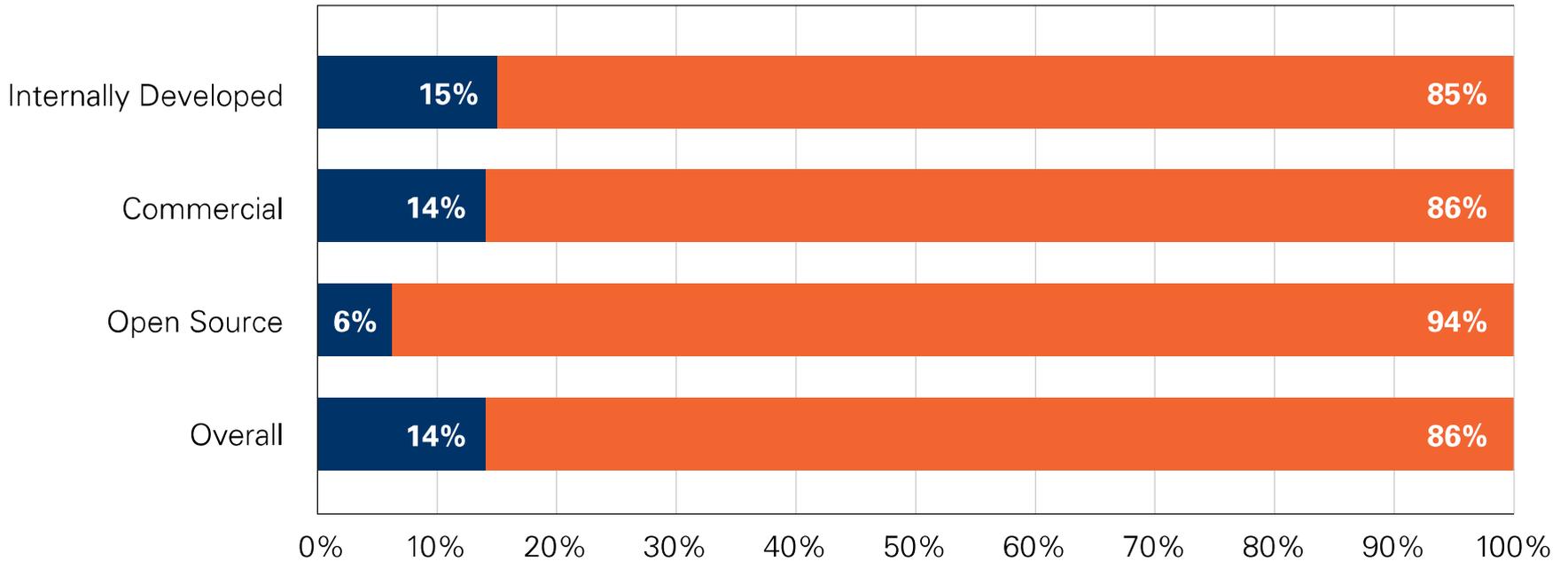
c) 86%

d) 99%

## OWASP Top 10 Compliance by Supplier on First Submission

(Web Applications)

