



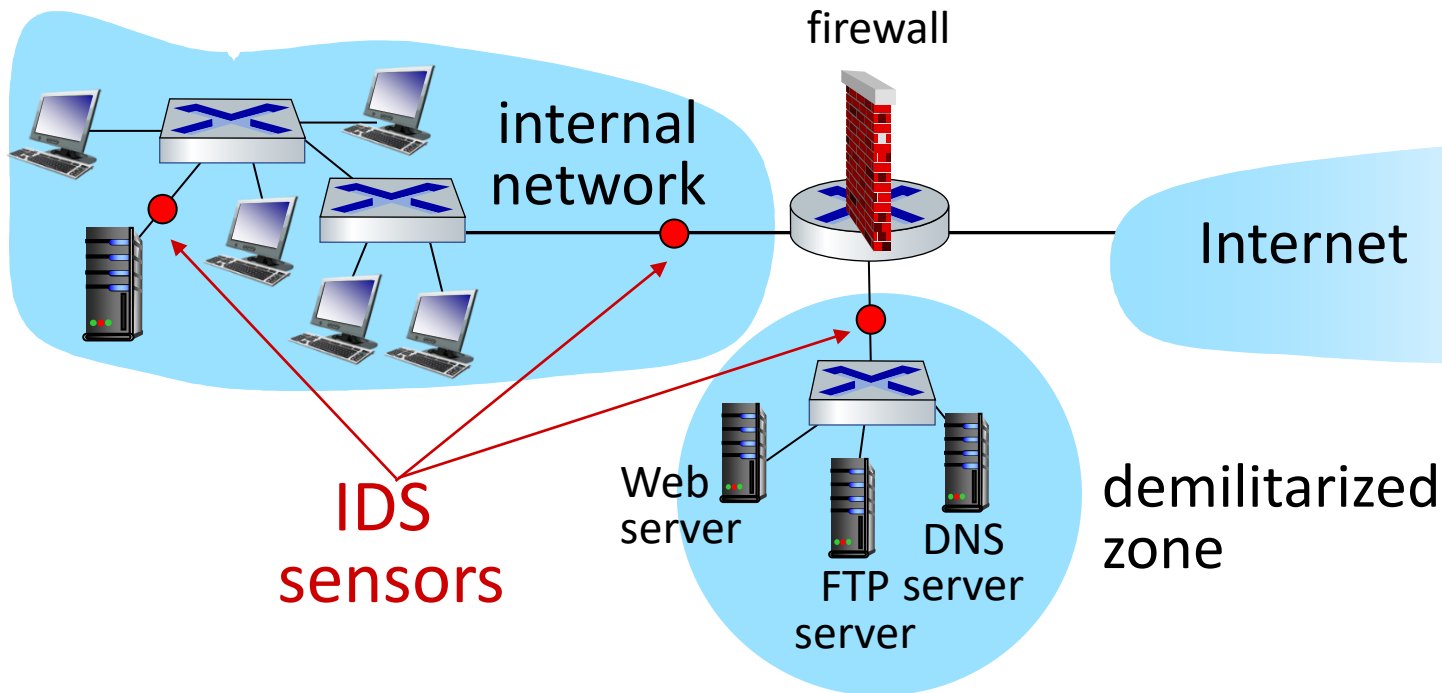
# Advanced Network Security

## Firewalls and IDS

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# Intrusion detection systems

multiple IDSs: different types of checking at different locations



# What is IDS?

- An Intrusion Detection System (IDS) is a system that attempts to **identify intrusions**.
- Intrusion detection is the process **of identifying and responding to malicious activity** targeted at **computing and networking resources**.
- The goal of IDS is to **detect fingerprints** of malicious activity.

