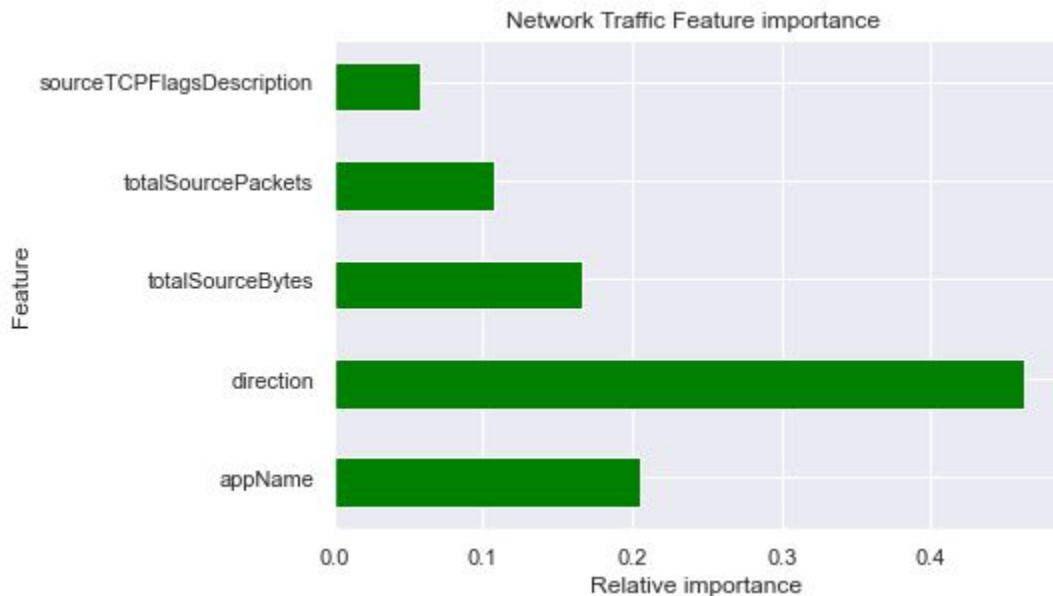

UMDIC2022 - Cybersecurity

Ben Nordmann and Jay Siliphet

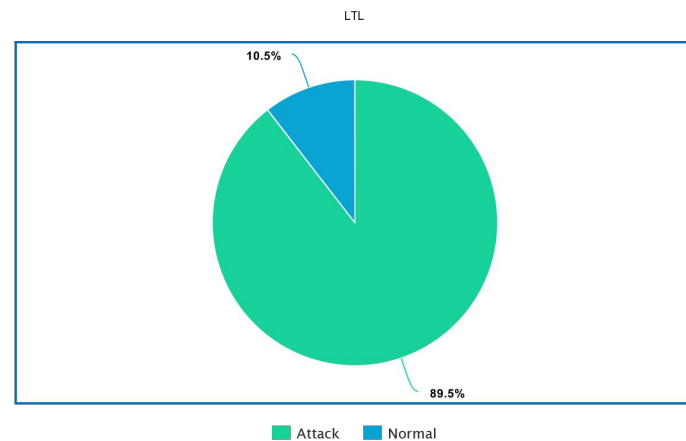
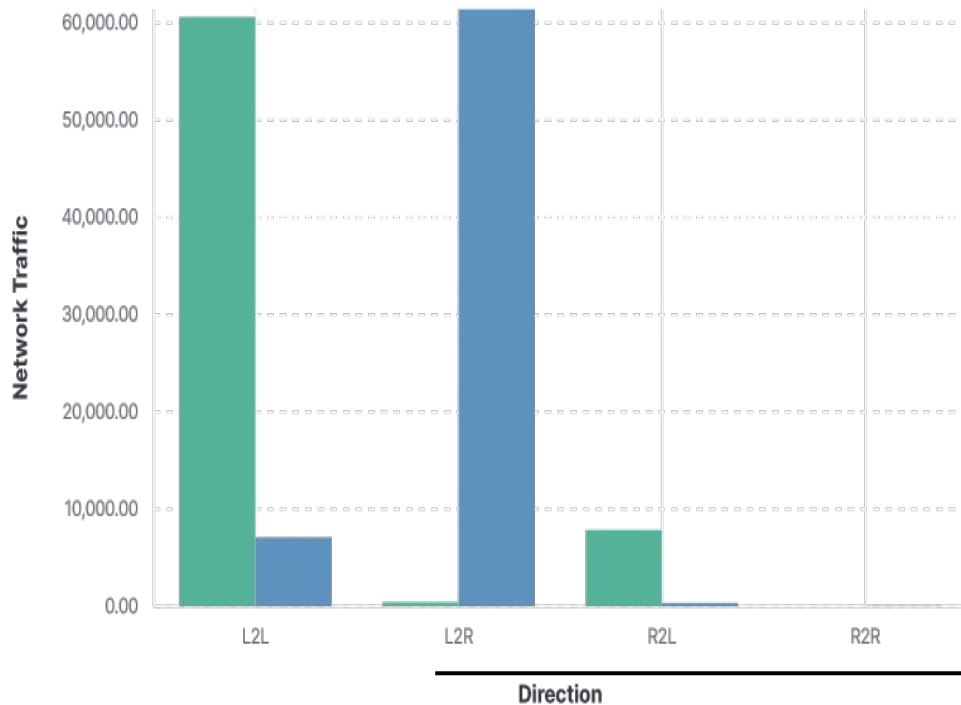
The Model

