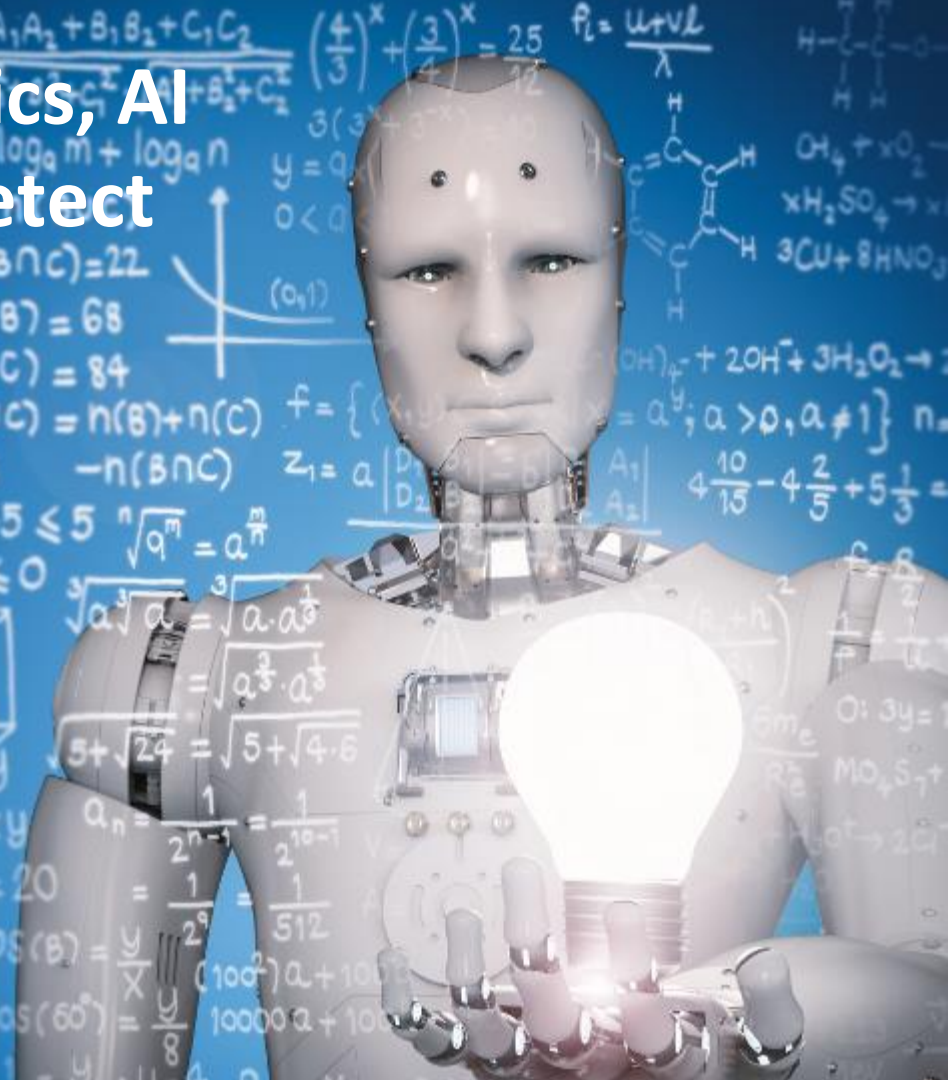


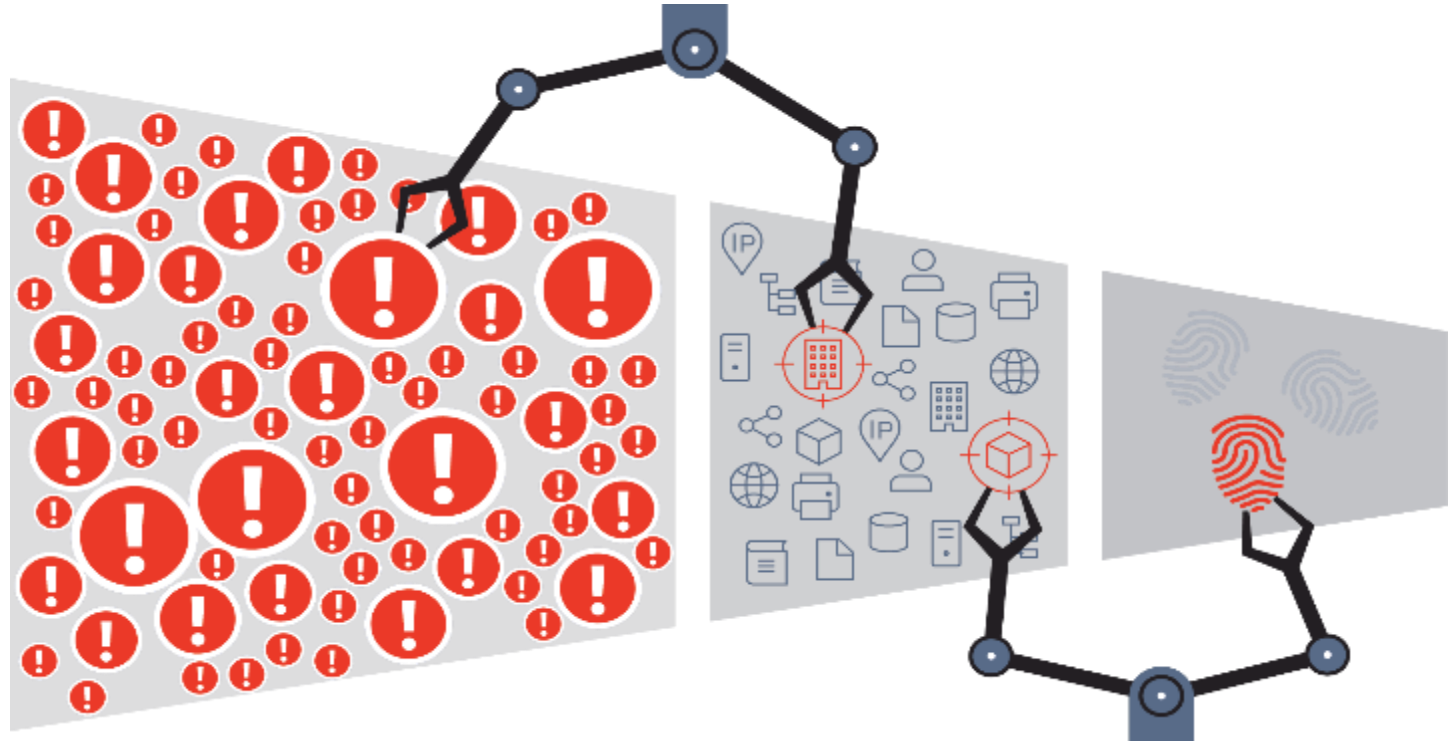
The use of behavior analytics, AI and Machine learning to detect network breaches.

Niel Pandya
Security Business Development Lead
APJ



What Intersect Does: Detect Threats within the network based on behavior

Billions of Events → Hundreds of Anomalies → A Handful of Prioritized Threat Leads



Interset

An outside attacker has only a minimal understanding of a compromised account's access levels and the target data's location.

Because of this, an outside attacker attempting to complete reconnaissance and lateral movement stages of an attack will look very different from normal users.

Select the right tool for the job



Data Breach

- Data Staging
- Data Exfiltration
- Email Exfiltration
- Print Exfiltration
- USB Exfiltration
- Unusual data access
- Unusual uploads



Advanced Threat

- Compromised Account
- C2 Activity Detection
- Impossible Journeys
- Internal Recon
- Dormant Account
- Unusual Traffic
- Password Manipulation
- Abnormal Processes
- Unusual Applications
- Infected Host
- Malicious Tunneling
- Bot Detection



IP Theft

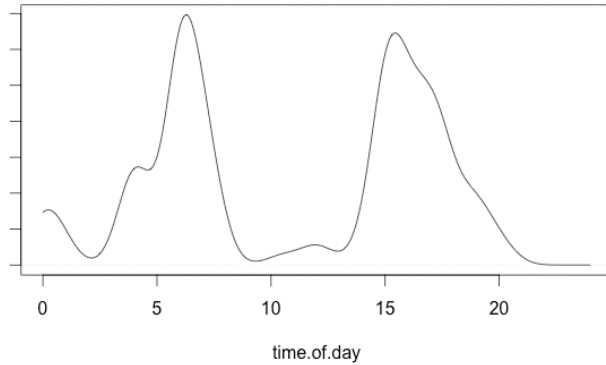
- Mooching
- Snooping
- Interactions with dormant resources/files
- High Risk IP/Data Access
- Lateral Movement