# Anomaly Detection

- Using a **model of normal system behavior**, try to detect deviations and abnormalities
- Any large **deviation from the model** is thought as anomaly.
  - E.g., raise an alarm when a statistically rare event(s) occurs
- Pro: can **detect previous unseen attacks**
- Con: have **higher false positives**, and hard to train a system for a **very dynamic environment**.
- Approaches: statistical methods, Machine Learning

# Anomaly Detection with NIDS

- High false positive rate

- False identifications are very costly because sys admin will spend many hours examining evidence

- Training is difficult

- Lack of training data with real attacks
- Network traffic is very diverse, the definition of “normal” is constantly evolving
  - What is the difference between a **flash crowd** and a **denial of service** attack?

# Naïve Bayes Classifier (supervised learning)

- A Bayes Classifier is a probabilistic model that uses Bayes' theorem to classify data into different categories or classes.
- **P(Class | Data)**: Probability of the data belonging to a specific class.
- **P(Data | Class)**: Probability of observing the data given the class.
- **P(Class)**: Prior probability of the class.
- **P(Data)**: Probability of the data.

The image shows the Naïve Bayes formula with handwritten annotations in orange. The formula is 
$$P(\text{class} | \text{data}) = \frac{P(\text{data} | \text{class}) \times P(\text{class})}{P(\text{data})}$$
. An arrow points from the word 'Likelihood' to  $P(\text{data} | \text{class})$ . Another arrow points from 'This is our prior belief' to  $P(\text{class})$ . A third arrow points from 'We don't calculate this in naive bayes classifiers' to  $P(\text{data})$ . The variables 'class' and 'data' are color-coded: 'class' is red and 'data' is blue.

$$P(\text{class} | \text{data}) = \frac{P(\text{data} | \text{class}) \times P(\text{class})}{P(\text{data})}$$

Likelihood

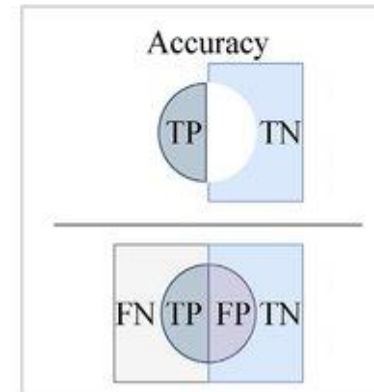
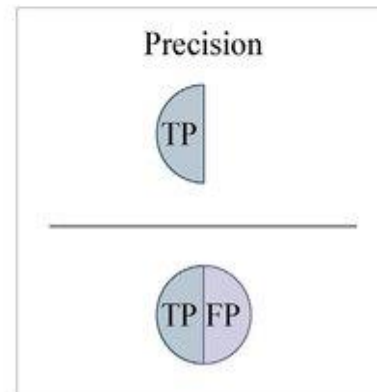
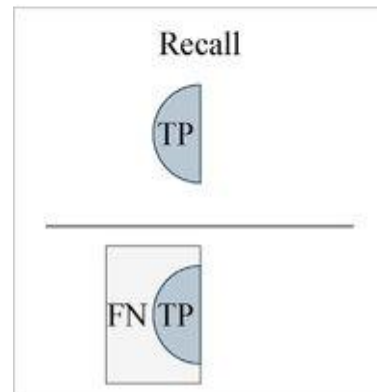
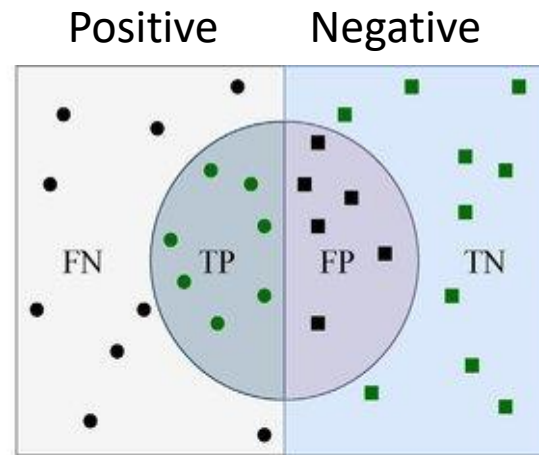
This is our prior belief

We don't calculate this in naive bayes classifiers

# IDS Evaluation

- Accuracy: false positives and false negatives should be minimized.
- Performance: the rate at which audit events are processed.
- Completeness: to detect all attacks.
- Fault tolerance: resistance to attacks.
- Timeliness: time elapsed between intrusion and detection.