- Random Forest Classification Model
 - Accuracy rate of approximately 99.5%
 - Multiple iterations to narrow feature selection
 - Trained on iscxIDS2012 data set
-

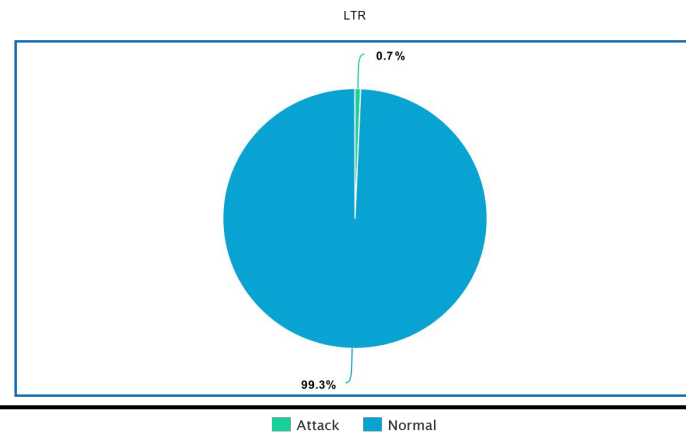
Feature Importance



Direction

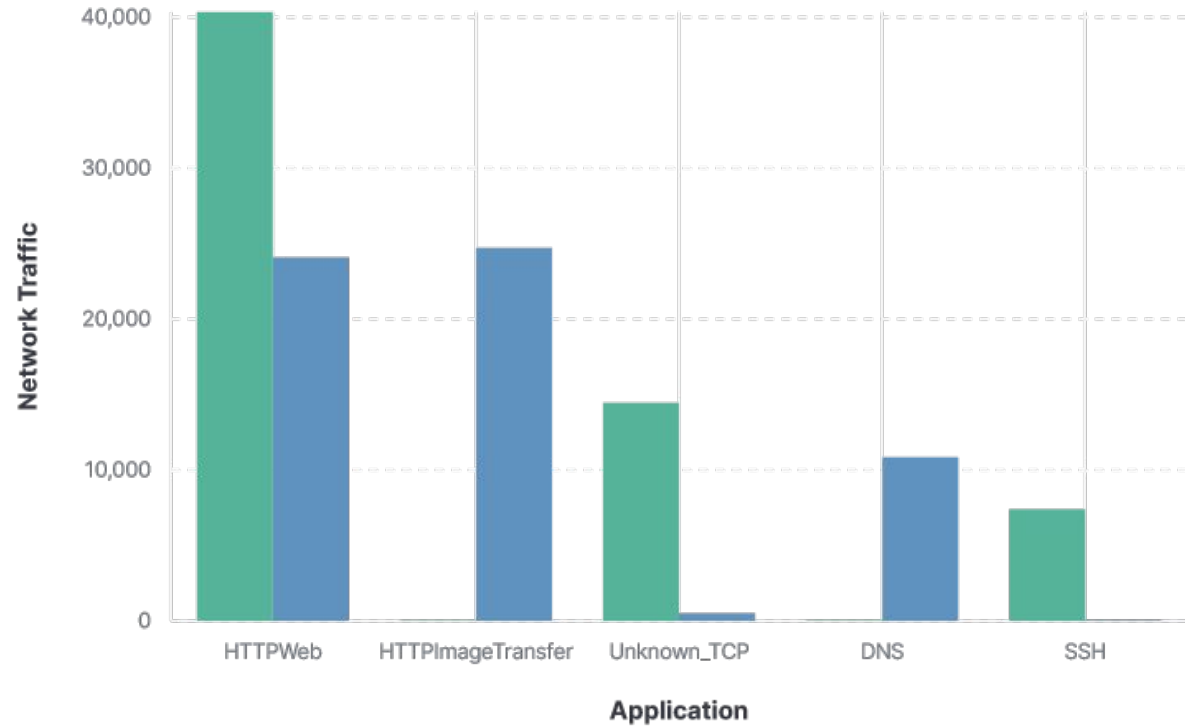


meta-chart.com



meta-chart.com

appName



Cyber Kill Chain

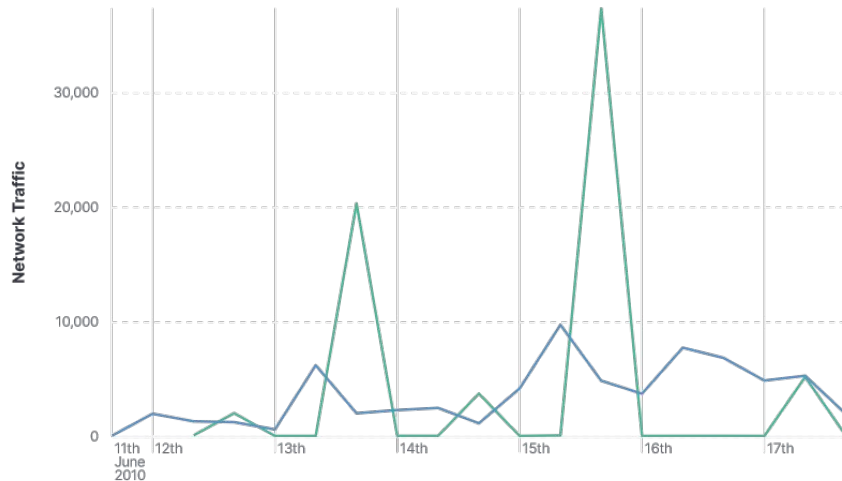
- Dataset does not appear to show port scans
 - Weaponization occurs outside the network
 - The attacker escalates to command and control almost immediately
-

Initial Attack

| | | | | | | | | | | | | | | | | | | | | |
|--------|-----|------------|---|---|----|---------|-----|--------|-----------|-----------|---|---|-------|---------|-----------|-----------|------|----|------|----|
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 34657 | F,S,R,A | 2010-06-1 | 2010-06-1 | 327 | 4 | 346 | 5 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 45410 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 45991 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1384 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 46449 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 46979 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 47466 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 48042 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 48508 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 49108 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 49538 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 50099 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 50486 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 50906 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 51515 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 52038 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 52638 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 53000 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 53591 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 54012 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 54522 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 54855 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 55282 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 55765 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2721 | 15 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 56245 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 56688 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |
| Attack | SSH | 192.168.5. | - | - | 22 | F,S,P,A | R2L | tcp_ip | 67.23.167 | TestbedSa | - | - | 57068 | F,S,P,A | 2010-06-1 | 2010-06-1 | 2651 | 14 | 1368 | 12 |