Fraud

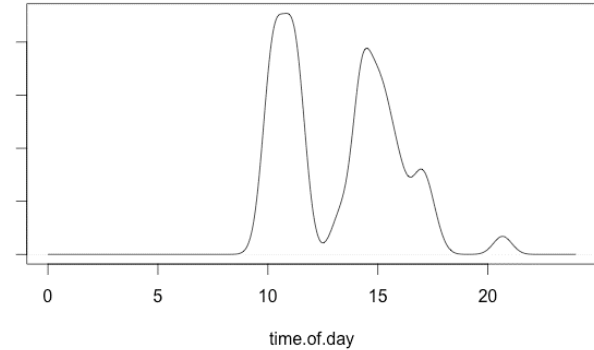
- Transaction Abuse
- Expense Fraud

Working hours (like most behaviors) vary from person to person



Employee 1

- Starts work fairly early in morning
- Early lunch break
- Sometimes works past midnight



Employee 2

- Fewer hours than Employee 1
- More a traditional “9-to-5” worker
- Occasionally works a bit after 8pm

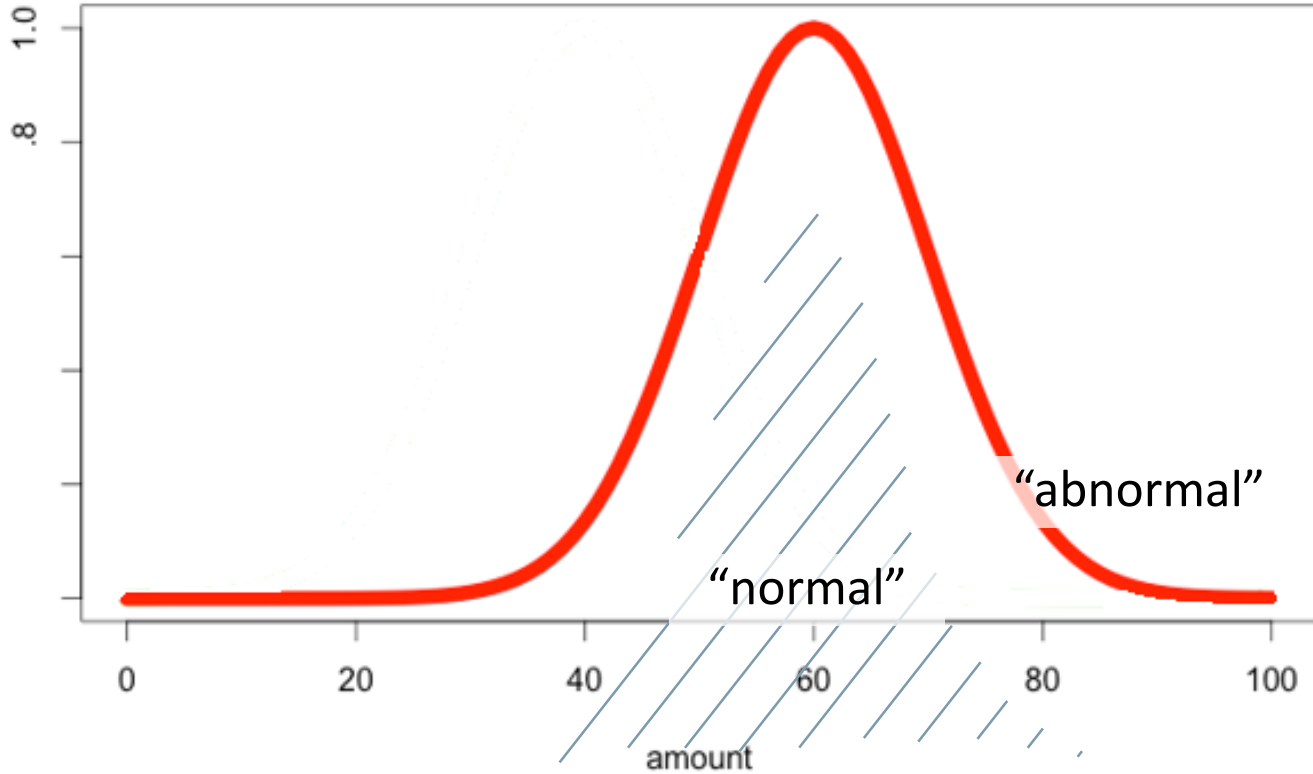
Detecting threats within the network

***if the mail is from the departing insider
and the message was sent in the last 30 days
and the recipient is not in the organization's domain
and the total bytes summed by day are more than a specified threshold
then send an alert to the security operator***

A Pattern for Increased Monitoring for Intellectual Property Theft by
Departing Insiders, Andrew Moore, Carnegie Mellon 2011