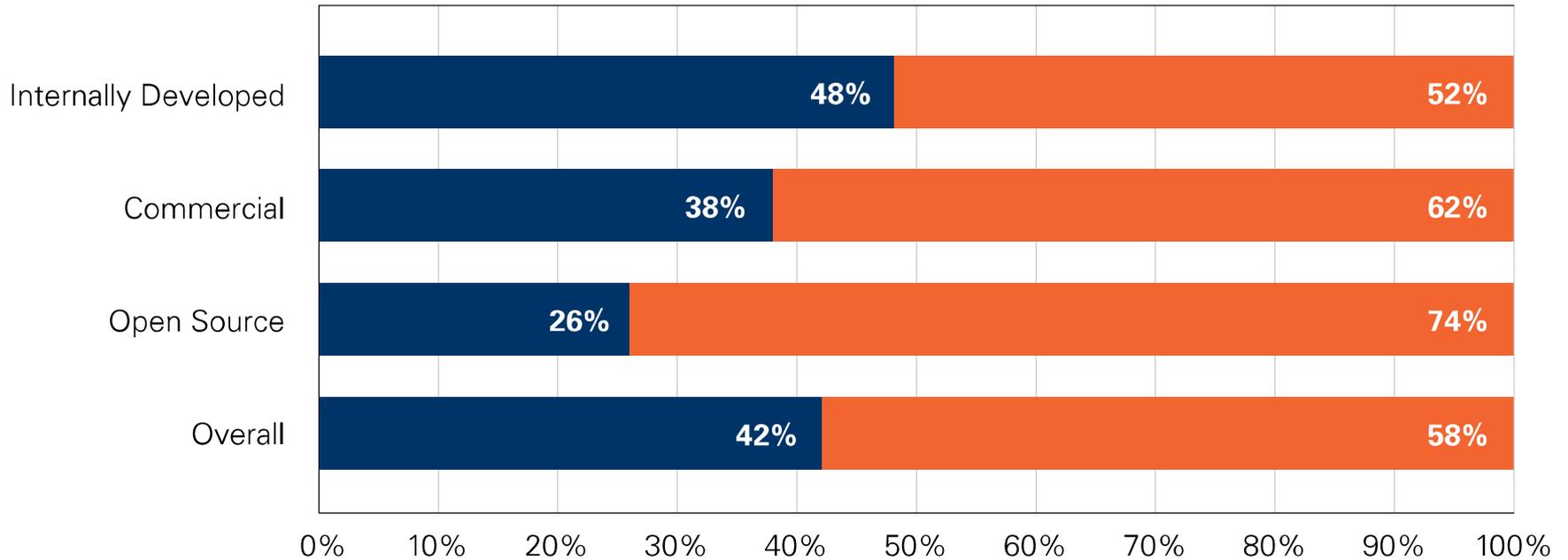
■ Acceptable    ■ Not Acceptable



## CWE/SANS Top 25 Compliance by Supplier on First Submission

(Non-Web Applications)