# Precision and Recall





# Base-Rate Fallacy

- 1% of traffic is SYN floods; IDS accuracy is 90%
  - IDS classifies a SYN flood as attack with prob. 90%, classifies a valid connection as attack with prob. 10%
- What is the probability that the connection flagged as a SYN flood by IDS is actually valid?

$$\begin{aligned}\Pr(\text{valid} \mid \text{alarm}) &= \frac{\Pr(\text{alarm} \mid \text{valid}) \cdot \Pr(\text{valid})}{\Pr(\text{alarm})} \\ &= \frac{\Pr(\text{alarm} \mid \text{valid}) \cdot \Pr(\text{valid})}{\Pr(\text{alarm} \mid \text{valid}) \cdot \Pr(\text{valid}) + \Pr(\text{alarm} \mid \text{SYN flood}) \cdot \Pr(\text{SYN flood})} \\ &= \frac{0.10 \cdot 0.99}{0.10 \cdot 0.99 + 0.90 \cdot 0.01} = 92\% \text{ chance raised alarm} \\ &\quad \text{is false!!!}\end{aligned}$$

slide

# Sensor Locations

- Outside the firewall?
  - We know there are bad guys there; what's the point?
- Just inside? What's the threat model?
- On sensitive internal nets?
- In front of each sensitive host?
- In “dark space”?

# What's the Purpose?

- Inside the firewall? Detect data exfiltration
- Sensitive internal nets: detect threats aimed at them
- Watching each host? Detect attacks on inside hosts from other hosts on the same LAN
- Dark space? Detect scanning worms (and attackers)

# What's Dark Space?

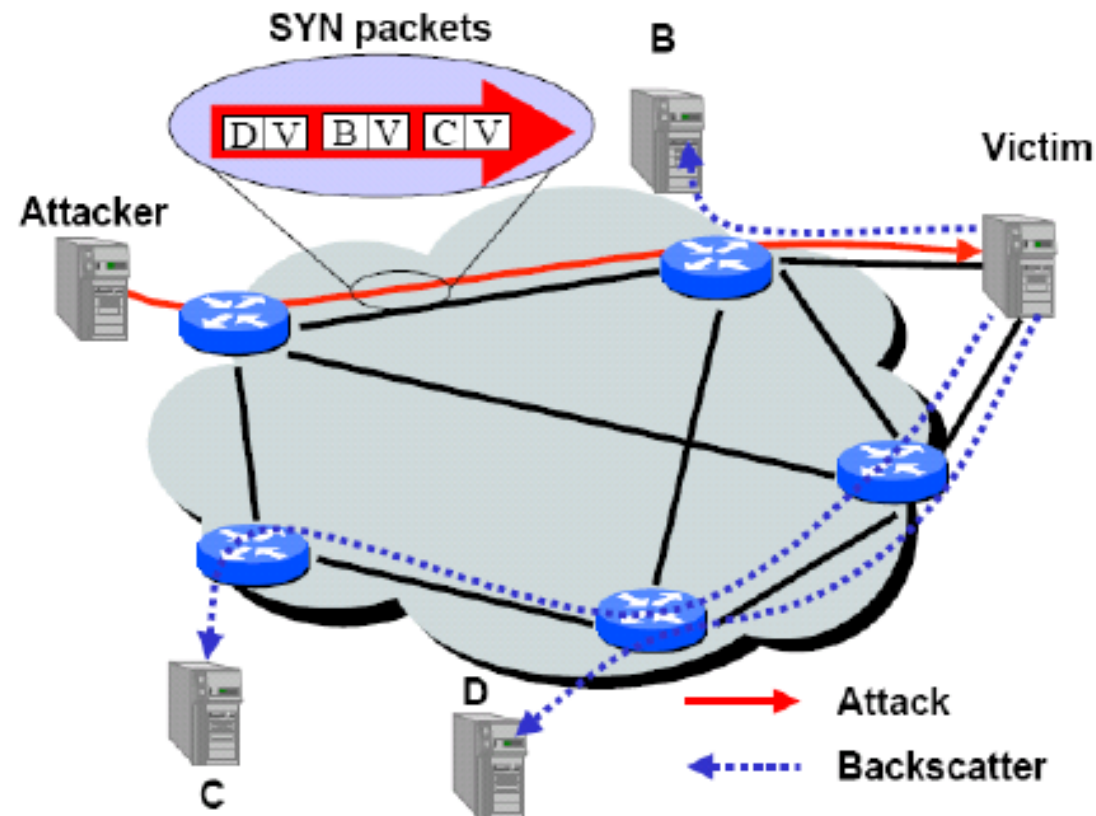
- A block of address space **not used by real machines** and **not pointed to by DNS entries**
- There is **no legitimate reason to send packets to such addresses**
  - Therefore, any host sending to such addresses is up to no good
- Commonly used to **detect scanning worms**

