

CSE 490K

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Some slides based on Vitaly Shmatikov's

Detecting Attack Strings Is Hard

- Want to detect "USER root" in packet stream
- Scanning for it in every packet is not enough
 - Attacker can split attack string into several packets; this will defeat <u>stateless</u> NIDS

Recording previous packet's text is not enough

- Attacker can send packets out of order
- Full reassembly of TCP state is not enough
 - Attacker can use TCP tricks so that certain packets are seen by NIDS but dropped by the receiving application

 Manipulate checksums, TTL (time-to-live), fragmentation



Anomaly Detection with NIDS

Advantage: can recognize new attacks and new versions of old attacks

Disadvantages

- High false positive rate
- Must be trained on known good data
 - Training is hard because network traffic is very diverse
- Protocols are finite-state machines, but current state of a connection is difficult to see from the network
- Definition of "normal" constantly evolves
 - What's the difference between a flash crowd and a denial of service attack?

Intrusion Detection Problems

Lack of training data with real attacks

• But lots of "normal" network traffic, system call data

Data drift

- Statistical methods detect changes in behavior
- Attacker can attack gradually and incrementally

Main characteristics not well understood

- By many measures, attack may be within bounds of "normal" range of activities
- False identifications are very costly
 - Sysadm will spend many hours examining evidence

Intrusion Detection Errors

- False negatives: attack is not detected
 - Big problem in signature-based misuse detection
- False positives: harmless behavior is classified as an attack
 - Big problem in statistical anomaly detection
- Both types of IDS suffer from both error types
- Which is a bigger problem?
 - Attacks are fairly rare events

Conditional Probability

Suppose two events A and B occur with probability Pr(A) and Pr(B), respectively

Let Pr(AB) be probability that <u>both</u> A and B occur

 What is the conditional probability that A occurs assuming B has occurred?

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 $Pr(A | B) = \frac{Pr(AB)}{Pr(B)}$

Bayes' Theorem

Suppose mutually exclusive events E₁, ..., E_n together cover the entire set of possibilities
 Then probability of <u>any</u> event A occurring is

 $Pr(A) = \sum_{1 \le i \le n} Pr(A \mid E_i) \bullet Pr(E_i)$

– Intuition: since E_1, \dots, E_n cover entire

probability space, whenever A occurs, some event E_i must have occurred



Can rewrite this formula as $\frac{Pr(A \mid E_i) \cdot Pr(E_i)}{Pr(E_i \mid A)} = \frac{Pr(A)}{Pr(A)}$

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 a connection flagged by IDS as a SYN flood is actually valid traffic?

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Pr(alarm | valid) • Pr(valid) + Pr(alarm | SYN flood) • Pr(SYN flood) 0.10 • 0.99

 $0.10 \cdot 0.99 + 0.90 \cdot 0.01$

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 $Pr(valid | alarm) = \frac{Pr(alarm | valid) \cdot Pr(valid)}{Pr(alarm)}$ $= \frac{Pr(alarm | valid) \cdot Pr(alarm | valid) \cdot Pr(valid)}{Pr(alarm | valid) \cdot Pr(valid) + Pr(alarm | SYN flood) \cdot Pr(SYN flood)}$ $= \frac{0.10 \cdot 0.99}{0.10 \cdot 0.99 + 0.90 \cdot 0.01} = 92\% \text{ chance raised alarm} \text{ is false!!!}$

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 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 (why?)
 - Can use this to extract worm signatures (how?)

Anonymity

Privacy on Public Networks

Internet is designed as a public network

• Machines on your LAN may see your traffic, network routers see all traffic that passes through them

Routing information is public

- IP packet headers identify source and destination
- Even a passive observer can easily figure out who is talking to whom
- Encryption does not hide identities
 - Encryption hides payload, but not routing information
 - Even IP-level encryption (tunnel-mode IPSec/ESP) reveals IP addresses of IPSec gateways

Applications of Anonymity (I)

Privacy

• Hide online transactions, Web browsing, etc. from intrusive governments, marketers and archivists

Untraceable electronic mail

- Corporate whistle-blowers
- Political dissidents
- Socially sensitive communications (online AA meeting)
- Confidential business negotiations
- Law enforcement and intelligence
 - Sting operations and honeypots
 - Secret communications on a public network

Applications of Anonymity (II)

Digital cash

- Electronic currency with properties of paper money (online purchases unlinkable to buyer's identity)
- Anonymous electronic voting
- Censorship-resistant publishing

What is Anonymity?

 Anonymity is the state of being not identifiable within a set of subjects

- You cannot be anonymous by yourself!
 - Big difference between anonymity and confidentiality
- Hide your activities among others' similar activities
- Unlinkability of action and identity
 - For example, sender and his email are no more related after observing communication than they were before
- Unobservability (hard to achieve)
 - Any item of interest (message, event, action) is indistinguishable from any other item of interest

Attacks on Anonymity

Passive traffic analysis

- Infer from network traffic who is talking to whom
- To hide your traffic, must carry other people's traffic!
- Active traffic analysis
 - Inject packets or put a timing signature on packet flow
- Compromise of network nodes
 - Attacker may compromise some routers
 - It is not obvious which nodes have been compromised
 - Attacker may be passively logging traffic
 - Better not to trust any individual router
 - Assume that some fraction of routers is good, don't know which

Chaum's Mix

Early proposal for anonymous email

• David Chaum. "Untraceable electronic mail, return addresses, and digital pseudonyms". Communications of the ACM, February 1981.