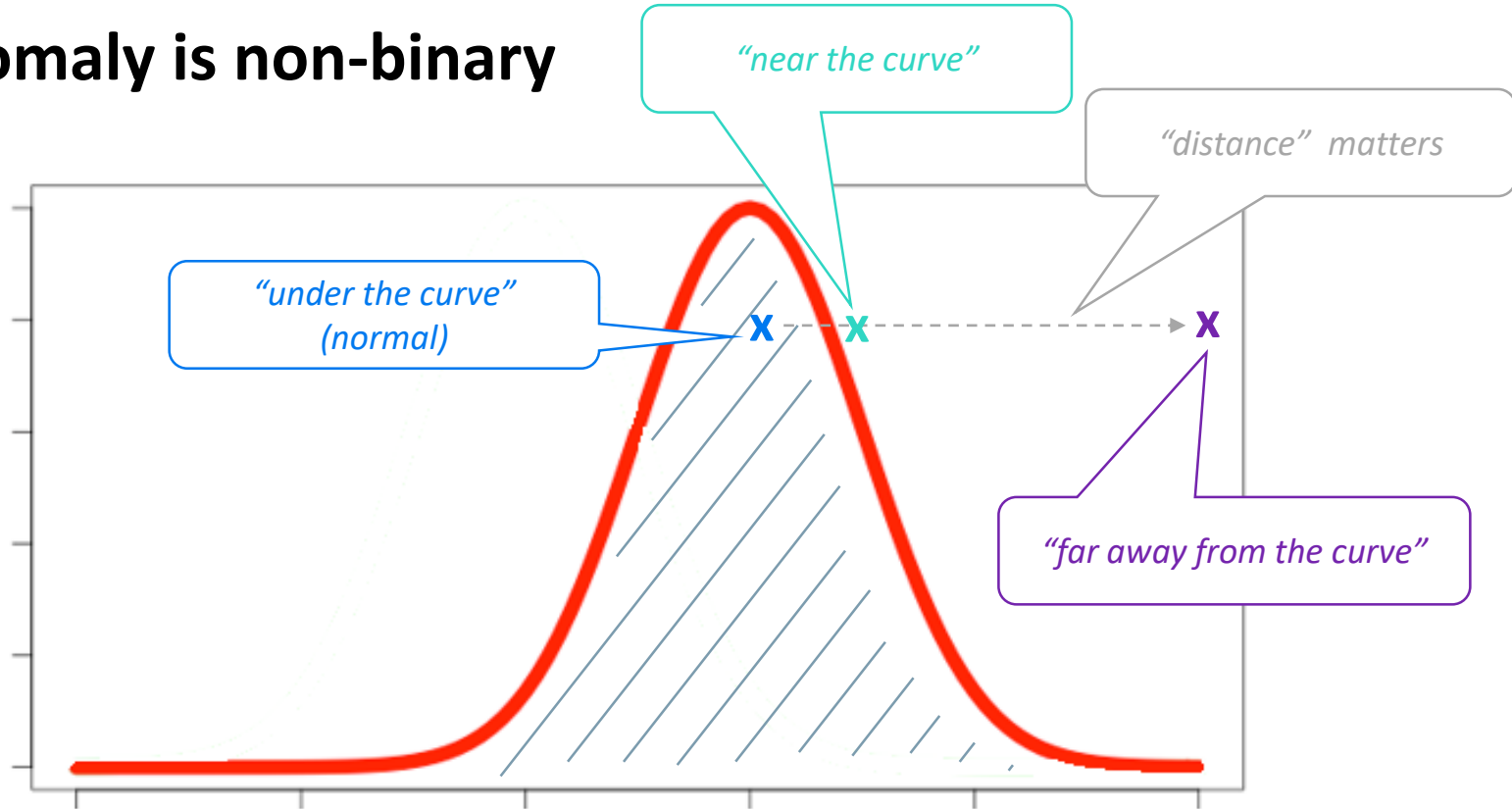


Ru



When only “under” or “outside” the curve matter, then the paradigm is binary

An anomaly is non-binary

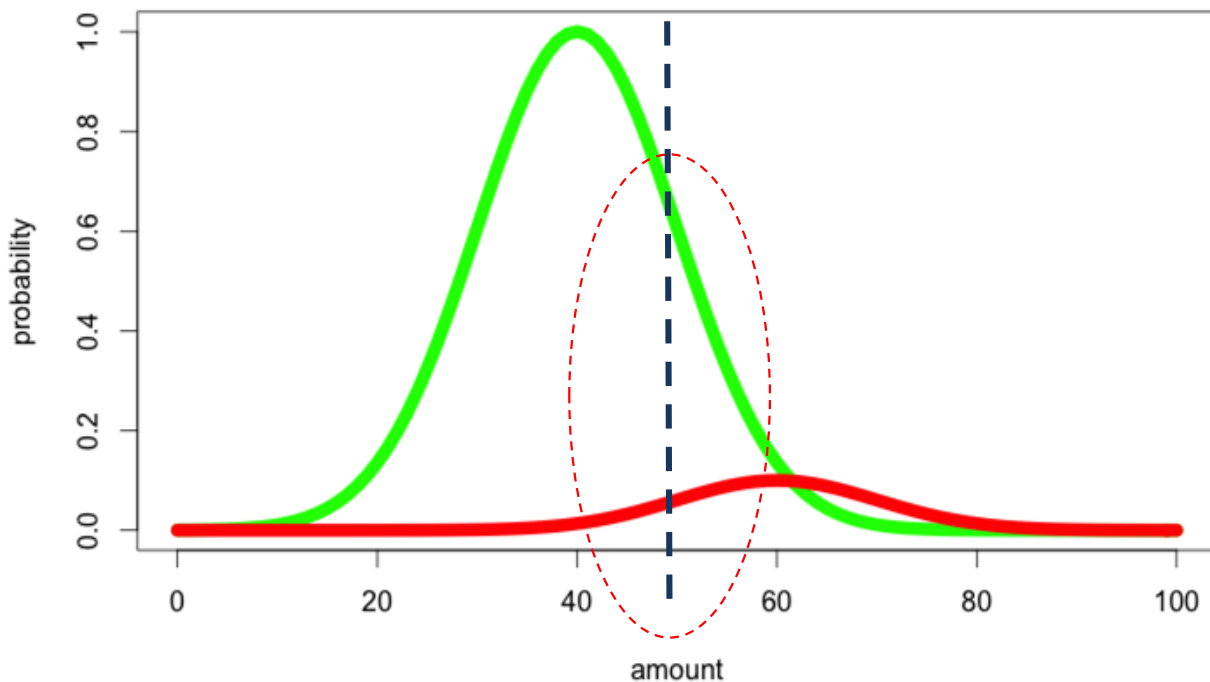


“Distance off” the curve matters – the further away the value is from an expected result, the more it matters: how abnormal is it?

Detecting threats within the network

***if the mail is from the departing insider
and the message was sent in the last 30 days
and the recipient is not in the organization's domain
and the total bytes summed by day are more than a specified threshold
then send an alert to the security operator***

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Detecting threats within the network



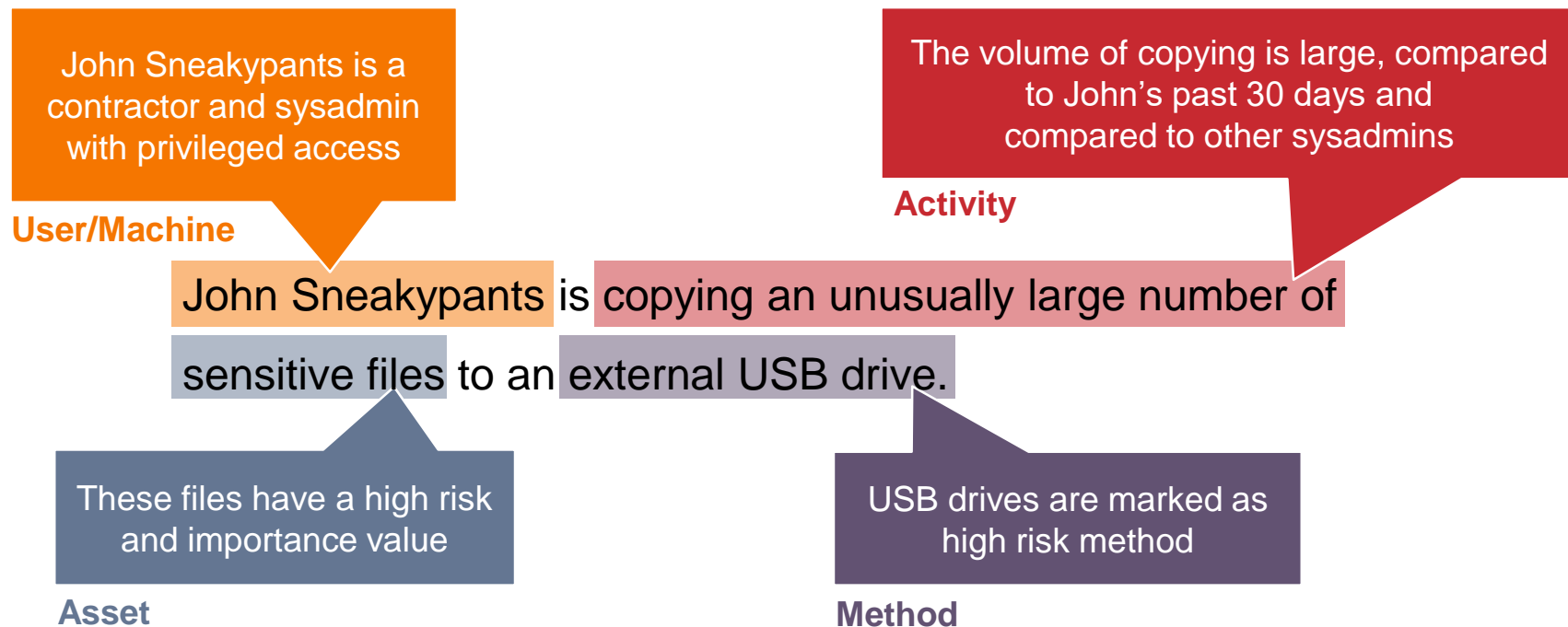
*if a person sends an email
and the data contained in the
email is an unusual amount
compared to the person's
historical unique normal baseline
then trigger a high probability /
high risk anomaly alert*

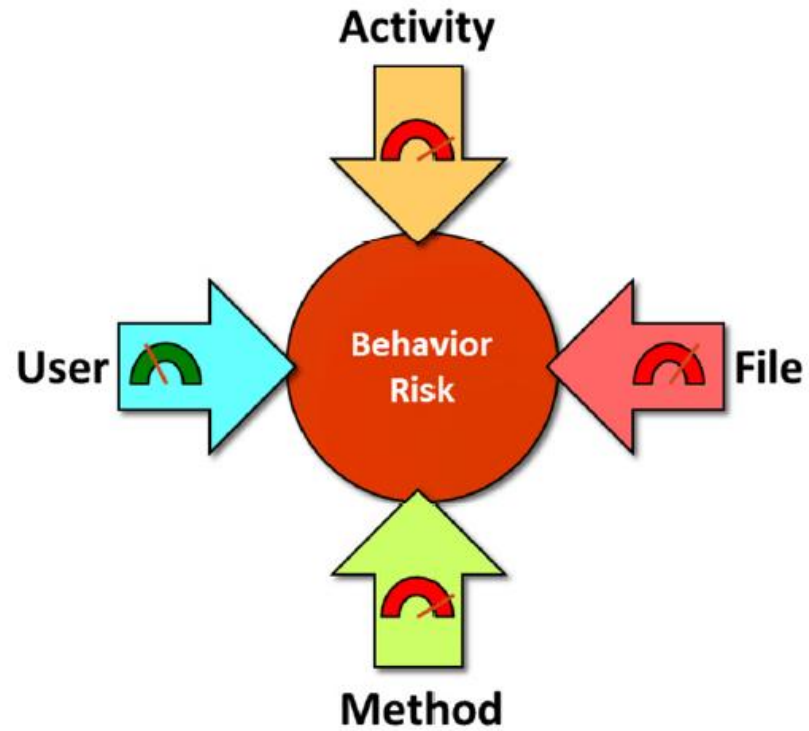
Billie.Dennis sent 13.9MB of data via email in a day, a larger email size than normal. **Billie.Dennis** typically sends at most 163kB of data via email in a day.

