



Data Analytics in Cyber-Security and Threat Intelligence



2015 Notable Cyber-Security Incidents



BLUE CROSS

January: 11.2M Subscribers impacted



February: 80M patients and employees impacted



June: Corporate Intellectual Property stolen

]HackingTeam[

July: 1M emails published and Intellectual Property stolen

T··Mobile



September: information from 15M T-Mobile customers affected



July: 850,000 members impacted

PENNSTATE



May: 18,000 people impacted



February: \$1B cvberheist impacting as many as 100 banks worldwide



May: 1.1M Subscribers impacted



June: Compromised subscriber data

HARVARD UNIVERSITY



July: 8 schools and Administrative offices impacted



October: information from 5M customers compromised

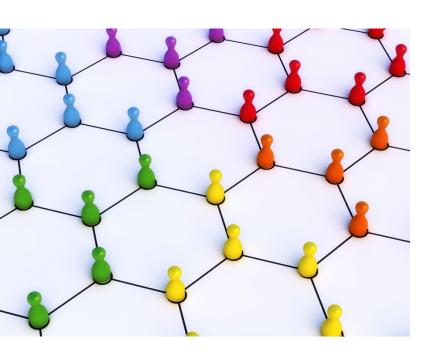


Big data analytics tools will be the first line of defense, combining machine learning, text mining and ontology modeling to provide holistic and integrated security threat prediction, detection, and deterrence and prevention programs.

- The International Institute of Analytics (IIA)



Big Data Example: Suspected Iran-Based Hacker Group Creates Network of Fake LinkedIn Profiles







Researchers uncovered a network of 25 fake, convincing profiles forming a self-referenced network of seemingly established LinkedIn users



The purpose of this network is to target potential victims through social engineering

Big Data Example: Suspected Iran-Based Hacker Group Creates Network of Fake LinkedIn Profiles



DATA DISCOVERY

- Profile photograph linked to multiple identities across numerous websites
- Summary in one profile is identical to a legitimate LinkedIn profile
- Employment history matches a sample résumé downloaded from a recruitment website
- Job descriptions were copied from legitimate job postings

THE OUTCOME:

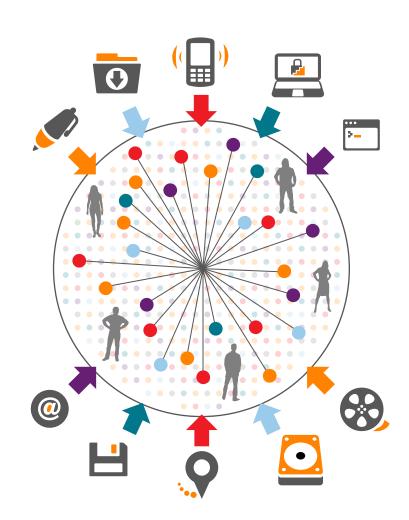


Linked to documented threat actors using malware disguised as a résumé application



The Data Problem

- Significant volume of data
- Varying formats
- High dimensional
- Non-linear classification (at least not in reasonable high dimensional spaces)
- Requires near real-time event processing and continuous data integration
- Multi-dimensional anomaly detection can be computationally expensive
- When you add social media, NLP comes into play



Tackling the Trivial Pieces

Data adaptation layer

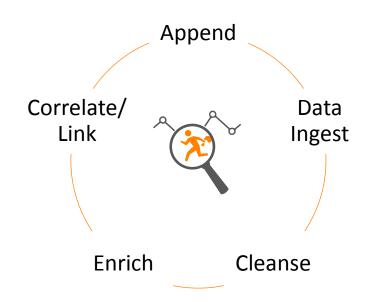
- Parsing and structuring data (50-100 different log formats to deal with)
- Data enrichment (geo-location, name resolution, tagging, etc.)

Stream/event processing

- Feature/Fact extraction
- Heuristics based event processing and lightweight correlation
- Classification/anomaly detection