# Network Telescopes and Honeypots

- Monitor a cross-section of **Internet address space**
  - Especially useful if **includes unused “dark space”**
- Attacks in far corners of the Internet may produce traffic directed at your addresses
  - “**Backscatter**”: responses of DoS victims to SYN packets from randomly spoofed IP addresses
  - **Random scanning by worms**
- Can combine with “honeypots”
  - Any **outbound connection from a honeypot** behind an otherwise unused IP address **means infection**
  - Can use this to **analyze worm code**

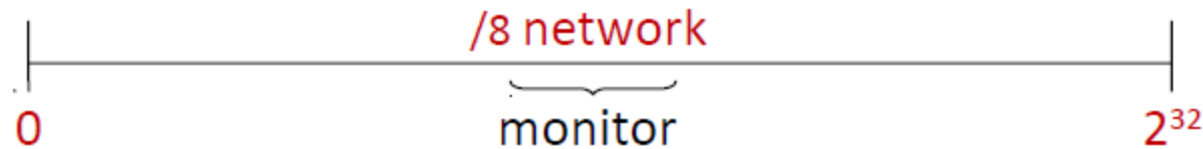
# Backscatter of SYN Floods

- SYN with forged, random source IP address  $\Rightarrow$  SYN/ACK to random host



# Measuring Backscatter

- Listen to unused IP addresses space (dark space)



- A lonely SYN/ACK packet is likely to be the result of a SYN attack
- 2001: 400 SYN attacks/week
- 2013: 773 SYN attacks/24 hours
- 2016: 1654 SYN attacks/24 hours

# Honeypots and Honeynets

- Special-purpose host or network designed to be attacked
  - Lure the attacker in deeper
- Equipped with many monitoring options
- Waste the attacker's time; study the attacker's technique
- Note well: keeping honeypot (and dark space) addresses secret is vital