Exfiltration Data Sent Email **Billie.Dennis**



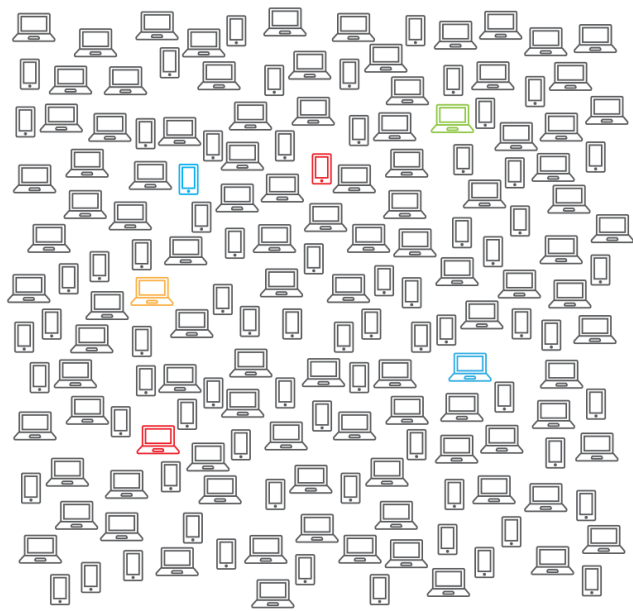
The Math: Quantifying Unusual Behaviors





EDR and Intersect

Endpoint Threat Detection With Intersect



- Credential Access
- Lateral Movement
- Discovery
- Data Exfiltration

Intersect’s advanced user and entity behavioral analytics (UEBA) analyzes billions of events and shines a new light on user information—such as abnormal login frequency, date or time of work, unusual machines—in order to expose difficult-to-find threats. Intersect’s partnership with CrowdStrike combines detailed and accurate data provided by CrowdStrike Falcon, giving security teams the necessary context to detect signs of credential access, discovery, lateral movement, or data exfiltration quickly and effectively.



Differentiators: Dynamic Peering

Peering (The way everyone else does it...)

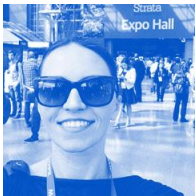
Product



Stephan Jou
CTO



Shaun Pilkington
Intern



Maria Pospelova
Data Scientist

Engineering



Michael Iles
Level I Developer



Emilie Lavigne
Level III Developer



Josh Mahonin
QA

Sales



Mario Daigle
Regional Director



Pabi Ambikainathan
Account Exec



Jay Lillie
Sales Engineering

Peering (Locations according to the org chart)

Product



R & D



Prj X

Engineering



Prj A



Prj C



Prj B



Prj D

Sales

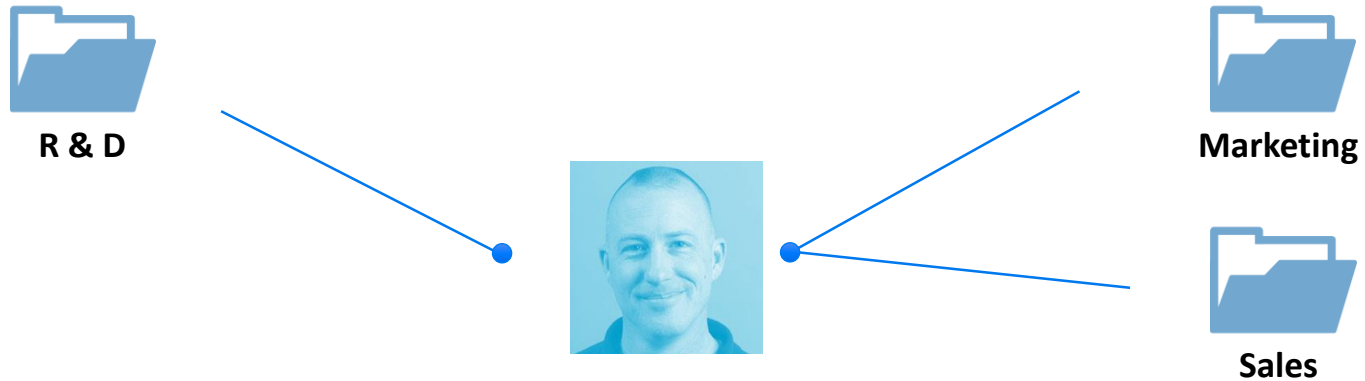


Marketing

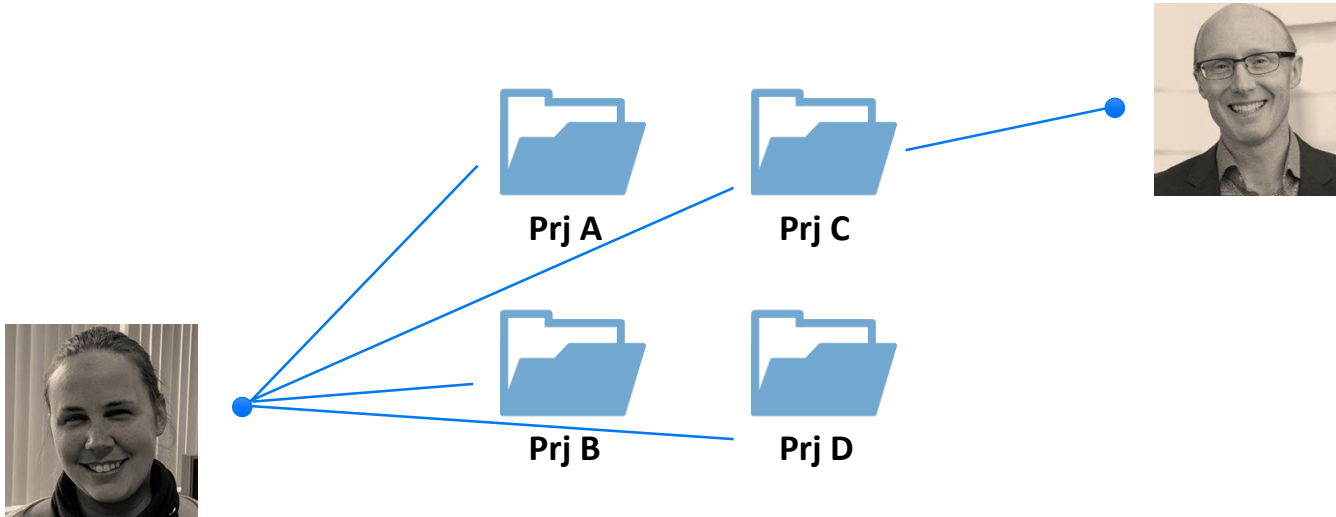


Sales

Peering (One of many exceptions...)



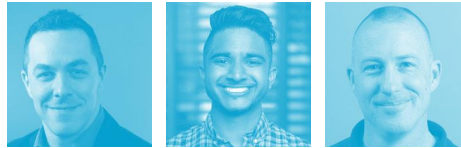
Peering (Even more patterns...)



Peering (The Interaset way)

