## CSE508 Network Security

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#### **Intrusion**

"Any set of actions that attempt to compromise the integrity, confidentiality or availability of information resources" [Heady et al.]

"An attack that exploits a vulnerability which results to a compromise of the security policy of the system" [Lindqvist and Jonsson]

#### Most intrusions...

Are carried out remotely

Exploit software vulnerabilities

Result in arbitrary code execution or unauthorized data access on the compromised host

Not the only way!

#### **Intrusion Method**

```
Social engineering (phishing, spam, scareware, phone call, ...)
Viruses/malware (disks, CD-ROMs, USB sticks, downloads, ...)
Network traffic interception (access credentials, keys, tokens, ...)
Password guessing (root:12345678, brute force cracking, ...)
Physical access (reboot, keylogger, screwdriver, ...)
Software vulnerability exploitation
```

#### **Attack Source**

#### Local

Unprivileged access → privilege escalation

Physical access > USB and other I/O ports, BIOS, wiretapping, memory/storage acquisition, bugging input devices, physical damage, ...

#### Remote

Internet

Local network (Ethernet, WiFi, 3/4G, bluetooth, ...)

Infected media (disks, CD-ROMs, USB sticks, ...)

Phone (social engineering)

Less risk, more targets...

#### **Attack Outcome**

Arbitrary code execution

Privilege escalation

Disclosure of confidential information

**Unauthorized access** 

DoS

**Erroneous output** 

Destruction

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#### **Intrusion Detection**

Intrusion detection systems monitor networks or hosts for malicious activities or policy violations

**Detection (IDS):** just generate alerts and log identified events

Xes 1111001 1111001 0001010

**Prevention (IPS):** in addition, react by blocking the detected activity

## **Defense in Depth**

#### An IDS is not a silver bullet solution

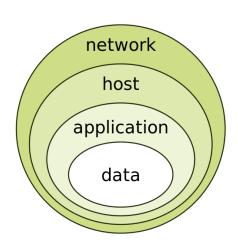
Just an additional layer of defense

Complements existing protections, detectors, and policy enforcement mechanisms

# There will always be new vulnerabilities, new exploitation techniques, and new adversaries

Single defenses may fail

Multiple and diverse defenses make the attacker's job harder



## **Defense in Depth**

## Securing systems retroactively is not always easy

WiFi access points, routers, printers, IP phones, mobile phones, legacy devices, TVs, IoT, ...

# Detecting and blocking an attack might be easier/faster than understanding and fixing the vulnerability

Immediate response vs. long-term treatment

## Focus not only on detecting attacks

But also on their side effects, and unexpected events in general

Example: extrusion detection/data leak prevention → detect data exfiltration

#### **Situational Awareness**

Understanding of what is happening on the network and in the IT environment

Confirm security goals
Identify and respond to
unanticipated events

#### Diverse sources of data

Passive/active network/host monitoring, scanning/probing, performance metrics/statistics, server/transaction logs, external (non IT) indicators, ...

Use data analytics to make sense of the increasing amount of data: identify features, derive models, observe patterns, ...

Data mining, machine learning, ...

## **Basic Concepts: Location**

An IDS can be a separate device or a software application

Operates on captured audit data

Off-line (e.g., periodic) vs. real-time processing

#### Network (NIDS)

NetFlow records, raw packets, reassembled streams, ...

Passive (IDS) vs. in-line (IPS) operation

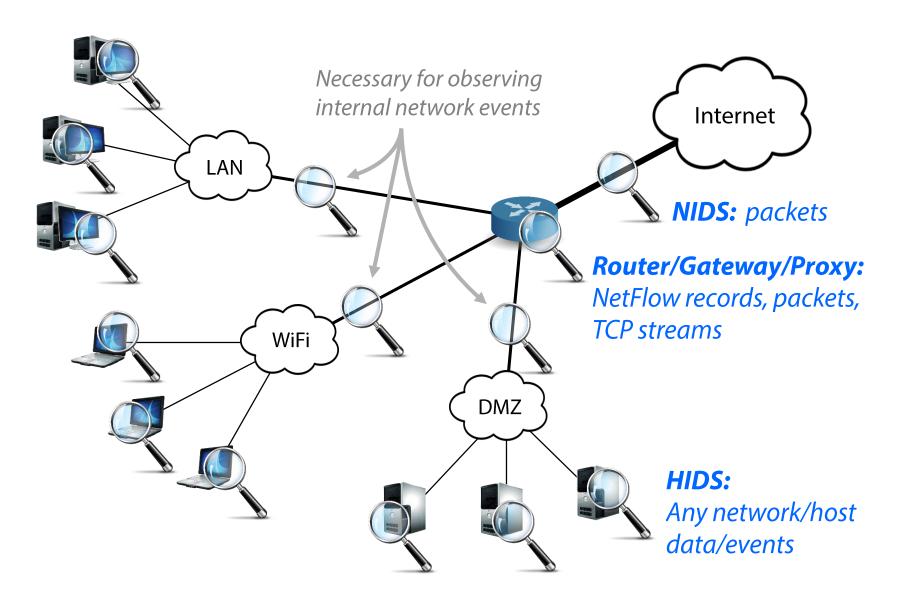
Examples: Snort, Bro, Suricata, many commercial boxes, ...