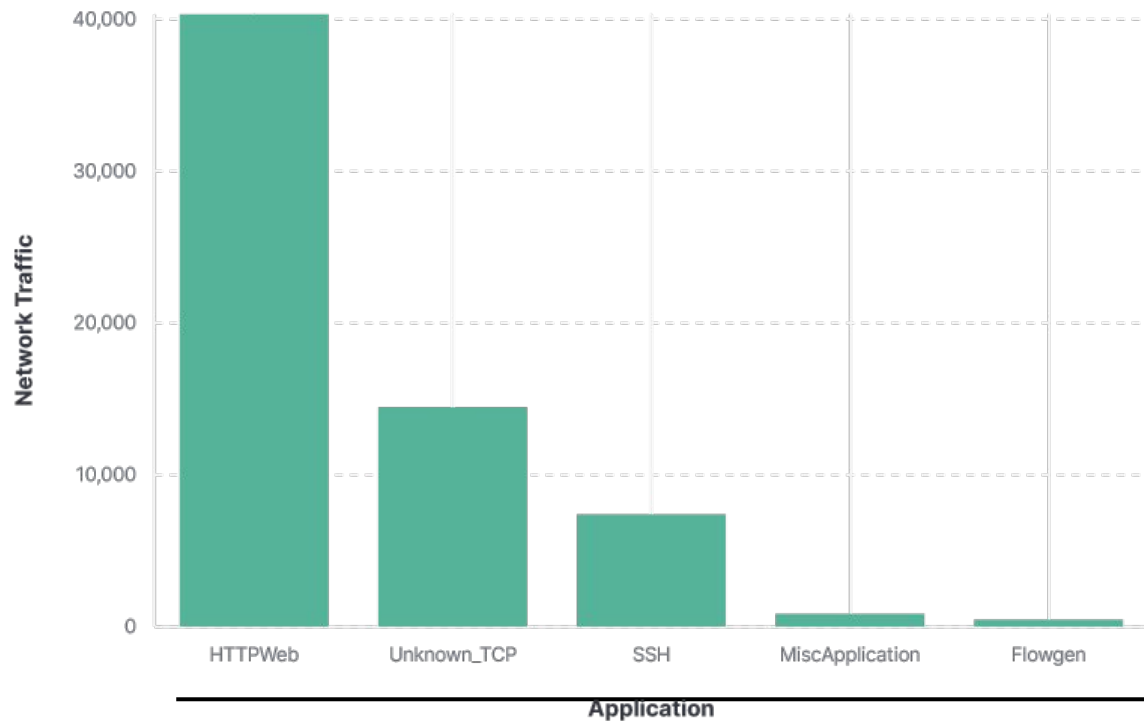
C2 and Actions on Objectives

| | | | | | | | | | | | | | | | | | | | | |
|--------|----------|------------|-----------|------------|------|---------|-----|--------|-----------|-----------|----------|-------------|-------|---------|-----------|-----------|----------|-------|----------|-------|
| Attack | SMTP | 192.168.5. | MjIwIHNIc | 220 server | 25 | F,S,P,A | R2L | tcp_ip | 131.202.2 | TestbedSu | RUhMTyBi | EHLO back | 5096 | F,S,P,A | 2010-06-1 | 2010-06-1 | 1945 | 22 | 11917 | 18 |
| Attack | SMTP | 192.168.5. | MjIwIHNIc | 220 server | 25 | F,S,P,A | R2L | tcp_ip | 131.202.2 | TestbedSu | RUhMTyBi | EHLO back | 5096 | F,S,P,A | 2010-06-1 | 2010-06-1 | 1945 | 22 | 11917 | 18 |
| Attack | SecureWe | 131.202.2 | AGoLAE1a | j.MZ.[REU | 5555 | S,P,A | L2R | tcp_ip | 192.168.1 | TestbedSu | FgMAAFkB | ..Y.U.L.-[N | 54073 | S,P,A | 2010-06-1 | 2010-06-1 | 19592407 | 43476 | 28489776 | 46453 |
| Attack | SecureWe | 131.202.2 | AGoLAE1a | j.MZ.[REU | 5555 | S,P,A | L2R | tcp_ip | 192.168.1 | TestbedSu | FgMAAFkB | ..Y.U.L.-[N | 54073 | S,P,A | 2010-06-1 | 2010-06-1 | 19592407 | 43476 | 28489776 | 46453 |
| Attack | Tacacs | 192.168.1. | - | - | 49 | - | L2L | tcp_ip | 192.168.1 | TestbedSu | - | - | 34431 | S | 2010-06-1 | 2010-06-1 | 0 | 0 | 64 | 1 |
| Attack | VNC | 192.168.1. | - | - | 5900 | R,A | L2L | tcp_ip | 192.168.1 | TestbedSu | - | - | 34431 | S | 2010-06-1 | 2010-06-1 | 64 | 1 | 64 | 1 |