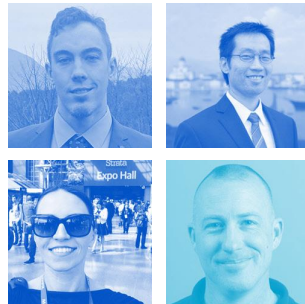
Group A

Sales
Contacts



Group B

R & D
Folder



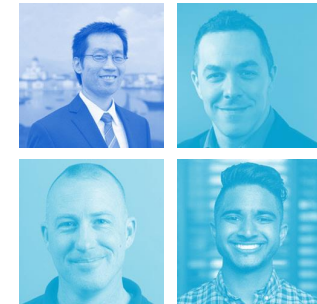
Group C

Prj X



Group D

Marketing
Folder

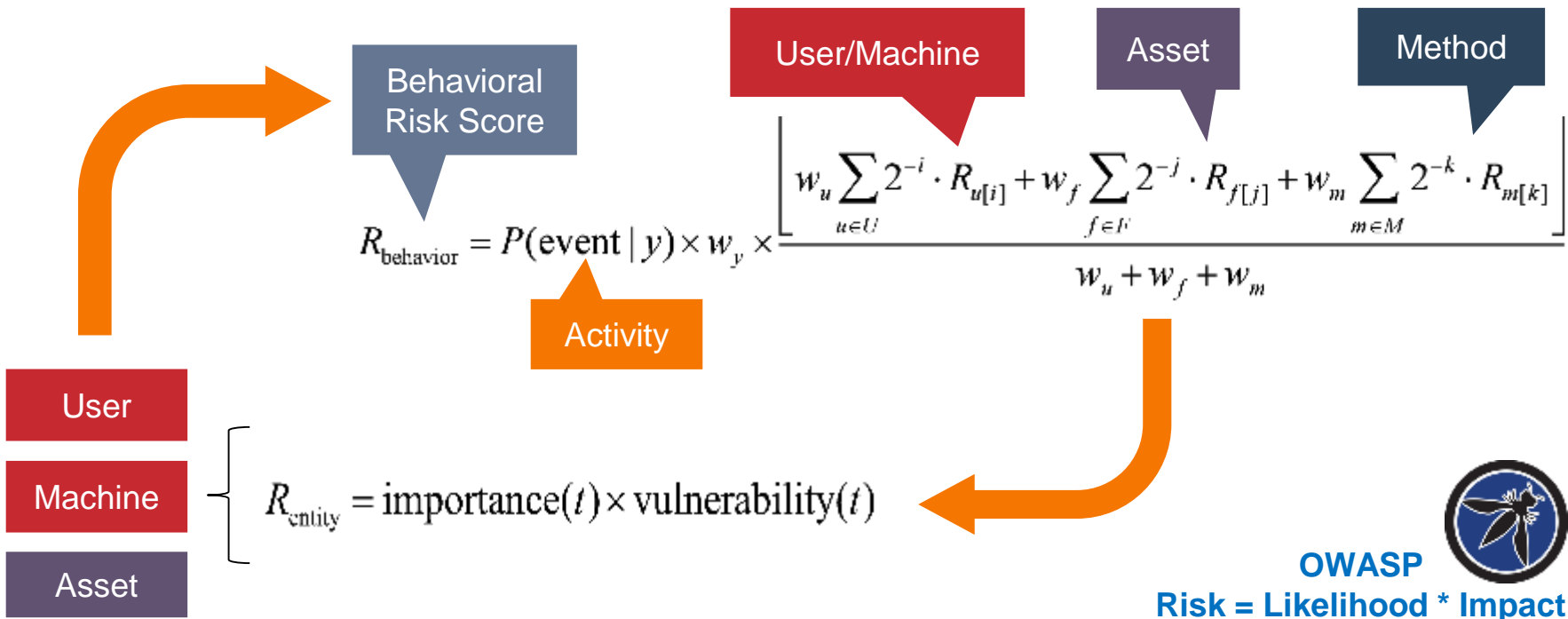


Peering (The Interset way)

Don't try to manage all of these groups or maintain rules...

...instead, survey the ecosystem and find the patterns to determine what is out of place

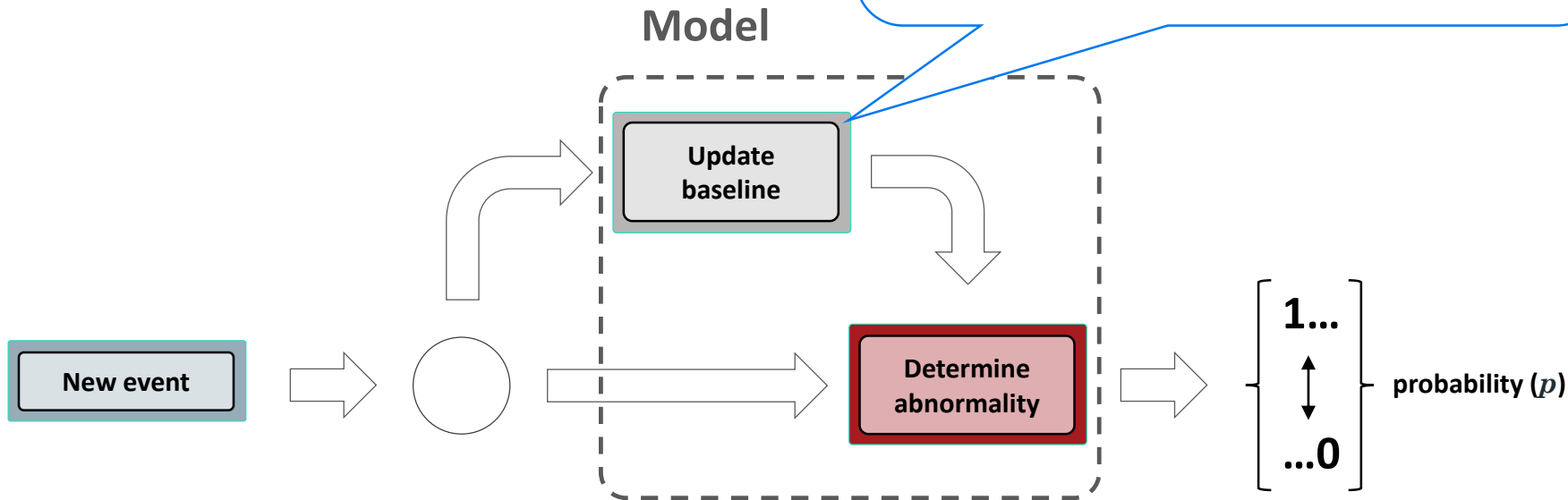
The Math: Quantifying Risky Entities



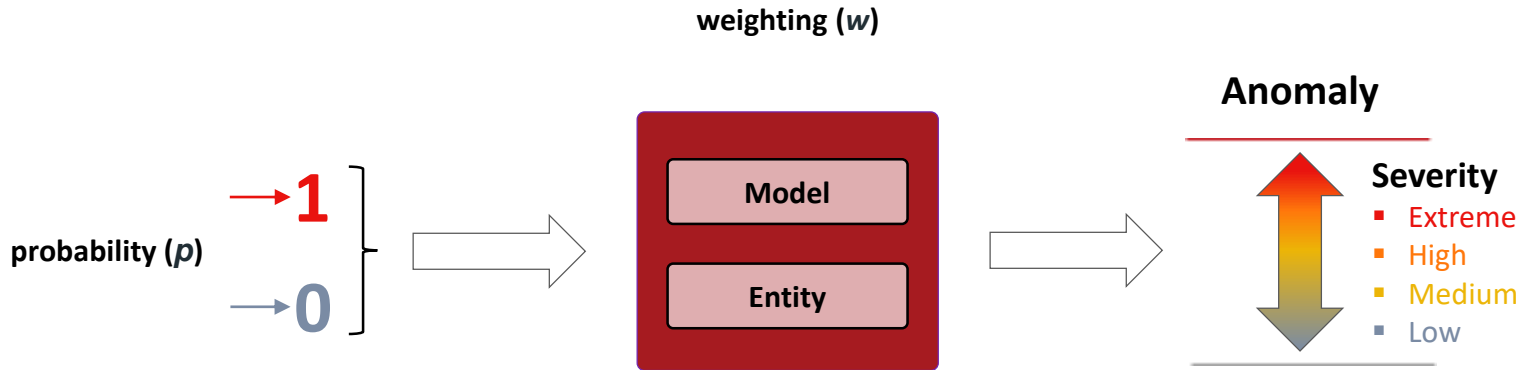
Determine probability...

When we talk about a “dynamic” baseline, this is what we mean. It changes over time:

- It is based only on what we observe in situ
- Every new event is incorporated
- It is not based on any “third party” expected behavior



