# Understanding the Context of Network Traffic Alerts

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## Motivation

Networks are constantly under attack from malicious users.

Attacks are hidden inside a massive amount of harmless traffic.

Experts require tools to detect and correlate malicious messages in a sea of traffic.

# Data: Wireshark log

- Fine grained
- Dense
- Attacks are hidden

		eth0: Cap	oturing - Wire	shark	
<u>File E</u> dit <u>V</u> iew <u>O</u>	<u>io C</u> apture <u>A</u> nalyze <u>S</u> tat	istics <u>H</u> elp			
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	63 ThomsonT_08:35:4f	Wistron_07:07:ee	ARP	192.168.1.254 is at 00:90:d0:08:35:4f	
48 139.9314		192.168.1.254	DNS	Standard query A www.google.com	
	06 192.168.1.254	192.168.1.68	DNS	Standard query response CNAME www.l.google.co	
	11 192.168.1.68	66.102.9.99	TCP	62216 > http [SYN] Seq=0 Win=8192 Len=0 MSS=1	
51 140.0795		192.168.1.68	TCP	http > 62216 [SYN, ACK] Seq=0 Ack=1 Win=5720	
	83 192.168.1.68	66.102.9.99	TCP	62216 > http [ACK] Seq=1 Ack=1 Win=65780 Len=	
53 140.0802		66.102.9.99	HTTP	GET /complete/search?hl=en&client=suggest&js=	
	65 192.168.1.68	66.102.9.99	TCP	62216 > http [FIN, ACK] Seq=805 Ack=1 Win=657	
	21 192.168.1.68	66.102.9.99	TCP	62218 > http [SYN] Seq=0 Win=8192 Len=0 MSS=1	
56 140.1974		192.168.1.68	TCP	http > 62216 [ACK] Seq=1 Ack=805 Win=7360 Ler	
57 140.1977		192.168.1.68	TCP	http > 62216 [FIN, ACK] Seq=1 Ack=806 Win=736	
58 140.1978		66.102.9.99	TCP	62216 > http [ACK] Seq=806 Ack=2 Win=65780 Le	
50 1/0 2102	010 66 100 0 00	102 160 1 60	TCD	http - 60010 [CVN ACK] 600-0 Ack-1 Win-5700	1 on-0 Mcc-1/20
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020 00 00 00 0	0 00 00 c0 a8 39 02		9.		
	in progress> Fil Packets	: 445 Displayed: 445 Marke	1	Profile: Defau	

# Data attributes

- 1. Timestamp
- 2. Ip address
- 3. Mac address
- 4. Protocol
- 5. Protocol flags
- 6. Message size
- 7. Many more metadata attributes

## Anatomy of an attack

- Localized to a time interval
- Composed of many messages
- Can span multiple machines
- Exhibit uncommon behaviour

Example: Man in the middle

Malicious user intercepts, potentially modifies, and relays messages.

## ML tools

Tools such as snort and Bro use ML to detect attacks.

- 1. Train on sample traffic
- 2. Monitor streaming traffic
- 3. Output outliers, and known attack patterns

#### Downsides

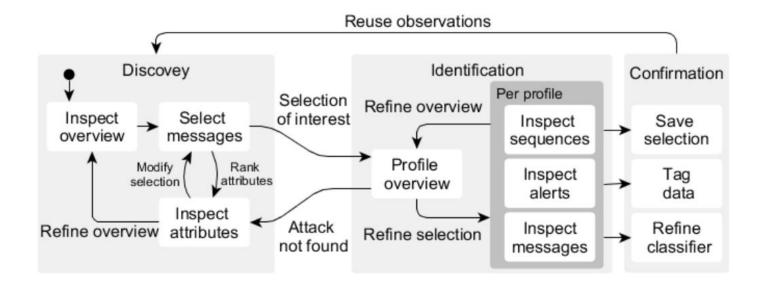
- 1. Lots of alerts
- 2. Large number of false positives
- 3. Difficult to query
- 4. No intuitive feedback





#### CoNTA - Contextual Analysis of Network Traffic Alerts

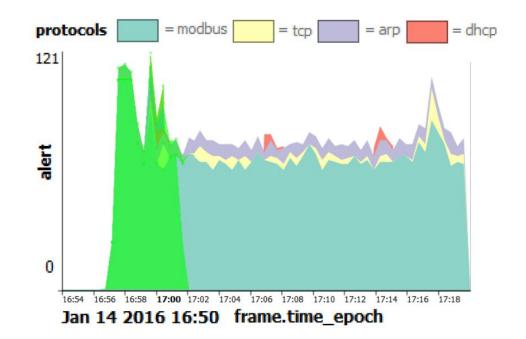
Interactive discovery and refinement of alerts.



# Discovery (Time table)

Experts identify anomalies by examining high level trends such a bursts.

- IDS alerts are plotted as a stacked line chart
- X axis Time
- Y axis Message attribute