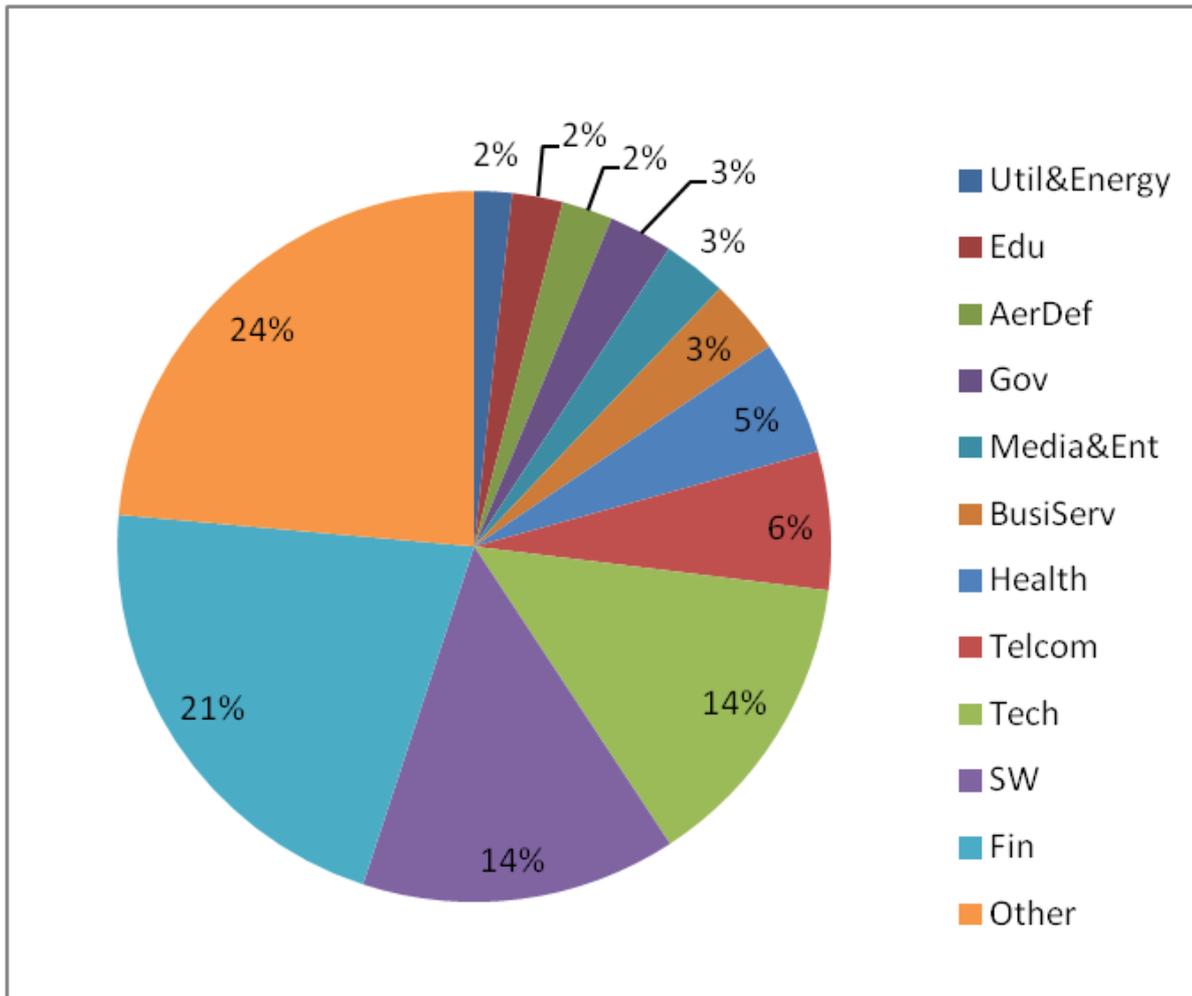
■ Acceptable    ■ Not Acceptable



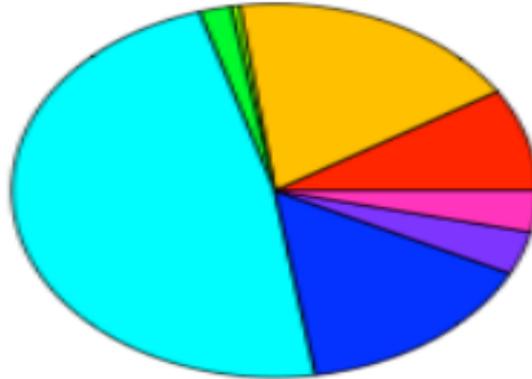
Who is  
holding their  
software  
vendors  
accountable?