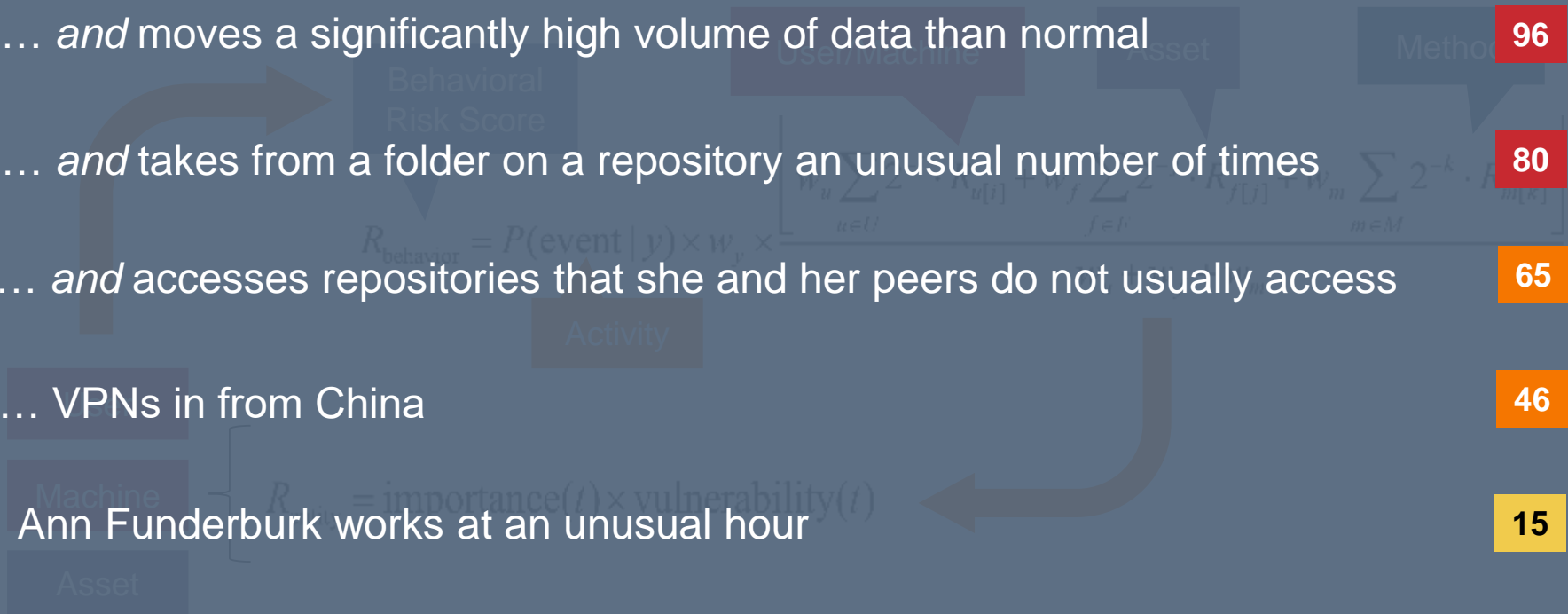
...and combine with weighting to get an alert



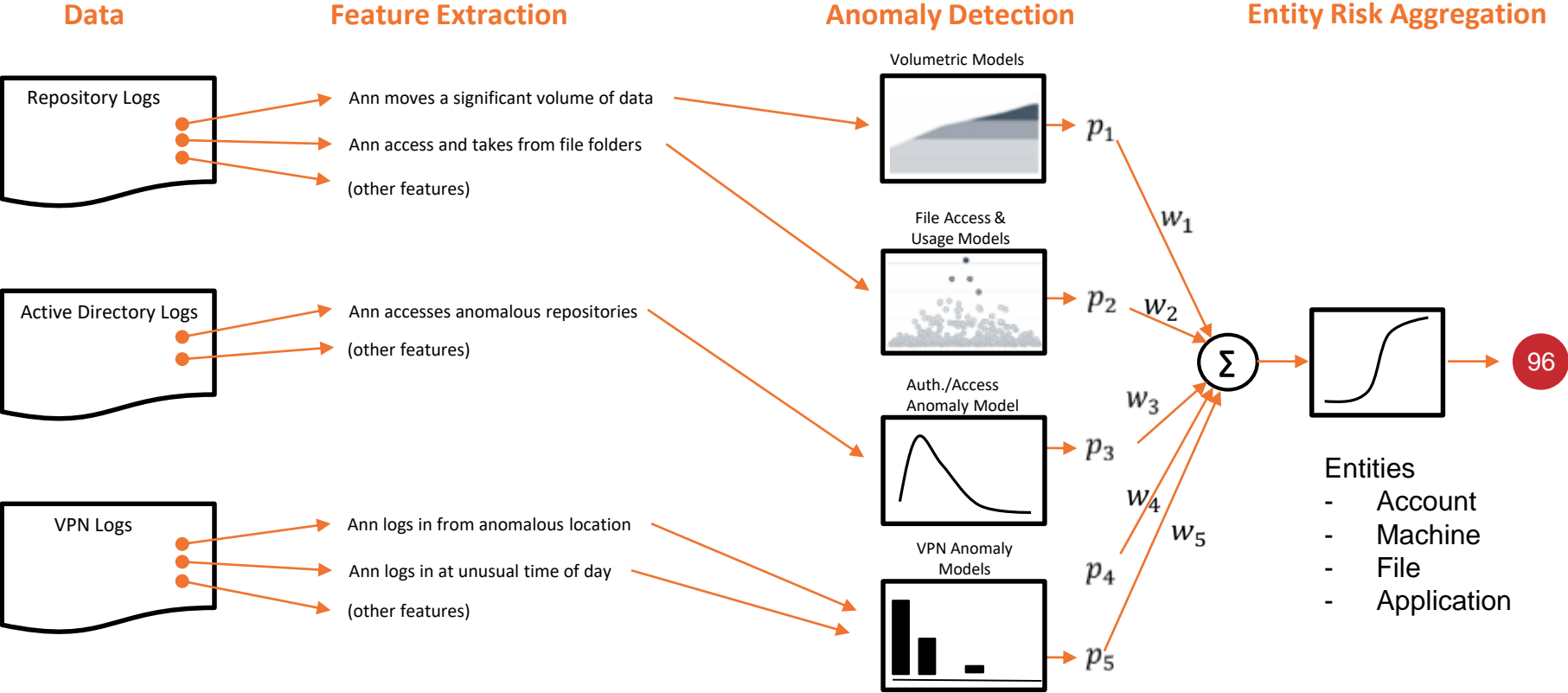
Rather than adjust the rule or threshold to reduce false positives, use weighting to inject business context for relevance.

The Math: Quantifying Risky Entities

- ... *and* moves a significantly high volume of data than normal 96
- ... *and* takes from a folder on a repository an unusual number of times 80
- ... *and* accesses repositories that she and her peers do not usually access 65
- ... VPNs in from China 46
- Ann Funderburk works at an unusual hour 15



Analytical Framework: From Log Data to Risky Entities



1. No static weighting

If we were to pretend that events are equivalent to anomalies...

Others

User behavior that has “unusual” characteristics gets assigned a static value

- **5 points:** An event after pre-defined working hours login
- **15 points:** Moving more than 250MB of data but less than 500MB of data from a pre-defined “risky” location

Interaset

- **Working hours**
 - Have we seen this user work these hours before?
 - If we have seen these hours before, was it recently or long ago?
 - How much outside of previously observed working hours is the event?
- **Amount of data moved**
 - Is this a location this user has accessed previously?
 - How does the amount of data moved compare to previous volumes for self, peers, and population?
 - Has any user accessed this location recently?

An alert combines probability and weighting

How unusual?

- Compared to self
- Compared to peers
- Compared to entire population

How much does it matter?

- Significance of the behavior
 - Login from another country
 - Accessing new server
- Entity enrichment
 - User w/ bad performance review
 - “Honeypot” file share
 - Mergers & acquisition data
 - Contractors coming to the end of contract
 - Recently traveled overseas

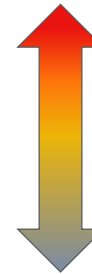
probability

&

weighting



Alert



Severity

- Extreme
- High
- Medium
- Low

Calculation is context-based

Interset risk scores are not step functions and they build-in the concept of “decay” over time



Just because the alerts in this period of were "high risk," there was not an automatic push for the entity risk score itself to move into a "high risk" range

Risk score does not immediately return to zero just because of the absence of anomalies; this is the concept of controlled decay.

Note it took a number of actions against an already elevated risk profile to push Jacob to a new peak risk score.