## Host (HIDS)

Login times, resource usage, user actions/commands, process/file/socket activity, application/system log files, registry changes, API calls, system calls, executed instructions, ...

Examples: OSSEC, El Jefe, AVs, registry/process/etc. monitors, network content scanners, ...

## **Basic Concepts: Location**



#### **Deployment**

NIDS: protect many hosts with a single detector

HIDS: install detector on each host (might not always be feasible)

#### Visibility

NIDS: can observe broader events and global patterns

HIDS: observes only local events that might not be visible at the network

#### **Context**

*NIDS:* packets, unencrypted streams (unless proxy-level SSL inspection)

HIDS: full picture

#### **Overhead**

NIDS: none (passive)

NIPS/Proxy: adds some latency

HIDS: eats up CPU/memory (overhead from negligible to complete hogging)

#### **Subversion**

NIDS: invisible in the network

NIPS/Proxy: failure may lead to unreachable network

HIDS: attacker may disable it and alter the logs (user vs. kernel level, in-VM vs. out-of-VM, remote audit logs)

## **Basic Concepts: Detection Method**

#### Misuse detection

- Predefined patterns (known as "signatures" or "rules") of known attacks
- Rule set must be kept up to date
- Manual vs. automated signature specification (latter is *hard*)
- Can detect only *known* attacks, with adequate precision

## Anomaly detection

- Rely on models of "normal" behavior
- Requires (re)training with an adequate amount of data
- Can detect previously unknown attacks
- Prone to false positives

## **IDS Challenges**

## Conflicting goals

Zero-day attack detection

Zero false positives

#### Resilience to evasion

Detection of targeted and stealthy attacks

## Adaptability to a constantly evolving environment

New threats, new topology, new services, new users, ...

Rule sets must be kept up to date according to new threats

Models must be updated/retrained (concept drift)