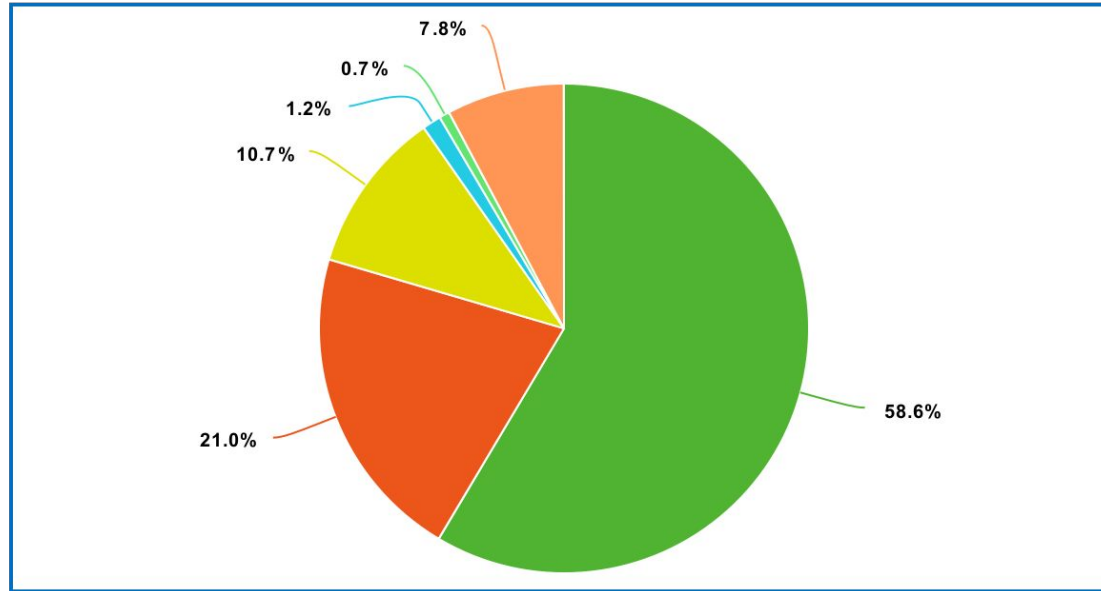
@timestamp per 8 hours

Policy Recommendations



HTTP

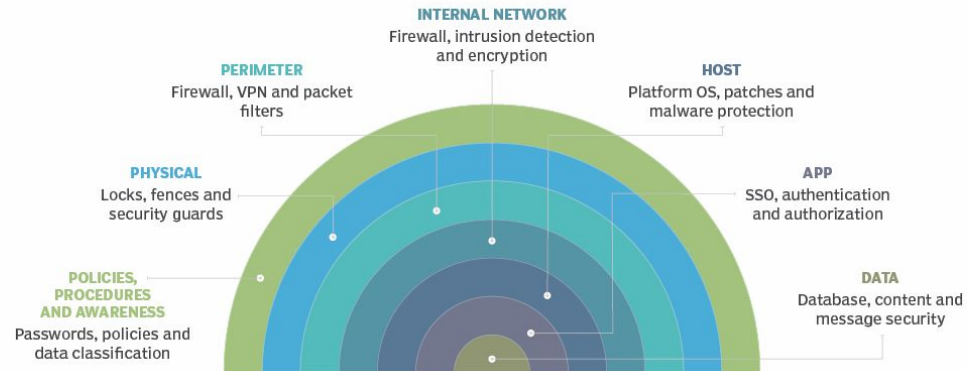
Attacks



■ HTTP ■ Unknown ■ SSH ■ MiscApplication ■ Flowgen ■ Others

SSH

Defense-in-depth layers



Unknown TCP

- Attacks are made against not commonly used ports
- All unused ports should be blocked