# Auto-Quarantine

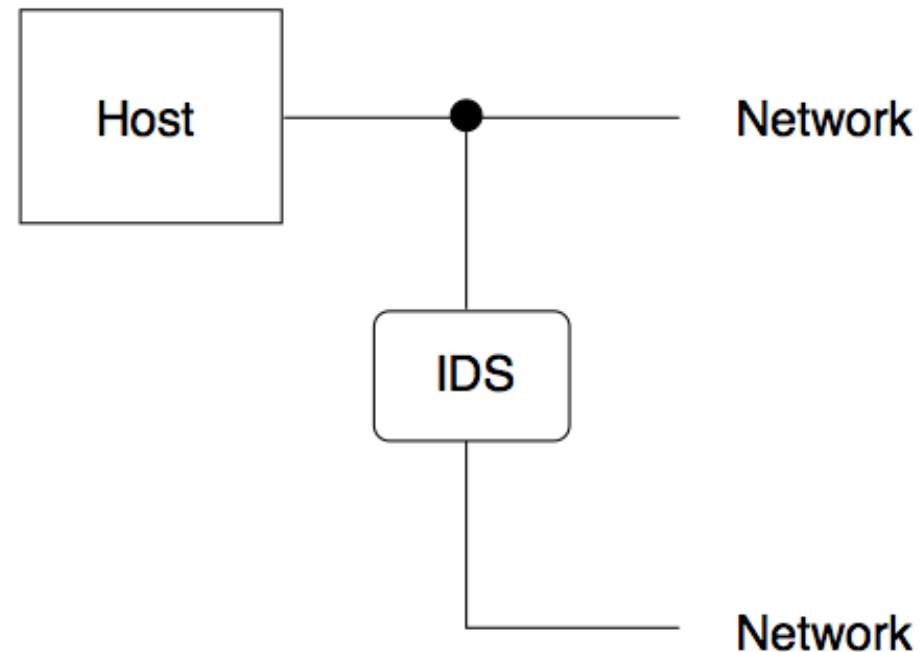
- Many organizations implement “auto-quarantine”
- This is especially common for university residence hall networks
- **Machines that do too much scanning** (and in particular attempt to probe dark space) are assumed to be **virus-infected**
- They're **moved to a separate net**; the only sites they can **contact are Windows Update, anti-virus companies, and the like**

# Host- or Net-Resident?

- Suppose you want to **monitor each host**. Where does the monitor live?
- Dedicated **in-line hardware**: good, but expensive
- On **the host**: cheap, but subvertible

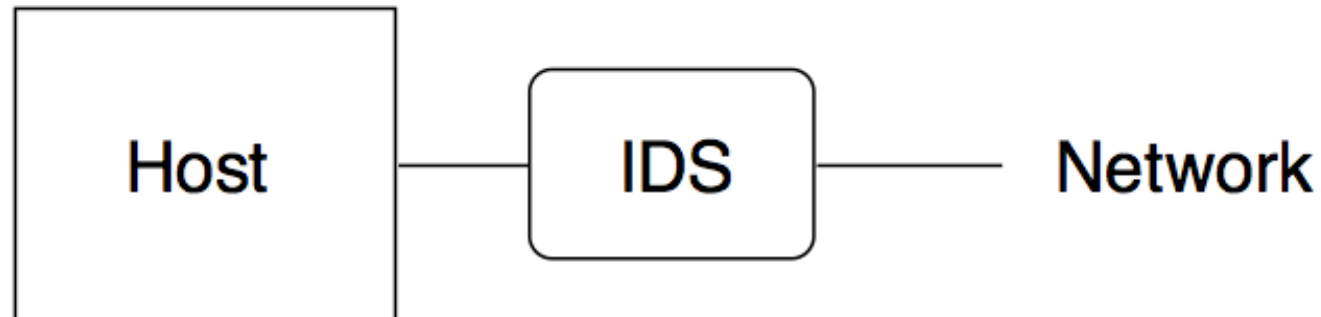
# Net-Resident: Parallel

- Very unobtrusive
- But — need special hardware to tap an Ethernet
- Need some network connection to the IDS



# Net-Resident: Serial

- Can't miss packets
- But — if it crashes, the host is unreachable
- Can the IDS box be hacked?



# Host-Resident Monitor

- No special hardware needed
- IDS **sees exactly what host sees**
- But — **subvertible**
- Useful precaution: **immediately transmit IDS data elsewhere**



# The Big Advantages of Host IDS

- More time
- More context
- Everything is **reassembled**
- Look at **entire item, not streams**

# Extrusion Detection

- Detect **bad things leaving** your network
- Detect **sensitive things leaving** your network
- Finds theft of inside information, either by attacker or by rogue insider
- Can be done in the network or in application gateways

# Simple Logging



# Simple Logging

- I (Steven Bellovin) ran this command for a while, on two hosts:
  - `tcpdump -p -l "tcp[13] == 0x2 and dst $us"`
- What does it do?
- Logs all TCP SYN-only packets addressed to us (tcp[13] is the flags byte in the TCP header; 0x2 is SYN)