## Coping with an increasing amount of data

## **Popular Open-source Signature-based NIDS**

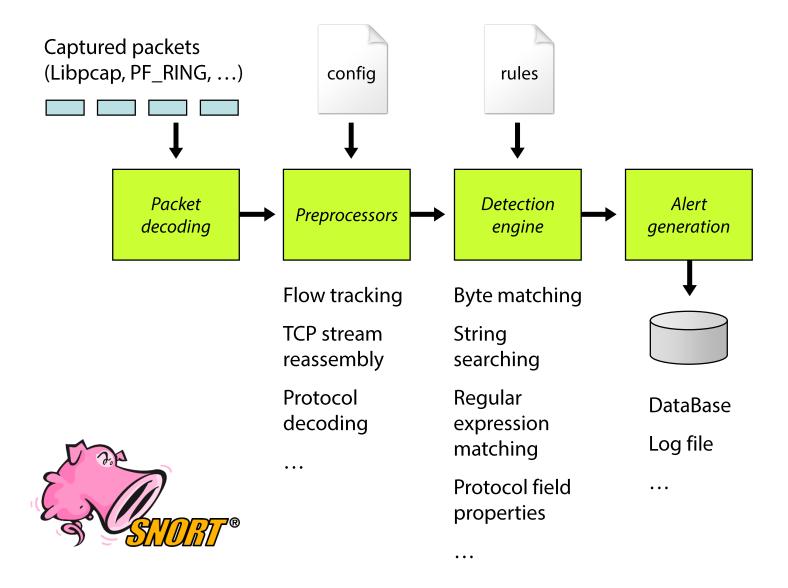






Snort Bro Suricata

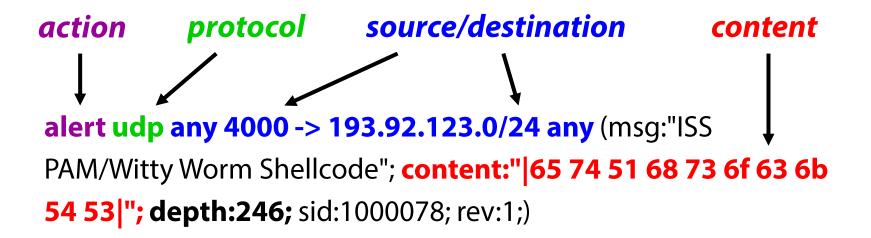
#### **Use Case: Snort**



## What is a Signature?

An attack description as seen at Layer 2-7

Witty worm Snort signature example:



```
◐
                               Shell - Konsole <2>
                                                                          _ _ ×
05/13-16:46:08.570308 [**] [1:0:0] ISS PAM/Witty Worm Shellcode [**] [Priority: 0]
05/13-16:46:<u>10.571009_0:4:75:AD:3E</u>:E1<u>-> 0</u>:C:6E:F3:98:3E_type:0x800_len:0x42B
139.91.70.31 4000 -> 139.91.70.40 322 UDP TTL:64 TOS:0x0 ID:55882 IpLen:20 DgmLen:1053
Len: 1025
45 00 04 01 D3 B4 00 00 71 11 DD A9 DB 9A 9C A1 E......q......
                                             A.....$...8...
41 AD DA A4 OF A0 C4 24 03 ED DD 38 05 00 00 00
00 00 00 12 02 00 00 00 00 00 00 00 00 00 00
00 02 2C 00 05 00 00 00 00 00 00 6E 00 00 00 00
                                             . . . . . . . . . . . n. . . .
41 02 05 00 00 00 00 00 DE 03 00 00 00 00 00
01 00 00 1E 02 20 20 20 20 20 20 20 28 5E 2E 5E
29 20 20 20 20 20 20 69 6E 73 65 72 74 20 77
                                                   insert wi
74 74 79 20 6D 65 73 73 61 67 65 20 68 65 72 65
                                             tty message here
                                                   (^.^)
2E 20 20 20 20 20 20 28 5E 2E 5E 29 20 20 20 20
20 20 20 89 E7 8B 7F 14 83 C7 08 81 C4 E8 FD FF
FF 31 C9 66 B9 33 32 51 68 77 73 32 5F 54 3E FF
                                             .1.f.32Qhws2 T>.
15 9C 40 0D 5E 89 C3 31 C9 66 B9 65 74 51 68 73
                                             ..@.^..1.f.etQhs
                                             ockTS>...@.^j.j.
6F 63 6B 54 53 3E FF 15 98 40 0D 5E 6A 11 6A 02
6A 02 FF D0 89 C6 31 C9 51 68 62 69 6E 64 54 53
                                            j....l.QhbindTS
3E FF 15 98 40 0D 5E 31 C9 51 51 51 81 E9 FE FF
                                             >...@.^1.QQQ....
F0 5F 51 89 E1 6A 10 51 56 FF D0 31 C9 66 B9 74
                                             . Q..j.QV..1.f.t
```

## **More Examples**

## String searching

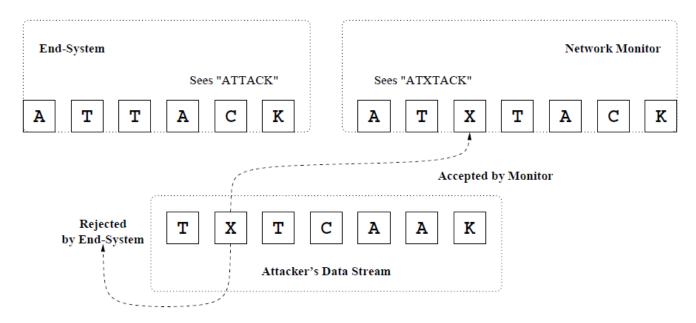
```
alert ip $EXTERNAL_NET $SHELLCODE_PORTS -> $HOME_NET any
(msg:"SHELLCODE Linux shellcode"; content:"|90 90 90 E8 C0 FF
FF FF|/bin/sh"; classtype:shellcode-detect; sid:652; rev:9;)
```