Command-Line Interface	Account Manipulation	AppCert DLLs	Binary Padding	Brute Force
Compiled HTML File	AppCert DLLs	AppInit DLLs	Bypass User Account Control	Credential Dumping
Control Panel Items	AppInit DLLs	Application Shimming	CMSTP	Credential Files
Device Emulation	Application Shimming	Bypass User Account Control	Clear Command History	Credentials Registry
Device Emulation	Application Shimming	Bypass User Account Control	Code Signing	Exploitation of Vulnerabilities

Detect, Investigate, and Respond Better with Intersect and ATT&CK

*Intersect UEBA covers 75% of the
ATT&CK framework—and
growing*

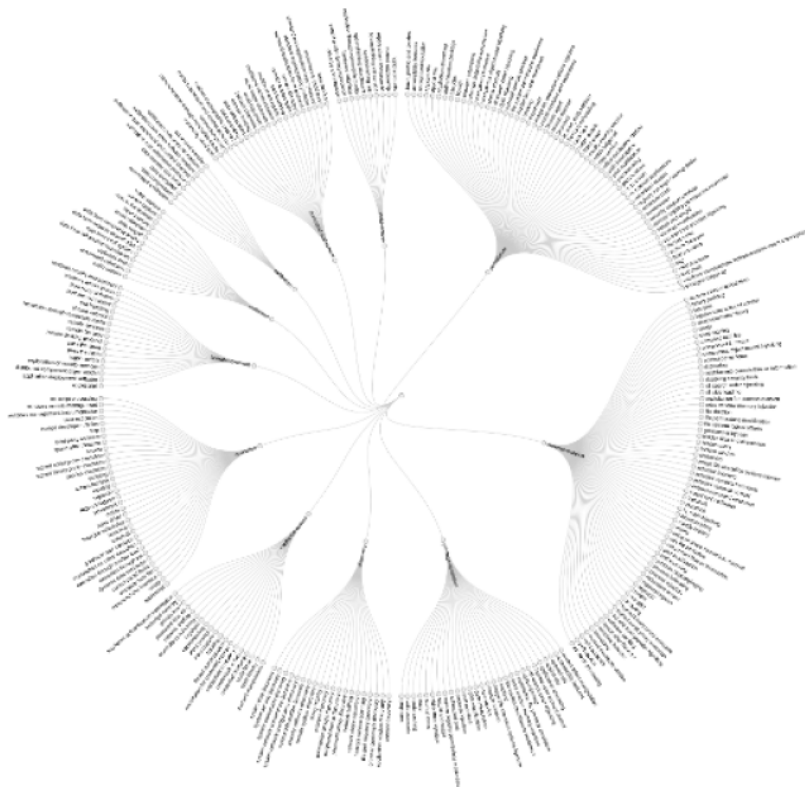
What is MITRE ATT&CK?

MITRE

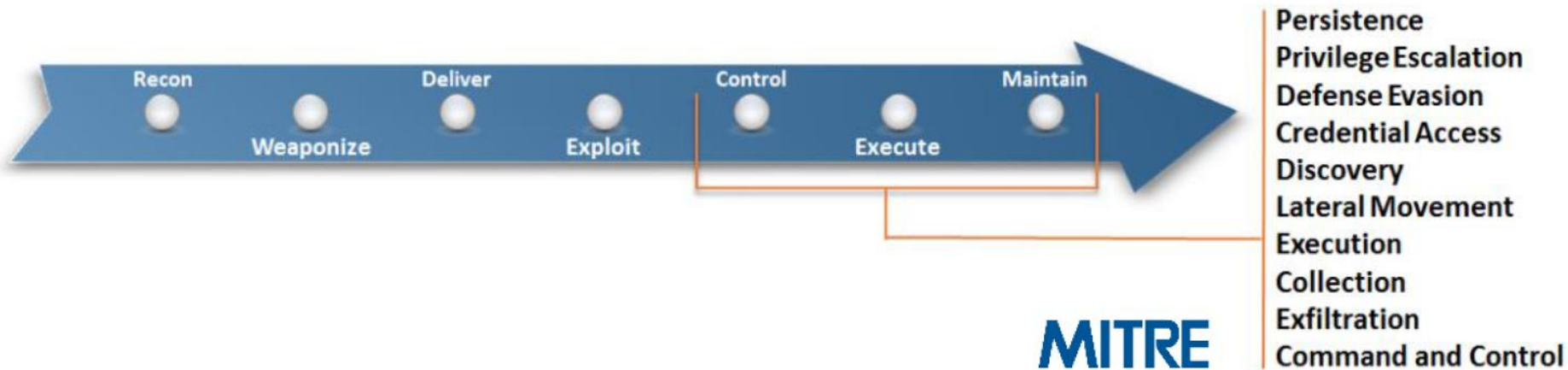
- Not-for-profit organization dedicated to making the world safer
- Operate multiple federally funded R&D centers

ATT&CK

- Adversarial Tactics, Techniques & Common Knowledge
- Started in 2013 to document results from the FMX research project
- Using endpoint telemetry and analytics to detect post-compromise activity on enterprise networks



Scope of ATT&CK



MITRE

Persistence
Privilege Escalation
Defense Evasion
Credential Access
Discovery
Lateral Movement
Execution
Collection
Exfiltration
Command and Control

Principals of ATT&CK

Understand Adversary Behavior

- The best driver for defense is understanding the offense
- Need to focus on real-world examples
- Provides a mechanism to measure against

Analytics is foundational

- Traditional solutions cannot keep up
- Typical indicators are too narrow

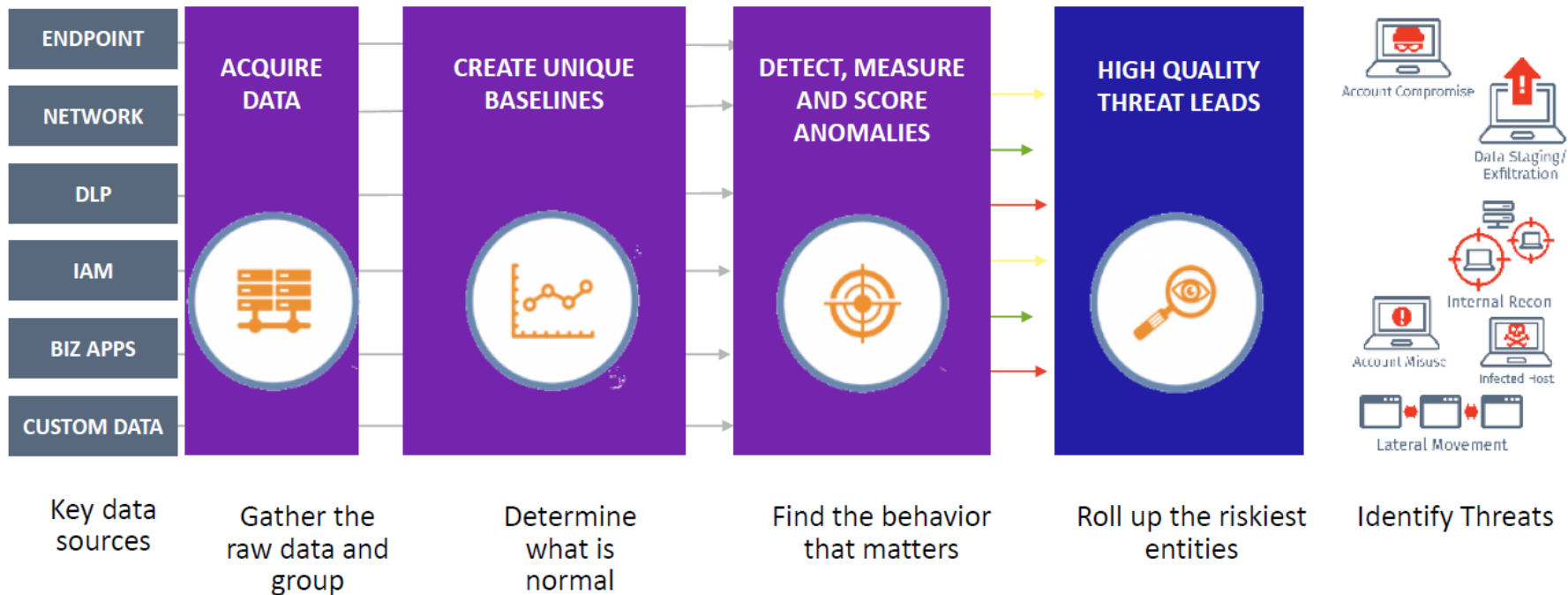
Common taxonomy

- Establish a common language when comparing across adversary groups
- Existing concepts were too high-level