TCP Header																																	
Offsets		0								1								2								3							
Octet	Bit	0	1	2	3	4	5	6	7	0	1	2	3	4	5	6	7	0	1	2	3	4	5	6	7	0	1	2	3	4	5	6	7
0	0	Source port																Destination port															
4	32	Sequence number																															
8	64	Acknowledgment number (if ACK set)																															
12	96	Data offset				Reserved 0 0 0 0				C W R	E C E	U R G	A C K	P S H	R S T	S Y N	F I N	Window Size															
16	128	Checksum																Urgent pointer (if URG set)															
20	160	Options (if <i>data offset</i> > 5. Padded at the end with "0" bits if necessary.)																															
:	:																																
56	448																																

# Some Results

- About 85 probes apiece, during a 30-hour run
- 63 different ports scanned
- Some obvious: http, ssh, Windows file-sharing, SMTP, web proxy
- Some strange: 49400–49402, 8081–8090, 81–86
- Some threatening: terabase, radmin-port
- Most probers looked at one port; one looked at 46 ports

# The Most Probed Ports

<i>Scans</i>	<i>Port</i>
3	ms-wbt-server
3	ssh
5	8000
5	http-alt
6	ms-sql-s
6	radmin-port
7	BackupExec
8	smtp
9	WebProxy
9	http

# What Did The Probers Want?

- WebProxy and SMTP are probably for spam email and connection-laundering
- The others look like probes for known vulnerabilities

# Bad Neighborhoods

- I see more probes here than elsewhere. Why?
- There are different “neighborhoods” — ranges of IP addresses — in cyberspace
- **University networks are good hunting grounds** — few firewalls, good bandwidth, many poorly-administered machines
- **Newly-allocated network blocks** have few hosts, and **aren’t scanned as much**

# Finding Compromised Hosts

# Finding Compromised Hosts

- Suppose you've identified a compromised host. **Now what?**
- Get data: IP address and (when feasible) MAC address
- Find it

# Databases

- Must be able to map IP address to location
- Must be able to map IP address to person
- Difficult on campus — wide-open nets
- Primary reason for host registration in many places



# Layer 2 Data

- Enterprise-grade switches are “managed”
- They can map an IP address or a MAC address to a physical port
- Especially useful if the attacker is forging addresses. . .

# Switch Data

- Note that a **single MAC address** has shown up on **two different switch ports**, in different buildings. This is reasonable for a laptop, but not for a server!

[Home](#) + [Switch View](#) + [Port View](#) + [Jacks View](#) + [Search Jacks](#) + [Search Host](#)

MAC Address:	0003BA1077F7
<input type="button" value="Submit"/>	<input type="button" value="Reset"/>

0003BA1077F7 is not statically registered

Location	First Seen	Last Seen
<a href="#">cs-4-1.net:5/15</a>	02-aug-2004 16:03:27	13-nov-2006 18:08:29
<a href="#">cepsr-7-1.net:6/9</a>	09-may-2006 21:39:18	31-oct-2006 14:52:13

ARP cache		
IP	MAC	Last Seen
<a href="#">128.59.16.72</a>	<a href="#">0003BA1077F7</a>	13-nov-2006 22:17:50

# Problems with (Commercial) IDS

- **Cost of update** and keeping current is growing
  - Organizations **lack internal expertise**
- **Knowledge based IDS systems suffer from False Negative Problem**
  - New augmented IDS with Anomaly Detectors are appearing in the commercial market
- **IDS are inherently noisy** and chatty and suffer from the **False Positive problem**
  - Volumes of alerts are crushing
  - **Zooming in on most serious threats is hard**
- NIDS positioned at the **perimeter**
  - The most serious/predominant threat is the insider
  - Host and LAN-based IDS now more crucial

# References

- Kurose, James F., and Keith W. Ross. "Computer networking: A top-down approach edition." Addison Wesley (2007), chapter 8.
- Steven Bellovin, COMS W4180, Columbia University, 2006
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- Vitaly Shmatikov, CS 361S, UT Austin, 2014