| | | | | | | | | | | | | | | | | | | | | |
|--------|---------|------------|----------|------------|-------|---|-----|--------|-----------|-----------|----------|---------------|-------|---|-----------|-----------|-----|---|-----|---|
| Normal | Unknown | 78.29.44.1 | ZDE6cmQy | d1:rd2:id2 | 35095 | - | L2R | udp_ip | 192.168.2 | TestbedTu | ZDE6YWQ | d1:ad2:id2 | 58040 | - | 2010-06-1 | 2010-06-1 | 967 | 4 | 455 | 5 |
| Normal | Unknown | 178.130.4 | - | - | 46131 | - | L2R | udp_ip | 192.168.2 | TestbedTu | QQLM9MH | A.....[M8.. | 58040 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 304 | 4 |
| Normal | Unknown | 98.180.36 | - | - | 10500 | - | L2R | udp_ip | 192.168.2 | TestbedTu | QQI+aMLJ | A.>h..A.8.. | 58040 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 304 | 4 |
| Normal | Unknown | 79.120.49 | - | - | 44807 | - | L2R | udp_ip | 192.168.2 | TestbedTu | ZDE6YWQ | d1:ad2:id2 | 58040 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 113 | 1 |
| Normal | Unknown | 90.18.173 | ZDE6cmQy | d1:rd2:id2 | 12448 | - | L2R | udp_ip | 192.168.2 | TestbedTu | ZDE6YWQ | d1:ad2:id2 | 58040 | - | 2010-06-1 | 2010-06-1 | 967 | 4 | 455 | 5 |
| Normal | Unknown | 70.112.18 | ZDE6cmQy | d1:rd2:id2 | 30593 | - | L2R | udp_ip | 192.168.2 | TestbedTu | ZDE6YWQ | d1:ad2:id2 | 58040 | - | 2010-06-1 | 2010-06-1 | 967 | 4 | 455 | 5 |
| Normal | Unknown | 222.164.8 | - | - | 51413 | - | L2R | udp_ip | 192.168.2 | TestbedTu | ZDE6YWQ | d1:ad2:id2 | 58040 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 113 | 1 |
| Normal | Unknown | 189.61.20 | - | - | 49816 | - | L2R | udp_ip | 192.168.2 | TestbedTu | QQK3u8Zr | A....k..8..A | 58040 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 304 | 4 |
| Normal | Unknown | 95.167.11 | - | - | 49975 | - | L2R | udp_ip | 192.168.2 | TestbedTu | QQLygcg1 | A.....5..8..A | 58040 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 304 | 4 |

ICMP

- Security professionals often recommend blocking ICMP
- ICMP has helpful uses in network troubleshooting
- Recommend rate limiting ICMP to prevent abnormal ICMP usage

| | | | | | | | | | | | | | | | | | | | | |
|--------|------|------------|---|---|---|---|-----|---------|-----------|-----------|----------|---|---|---|-----------|-----------|---|---|-------|-----|
| Attack | ICMP | 192.168.2. | - | - | 0 | - | L2L | icmp_ip | 192.168.1 | TestbedSu | AAAAAAA/ | - | 0 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 50688 | 792 |
| Attack | ICMP | 192.168.2. | - | - | 0 | - | L2L | icmp_ip | 192.168.1 | TestbedSu | AAAAAAA/ | - | 0 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 50688 | 792 |
| Attack | ICMP | 192.168.5. | - | - | 0 | - | L2L | icmp_ip | 192.168.2 | TestbedSu | AAAAAAA/ | - | 0 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 51712 | 808 |
| Attack | ICMP | 192.168.5. | - | - | 0 | - | L2L | icmp_ip | 192.168.2 | TestbedSu | AAAAAAA/ | - | 0 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 51712 | 808 |
| Attack | ICMP | 192.168.3. | - | - | 0 | - | L2L | icmp_ip | 192.168.2 | TestbedM | AAAAAAA/ | - | 0 | - | 2010-06-1 | 2010-06-1 | 0 | 0 | 51712 | 808 |

Telnet

- Incredibly vulnerable protocol
- Network traffic is sent in clear text
- Should always be disabled

| | | | | | | | | | | | | | | | | | | | | |
|--------|--------|------------|---|---|----|-----|-----|--------|-----------|-----------|---|---|-------|---|-----------|-----------|----|---|----|---|
| Attack | Telnet | 192.168.2. | - | - | 23 | R,A | L2L | tcp_ip | 192.168.1 | TestbedSu | - | - | 54817 | S | 2010-06-1 | 2010-06-1 | 64 | 1 | 64 | 1 |
| Attack | Telnet | 192.168.2. | - | - | 23 | R,A | L2L | tcp_ip | 192.168.1 | TestbedSu | - | - | 54817 | S | 2010-06-1 | 2010-06-1 | 64 | 1 | 64 | 1 |