# Enterprise Industries

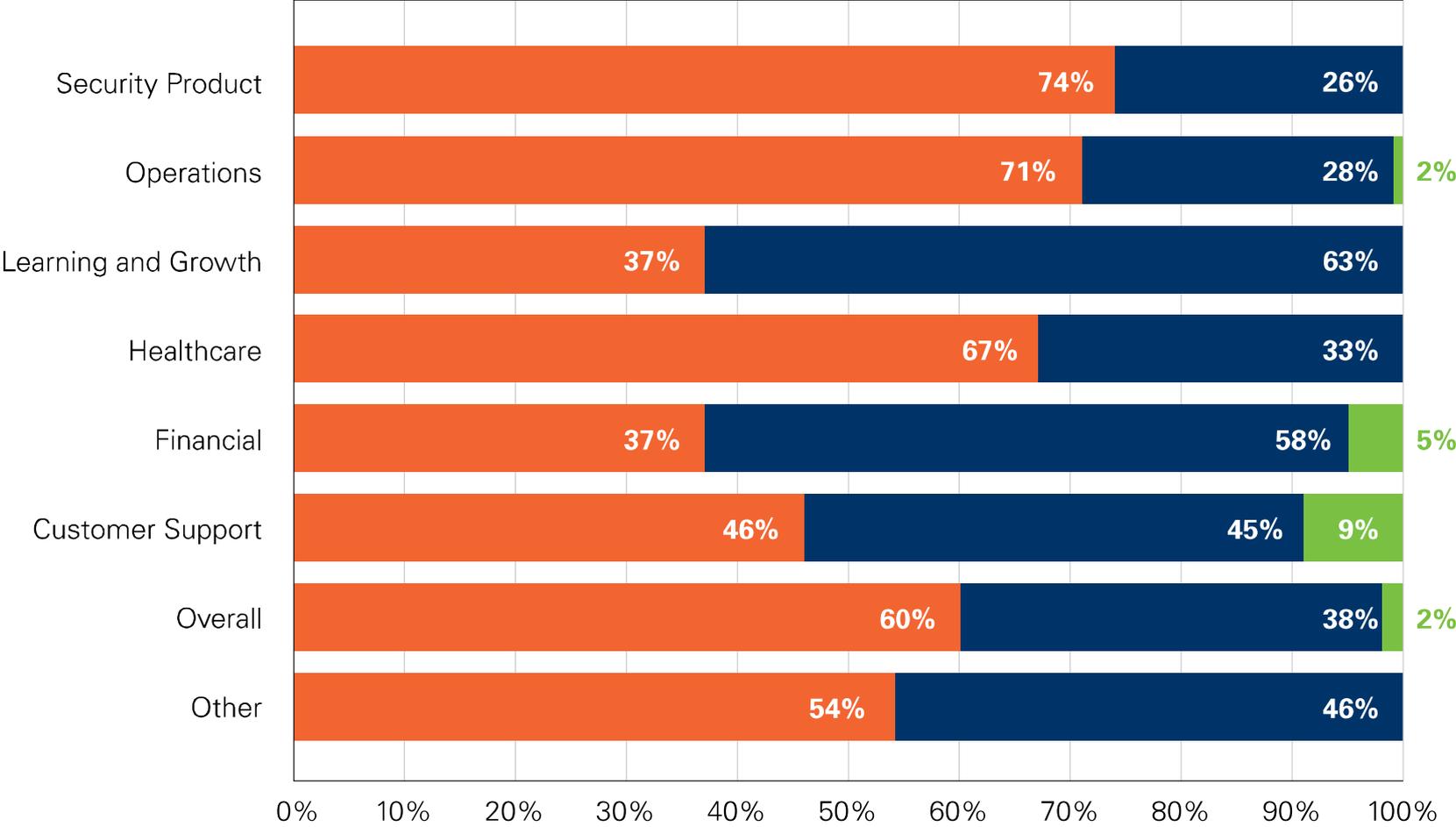


# 3<sup>rd</sup> Party Application Purpose



# Performance Against Enterprise Policy by Application Purpose

Fail Pass Pass Conditionally



No discernable difference in security quality score on first submission of applications from public and private software companies. Contrary to expectation!

Security Quality Score Distribution for Public vs. Private Software Company

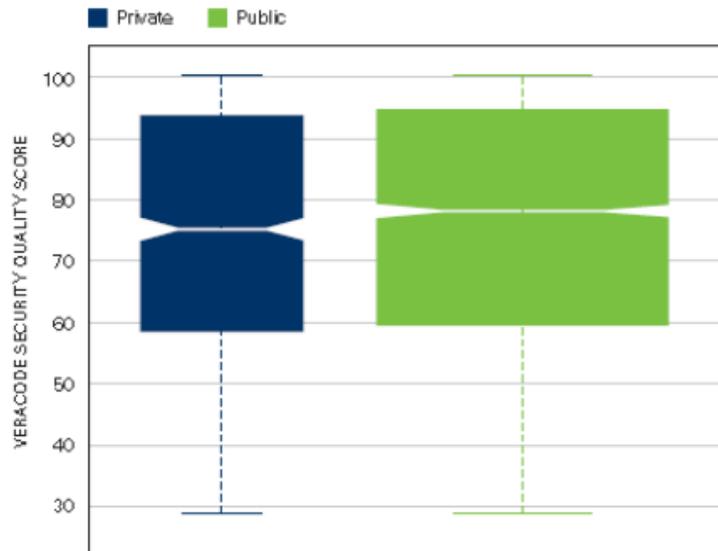


Figure 25: Security Quality Score Distribution for Public vs. Private Software Company