Public key crypto + trusted re-mailer (Mix)

- Untrusted communication medium
- Public keys used as persistent pseudonyms
- Modern anonymity systems use Mix as the basic building block

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Before spam, people thought anonymous email was a good idea ©

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B ${r_1, {r_0, M}_{pk(B)}, B}_{pk(mix)}$ Α Mix

このためのない アイロシスト ちんかな ふかけかん とうためのから アイロシスト ちんかん シート・アイロシスト しためのから アイロシスト

B ${r_1, {r_0, M}_{pk(B), B}_{pk(mix)}}$ ${r_0, M}_{pk(B), B}$ Α Mix

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B ${r_1, {r_0, M}_{pk(B)}, B}_{pk(mix)}$ $\{r_0,M\}_{pk(B)},B$ Α С ${r_2, {r_3, M'}_{pk(E), E}}_{pk(mix)}$ D Mix

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B ${r_1, {r_0, M}_{pk(B)}, B}_{pk(mix)}$ ${r_0, M}_{pk(B), B}$ Α С ${r_2, {r_3, M'}_{pk(E)}, E}_{pk(mix)}$ D Mix ${r_4, {r_5, M''}_{pk(B), B}}_{pk(mix)}$

B ${r_1, {r_0, M}_{pk(B)}, B}_{pk(mix)}$ $\{r_0,M\}_{pk(B)},B$ Α {r₅,M"}_{pk(B)},B С ${r_2, {r_3, M'}_{pk(E)}, E}_{pk(mix)}$ {r₃,M'}_{pk(E)},E D Mix ${r_4, {r_5, M''}_{pk(B), B}}_{pk(mix)}$

B ${r_1, {r_0, M}_{pk(B)}, B}_{pk(mix)}$ ${r_0, M}_{pk(B), B}$ ${r_5, M''}_{pk(B), B}$ ${r_2, {r_3, M'}_{pk(E), E}}_{pk(mix)}$ ${r_3,M'_{pk(E)},E}$ Mix Adversary knows all senders and ${r_4, {r_5, M''}_{pk(B), B}_{pk(mix)}}$ all receivers, but cannot link a sent message with a received message





Anonymous Return Addresses



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Anonymous Return Addresses



Anonymous Return Addresses



Mix Cascade



Messages are sent through a sequence of mixes

- Can also form an arbitrary network of mixes ("mixnet")
- Some of the mixes may be controlled by attacker, but even a single good mix guarantees anonymity
- Pad and buffer traffic to foil correlation attacks

Disadvantages of Basic Mixnets

- Public-key encryption and decryption at each mix are computationally expensive
- Basic mixnets have high latency
 - Ok for email, not Ok for anonymous Web browsing
- Challenge: low-latency anonymity network
 - Use public-key cryptography to establish a "circuit" with pairwise symmetric keys between hops on the circuit
 - Then use symmetric decryption and re-encryption to move data messages along the established circuits
 - Each node behaves like a mix; anonymity is preserved even if some nodes are compromised

Another Idea: Randomized Routing



Hide message source by routing it randomly

- Popular technique: Crowds, Freenet, Onion routing
- Routers don't know for sure if the apparent source of a message is the true sender or another router

Onion Routing

[Reed, Syverson, Goldschlag '97]



Sender chooses a random sequence of routers

- Some routers are honest, some controlled by attacker
- Sender controls the length of the path







- Routing info for each link encrypted with router's public key
- Each router learns only the identity of the next router





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Tor

Second-generation onion routing network

- http://tor.eff.org
- Developed by Roger Dingledine, Nick Mathewson and Paul Syverson
- Specifically designed for low-latency anonymous Internet communications
- Running since October 2003
- 100 nodes on four continents, thousands of users
- "Easy-to-use" client proxy
 - Freely available, can use it for anonymous browsing

Tor Management Issues

Many applications can share one circuit

• Multiple TCP streams over one anonymous connection

Tor router doesn't need root privileges

- Encourages people to set up their own routers
- More participants = better anonymity for everyone

Directory servers

- Maintain lists of active onion routers, their locations, current public keys, etc.
- Control how new routers join the network
 - "Sybil attack": attacker creates a large number of routers
- Directory servers' keys ship with Tor code

Deployed Anonymity Systems

- Free Haven project has an excellent bibliography on anonymity
 - http://freehaven.net
- Tor (http://tor.eff.org)
 - Overlay circuit-based anonymity network
 - Best for low-latency applications such as anonymous Web browsing
- Mixminion (http://www.mixminion.net)
 - Network of mixes
 - Best for high-latency applications such as anonymous email

FoxTor, Images from http://cups.cs.cmu.edu/foxtor/



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Information Leakage

Stepping Stones

 IP traceback helps discover machines from which attack packets originate

- These often have remote-controlled zombie daemons
- Analysis of zombies can help trace back to masters
- Compromised host often has a root backdoor
 - E.g., attacker runs TFN masters through root shell
 - Standard service on a non-standard port or standard port associated with a different service
 - Attacker connects from yet another machine

 Stepping stone: compromised intermediary host used by attacker to hide his identity

General Principle



Indirect Stepping Stones

Indirect stepping stone: "A-B ... C-D" vs. "A-B-C"



Timing Correlation of Idle Periods



- Idle period = no activity for ≥ 0.5 sec
 - Consider only when idle periods end to reduce analysis possibilities
- Two idle periods are considered correlated if their ending times differ by < 80ms
 - Works even on encrypted traffic!
- Detection criteria
 - # of coincidences / # of idle periods
 - # of consecutive coincidences
 - # of consecutive coincidences / # of idle periods

Failures

Large number of legitimate stepping stones
 Very small stepping stones evade detection

- Limits attackers to a few keystrokes
- Message broadcast applications lead to correlations that are not stepping stones
 - Can filter these out
- Phase-drift in periodic traffic leads to false coincidences
 - Can filter these out, too