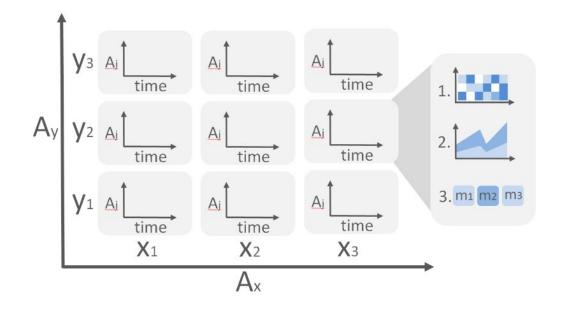


#### Time Table grid view View

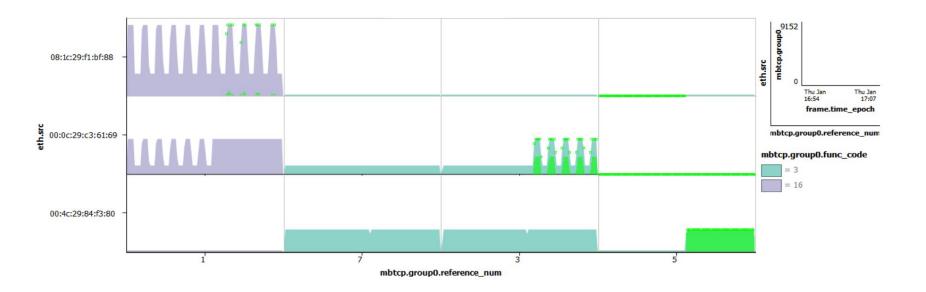
Y axis: Machines

X axis: Attributes

Display allows for the visual correlation of alerts which compose an attack.

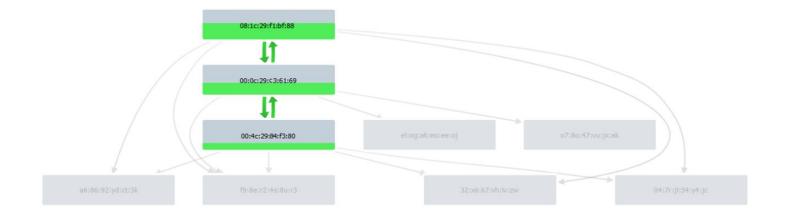


#### Time Table example 3 separate mac addresses



# **Discovery: Conversation View**

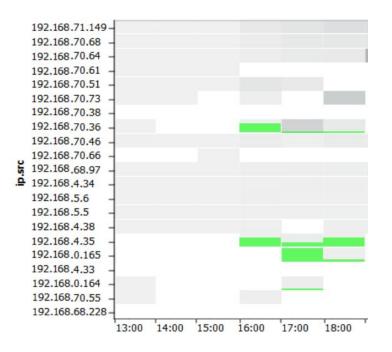
- Communication topology is useful for identifying malicious and colluding machines.
- Thickness of edges corresponds to bandwidth



# Discovery: Heat map

- General aggregate information displayed as heatmap
- Useful for detecting high level trends

\*Alerts per IP over time

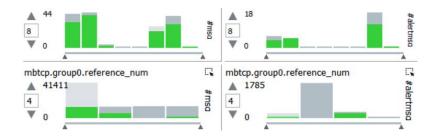


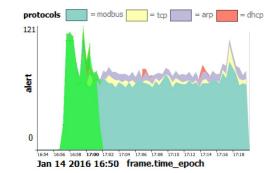
#### **Identification: Selection**

Users select areas of interest

Selected data is highlighted in green

All visuals are updated with selected data

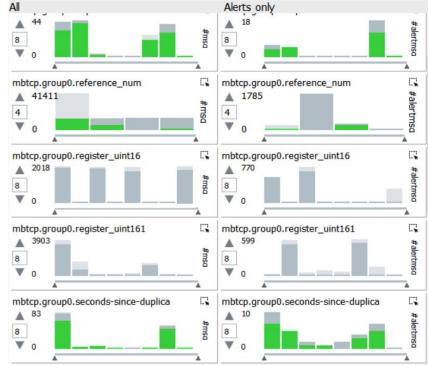






# Identification (Attribute Histograms)

- Traffic is bucketed into histograms based on attributes.
- Left column shows the distribution of all traffic
- Right column shows the distribution of alert traffic only



## Interactive Identification

A data packets can have hundreds of attribute values, experts need to filter and search for information relevant to an attack.

- Manually set #of attribute buckets
- Sort histogram
  - Alphabetical
  - Most alerts
  - Relevance

## **Interactive Classification**

IDS false positives are high, CoNTA uses 4 interactive training strategies:

- 1. Filtering
- 2. Projection
- 3. Binning
- 4. Self training

# Confirmation (inspecting messages)

- Pixel map encodes individual messages
- Attributes are color coded
- Red outlines encode alert messages
- Upon selection raw message data is displayed



# **Context Preservation**

Sta	atus	Context	#Packets	#Alerts	Coverage	Alerts
4	0	all	84209	2475		
	0	alert burst	22292	1171		
	۲	suspicious connection modbus	55215	2101		]

- Selecting and zooming can cause a loss of context
- Iterative selections form a hierarchy
- The hierarchy is displayed as a tree
- Histogram display the coverage of the selection

# Evaluation (use cases)

Water Plant (synthetic)

- Detected man in the middle attack
- Used [Line chart, histograms, pixel map]

University (real logs)

- Detected a user remotely installing software
- Used [heatmap, manual filtering, conversation topology]

#### Time for a demo video ??



# What Why How

#### What

- messages and alerts from IDS
- Communication graph

#### Why

- Attack detection
- Correlation between malicious messages

#### How

- High level heat maps, and line charts to detect patterns
- Mouse selection, and queries to facet data
- Pixel map for inspecting individual packets

## Limitations

- Histograms don't scale well if the number of attributes are high
- Number of visible attributes is constrained by the number of histograms
- Requires an IDS that supports interactive learning

# Critique

- Information about malicious packets are spread across many histograms perhaps clustering (tSNE) alerts on their attributes would help detect trends.
- Selections must be contiguous, making correlations between multiple features difficult.
- All visualizations are built for a 5 20 machine network, so they do not apply to data centers which desperately need them.
- Pixel packet view is not temporally aligned which could cause confusion.
- Color contrast (green on gray) has great pop out and is effective at maintaining context between views.

## Conclusion

- CoNTA provides an interactive attack detection framework
- Helps experts translate high level phenomenon to packet attributes
- Has a very nice selection interface

#### Questions ???