Security Quality Score Distribution by Software Company Revenue

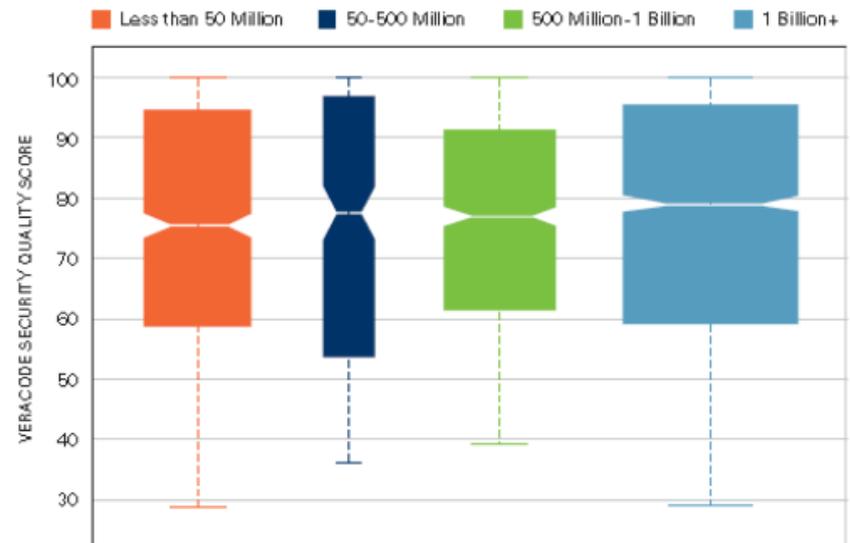


Figure 26: Security Quality Score Distribution by Software Company Revenue

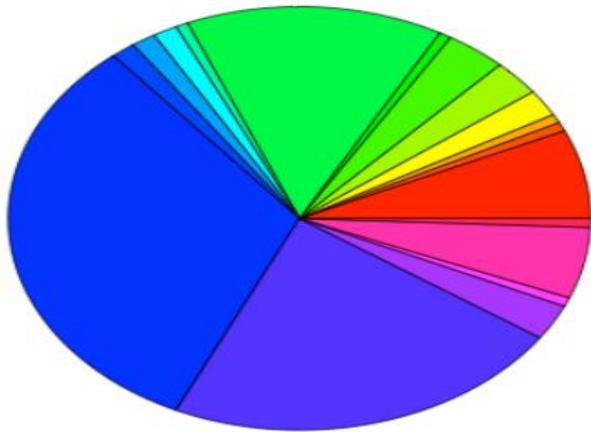
No discernable difference in security quality score on first submission of applications from software companies in different revenue brackets.

So I hear  
you can run  
applications  
on smart  
phones?

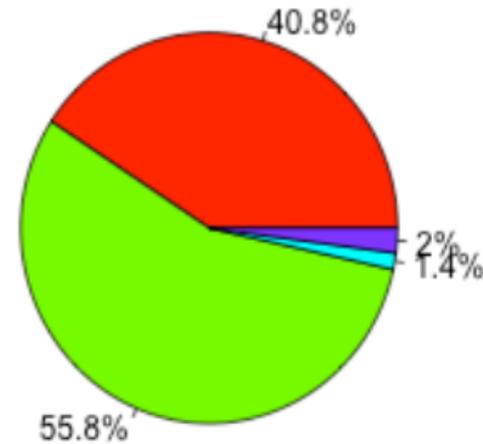


# Distribution by industry

# Distribution by supplier type



- bank - 6.8%
- buiserv - 0.7%
- comm - 0.7%
- comphard - 2%
- compserv - 2.7%
- compsoft - 3.4%
- engine - 0.7%
- finserv - 14.3%
- food - 0.7%
- health - 1.4%
- hospity - 1.4%
- ins - 1.4%
- media - 32%
- other - 22.4%
- retail - 2.7%
- secprodserv - 0.7%
- tech - 5.4%
- teleserv - 0.7%



- Commercial - 40.8%
- Internally Developed - 55.8%
- Open Source - 1.4%
- Outsourced - 2%

# Percentage of Android Apps Affected

	<b>AffectedAppVerPct</b>
<b>Cryptographic Issues</b>	68.5
<b>CRLF Injection</b>	47.2
<b>Information Leakage</b>	39.1
<b>Time and State</b>	27.9
<b>SQL Injection</b>	23.4
<b>Directory Traversal</b>	10.7
<b>Cross-Site Scripting (XSS)</b>	6.1
<b>Authorization Issues</b>	5.6
<b>Credentials Management</b>	5.1