## Strsearch + regexp matching + stateful inspection

## **Stateful Inspection**

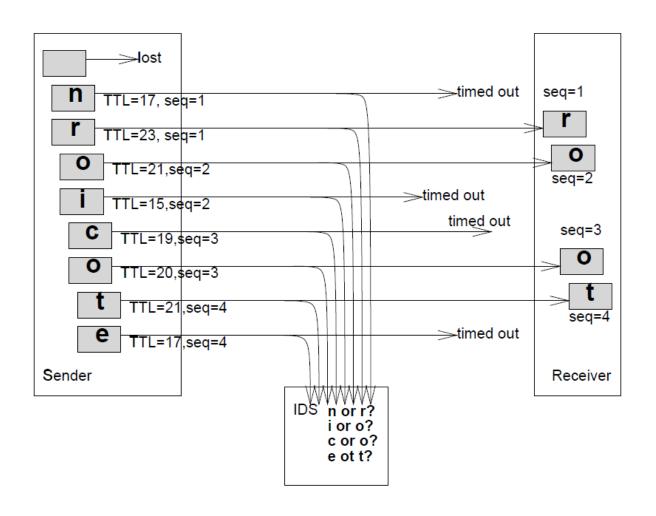
Semantic gap: NIDS processes individual packets, while applications see a contiguous stream (TCP)

#### Potential for evasion



Solution: IP defragmentation, TCP stream reassembly Flow-level tracking: group packets into flows, track TCP state Stream reassembly: normalize and merge packets into streams

## Different TCP stacks may treat corner cases differently...



## **Anomaly Detection**

Training phase: build models of normal behavior

Detection phase: alert on deviations from the model

## Many approaches

Statistical methods, rule-based expert systems, clustering, state series modeling, artificial neural networks, support vector machines, outlier detection schemes, ...

## Good for noisy attacks

Port scanning, failed login attempts, DoS, worms, ...

#### Good for "stable" environments

E.g., web server vs. user workstation

## **Anomaly Detection**

## Learning

Supervised

Labels available for both benign data and attacks

Semi-supervised

Labels available only for benign data

Unsupervised

No labels: assume that anomalies are very rare compared to benign events

## Many possible features

Packet fields, payload content, connection properties, traffic flows, network metrics, system call sequences, code fragments, file attributes, statistics, ...

## **Evaluating Intrusion Detection Systems**

Accuracy is not a sufficient metric!

Example: data set with 99.9% benign and 0.1% malicious events Dummy detector that marks everything as benign has 99.9% accuracy...

False positive: legitimate behavior was detected as malicious

False negative: an actual attack was not detected

#### **Detection Result**

	Positive (alert)	Negative (silence)
Positive (malicious)	TP	FN
Negative (benign)	FP	TN

**Actual Event** 

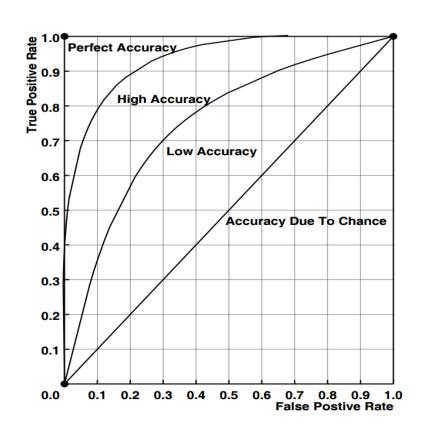
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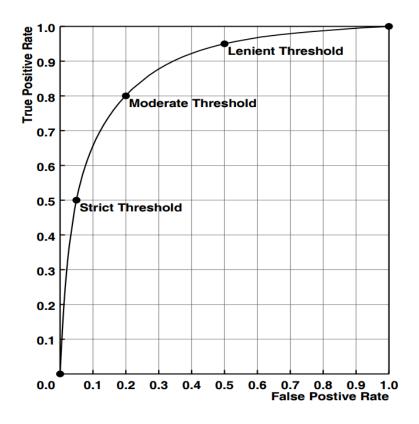
## **Receiver Operating Characteristic (ROC) Curve**

#### Concise representation of a detector's accuracy

Y axis: success rate of detecting signal events

X axis: error rate of falsely identifying noise events





## **Evasion** – "Stay under the radar"

## Both anomaly and misuse detection systems can be evaded by breaking the detector's assumptions

Detectors rely on certain features

Make those features look legitimate or at least non-suspicious

## Many techniques

Fragmentation

Content mutation/polymorphism/metamorphism

Mimicry

Rate adjustment (slow and stealthy vs. fast and noisy)

Distribution and coordination (e.g., DoS vs. DDoS)

Spoofing and stepping stones

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