The Cool Parts



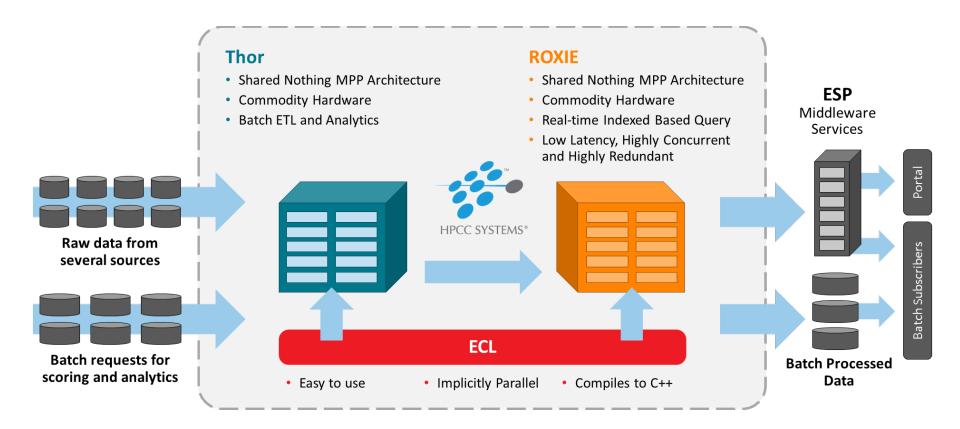
Human-machine collaboration is a good opportunity for active learning

- Deterministic/probabilistic data linkage
- Distribution analysis for anomaly detection
- Build/append to entity relationship model
- Rank anomalies/events and bubble them up for the analysts to review and label
- Learn, rinse, repeat

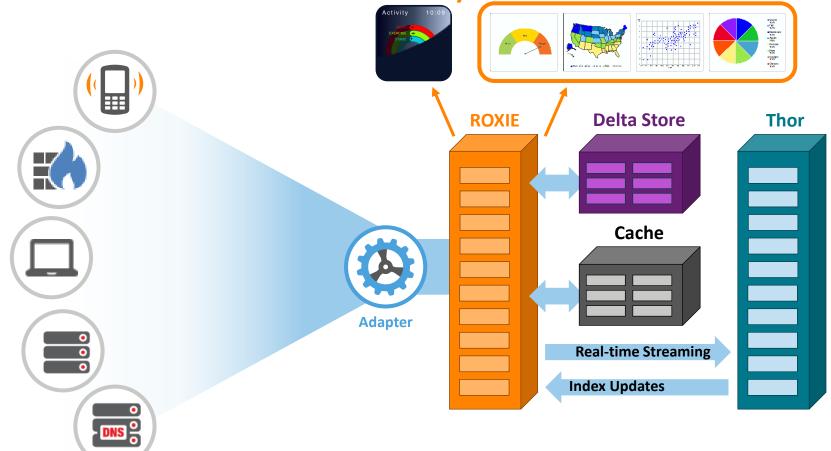
The Real Challenge

- Limited analyst bandwidth
- Manual exploration takes long and requires significant expertise
- Feature extraction and feature creation is difficult and error prone (hierarchical learning of higher order features shows promise)
- Important information may not be available to the system and/or available only on demand
- Cyber-security events are, hopefully, anomalies, so don't expect
 a training set large enough to offset dimensionality

How We Do It



Real-Time Collection and Analytics Platform



In a Nutshell

- Millions of application transaction log records per day
- Combine information from network routers, DNS servers, etc.
- Use third party sources to identify blacklisted information
- Apply learning techniques to match the digital footprint to identify the virtual identities
- Prevent intrusions by detecting anomalies and actively block known bad actors

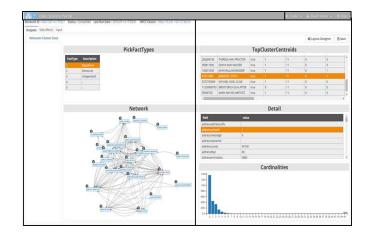




How does it look?

- Build complex relationship graphs easily using a drag and drop visual interface
- Gain insight into hidden relationships using state of the art visualization techniques







What's next?

- Accelerated stream processing with hybrid computing
 - Micron in-memory Finite State Machines
 - > FPGA
 - Co-processors
- Tighter integration with other systems
 - Mitre CRITS
 - Google GRR
 - Sandboxing, malware detection, etc.
- Leverage social media feeds and non-traditional threat intelligence sources
- Take over the World No, not really.....

Resources

- Open Source HPCC Systems Platform: http://hpccsystems.com
- Source Code on GitHub: https://github.com/hpcc-systems
- Free Online Training: http://learn.lexisnexis.com/hpcc
- HPCC Community Forums: http://hpccsystems.com/bb
- ECL-WLAM: https://github.com/hpcc-systems/ECL-WLAM
- Mitre CRITS: http://www.mitre.org/publications/project-stories/cyber-intelligence-gets-even-smarter-with-crits
- Google GRR: https://github.com/google/grr



Thank You Very Much!

Questions?