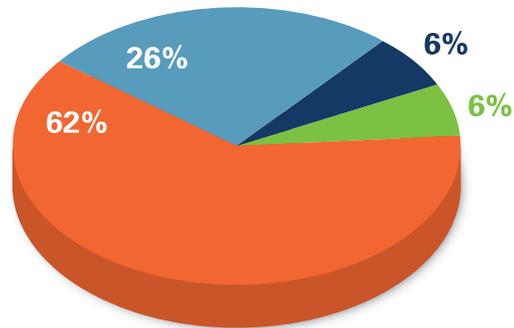
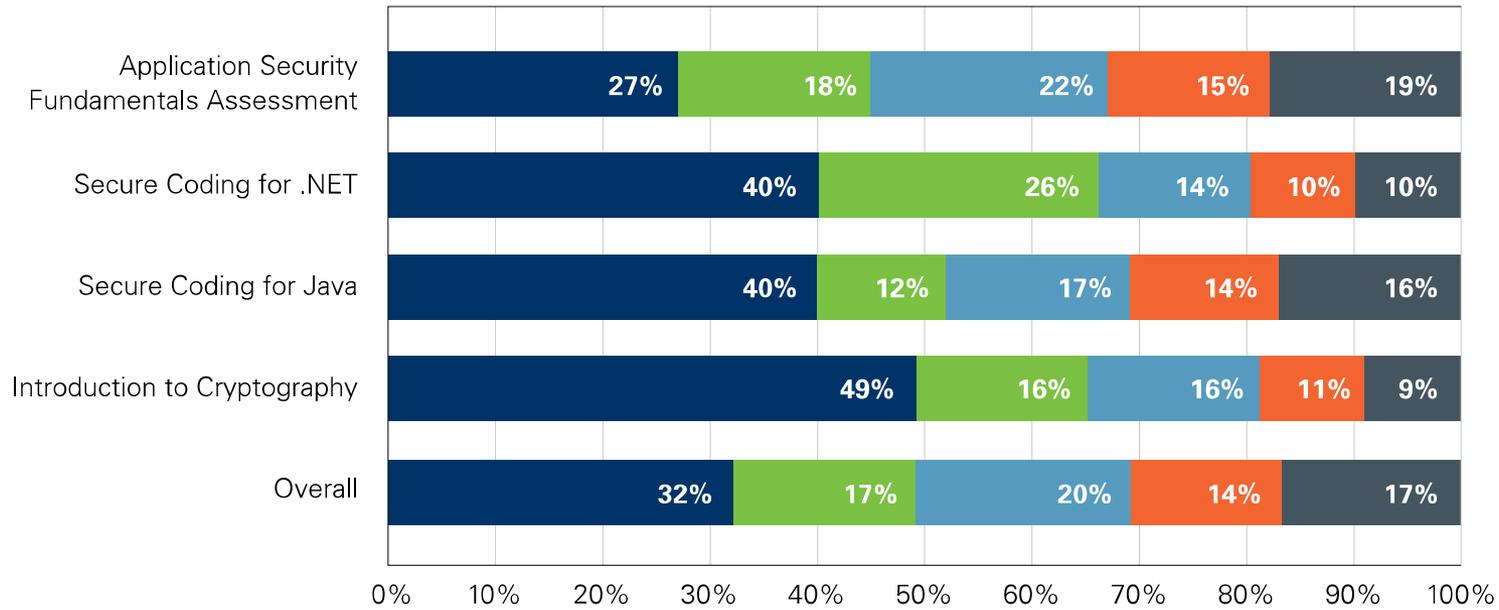
# Percentage of iOS Apps Affected

Language	FlawCat	AffectedAppVerPct
iOS	Error Handling	81.0
iOS	Cryptographic Issues	67.2
iOS	Information Leakage	54.4
iOS	Buffer Management Errors	29.9
iOS	Code Quality	27.7
iOS	Directory Traversal	23.7
iOS	Credentials Management	14.6
iOS	Numeric Errors	10.2
iOS	Buffer Overflow	4.7

When given an exam on application security fundamentals, over half of developers...

- a) Receive an A
- b) Receive a B or worse
- c) Receive a C or worse
- d) Fail (receive a D or F)

■ A ■ B ■ C ■ D ■ F



- Application Security Fundamentals Assessment
- Secure Coding for Java
- Secure Coding for .NET
- Introduction to Cryptography

# QUESTIONS?

GOLD HILL	
EST.	— 1859
ELEV.	— 8463
POP.	— 118
<hr/>	
TOTAL	10440

Chris Wysopal  
[cwysopal@veracode.com](mailto:cwysopal@veracode.com)

 [@weldpond](https://twitter.com/weldpond)