Tactics & Techniques

Initial Access	Execution	Persistence	Privilege Escalation	Defense Evasion	Credential Access	Discovery	Lateral Movement	Collection	Exfiltration	Command And Control
10 Items	31 Items	56 Items	28 Items	59 Items	20 Items	19 Items	17 Items	13 Items	9 Items	21 Items
Drive-by Compromise	AppleScript	.bash_profile and .bashrc	Access Token Manipulation	Access Token Manipulation	Account Manipulation	Account Discovery	AppleScript	Audio Capture	Automated Exfiltration	Commonly Used Port
Exploit Public-Facing Application	CMSTP	Accessibility Features	Binary Padding	Binary Padding	Bash History	Application Window Discovery	Application Deployment Software	Automated Collection	Data Compressed	Communication Through Removable Media
Hardware Additions	Command-Line Interface	AppCert DLLs	Accessibility Features	BITS Jobs	Brute Force	Browser Bookmark Discovery	Distributed Component Object Model	Clipboard Data	Data Encrypted	Connection Proxy
Replication Through Removable Media	Control Panel Items	Appnint DLLs	AppCert DLLs	Bypass User Account Control	Credential Dumping	File and Directory Discovery	Exploitation of Remote Services	Data from Information Repositories	Data Transfer Size Limits	Custom Command and Control Protocol
Spearphishing Attachment	Dynamic Data Exchange	Application Shimming	Appnint DLLs	Clear Command History	Credentials in Files	Network Service Scanning	Data from Local System	Data from Local System	Exfiltration Over Alternative Protocol	Custom Cryptographic Protocol
Spearphishing Link	Execution through API	Authentication Package	Application Shimming	CMSTP	Credentials in Registry	Network Share Discovery	Logon Scripts	Data from Network Shared Drive	Exfiltration Over Command and Control Channel	Data Encoding
Spearphishing via Service	Execution through Module Load	BITS Jobs	DLL Search Order Hijacking	Code Signing	Exploitation for Credential Access	Hooking	Pass the Hash	Data from Removable Media	Exfiltration Over Other Network Medium	Domain Fronting
Supply Chain Compromise	Exploitation for Client Execution	Browser Extensions	Dylib Hijacking	Component Firmware	Forced Authentication	Input Capture	Pass the Ticket	Data Staged	Exfiltration Over Physical Medium	Fallback Channels
Trusted Relationship	Graphical User Interface	Change Default File Association	Exploitation for Privilege Escalation	Control Panel Items	Input Prompt	Peripheral Device Discovery	Remote File Copy	Email Collection	Scheduled Transfer	Multi-hop Proxy
Valid Accounts	InstallUtil	Component Firmware	Extra Window Memory Injection	DCShadow	Kerberoasting	Permission Groups Discovery	Replication Through Removable Media	Man in the Browser	Screen Capture	Multi-Stage Channels
	Launchctl	Component Object Model Hijacking	File System Permissions Weakness	Disabling Security Tools	Keychain	Process Discovery	Shared Webroot	Video Capture		Multiband Communication
	Local Job Scheduling	Create Account	Hooking	DLL Search Order Hijacking	LLMNR/NBT-NS Poisoning	Query Registry	SSH Hijacking			Port Knocking
	LSASS Driver	DLL Search Order Hijacking	Image File Execution Options Injection	DLL Side-Loading	Network Sniffing	Remote System Discovery	Taint Shared Content			Remote Access Tools
	Mshta	Dylib Hijacking	Exploitation for Defense Evasion	Extra Window Memory Injection	Password Filter DLL	Security Software Discovery	Third-party Software			Remote File Copy
	PowerShell	External Remote Services	Launch Daemon	File Deletion	Private Keys	System Information Discovery	Windows Admin Shares			Standard Application Layer Protocol
	Regsvcs/Regasm	File System Permissions Weakness	New Service	File System Logical Offsets	Replication Through Removable Media	System Network Configuration Discovery	Windows Remote Management			Standard Cryptographic Protocol
	Regsvr32	Hidden Files and Directories	Path Interception	Gatekeeper Bypass	Securityd Memory	System Network Connections Discovery				Standard Non-Application Layer Protocol
	Rundll32	Hooking	Plist Modification	Hidden Files and Directories	Two-Factor Authentication Interception	System Owner/User Discovery				Uncommonly Used Port
	Scheduled Task	Hypervisor	Port Monitors	Hidden Users		System Service Discovery				Web Service
	Scripting	Image File Execution Options Injection	Process Injection	Hidden Window						
	Service Execution	Kernel Modules and Extensions	Scheduled Task	HISTCONTROL						
	Signed Binary Proxy Execution	Service Registry Permissions Weakness	Service Registry Permissions Weakness	Image File Execution Options Injection						
	Signed Script Proxy Execution	Setuid and Setgid	Setuid and Setgid							
	Source	Launch Agent								
	Space after Filename									

Behavioral Threat Approach





Differentiators: Pre-defined Data Model

Interaset Approach

- ETL process convert the raw events into pre-defined abstract data type (Authentication/Data Store/Web Proxy/End Point..)
- Provide abundant pre-defined data model (behavior rule) on supported data types, no need for customization and tuning
- Ingestion is a bit complicate, rest of work is simple
- Not able to add additional data model or support new data type by field SE

Processing a range of sources to find unusual behavior

With over 450+ individual models, a remarkable amount of context is available to find threats that matter

Some representative data sources we process...

Authentication	Data Store	Endpoint	NetFlow	Printer	Web Proxy	Custom
<ul style="list-style-type: none">•Who is authenticating from an unusual location?•When is a rarely used account active?	<ul style="list-style-type: none">•Who is accessing data they have never touched before?•When is an unusually large amount of data moving to a new location?	<ul style="list-style-type: none">•Which machines have unusual processes running?•When is an unusual remote storage device being used?	<ul style="list-style-type: none">•When is non-standard traffic using a standard port?•Which machine is receiving traffic from an unusual source?	<ul style="list-style-type: none">•Who is printing to unusual locations?•When are unusually large print jobs received?	<ul style="list-style-type: none">•What new websites have never been accessed before?•Which websites are receiving unusually large amounts of data?	<ul style="list-style-type: none">•Expense reports•Vacation time•Others...

...to automatically detect relevant anomalies

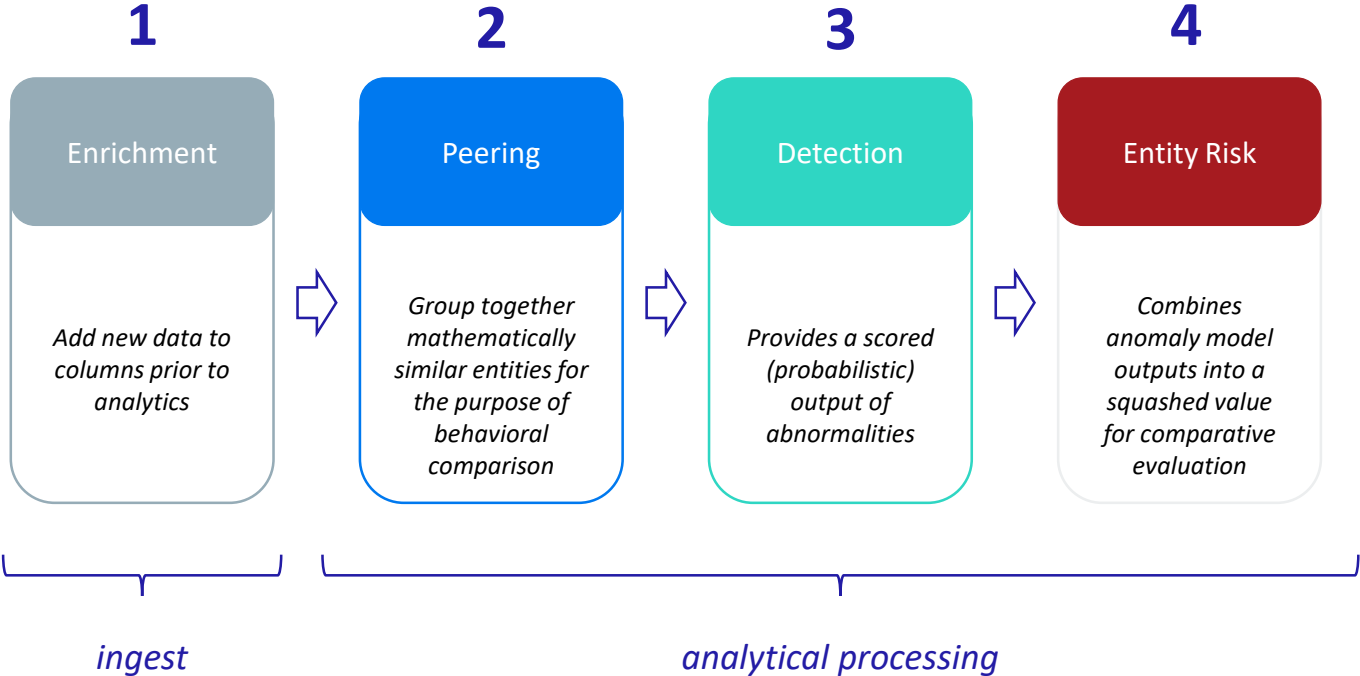
Intersect strengths

1. Principled math (may need PoC to prove)
 - a. Rigorous data science
 - b. Anomaly detection through unsupervised machine learning

2. Enormous scale
 - a. “Big Data” native from the start
 - b. Horizontally scalable to monitor hundreds of thousands of unique entities and billions of events per day

3. Security ecosystem integration
 - a. Intersect plays one role by design
 - b. Designed to work with data and tools the customer already has

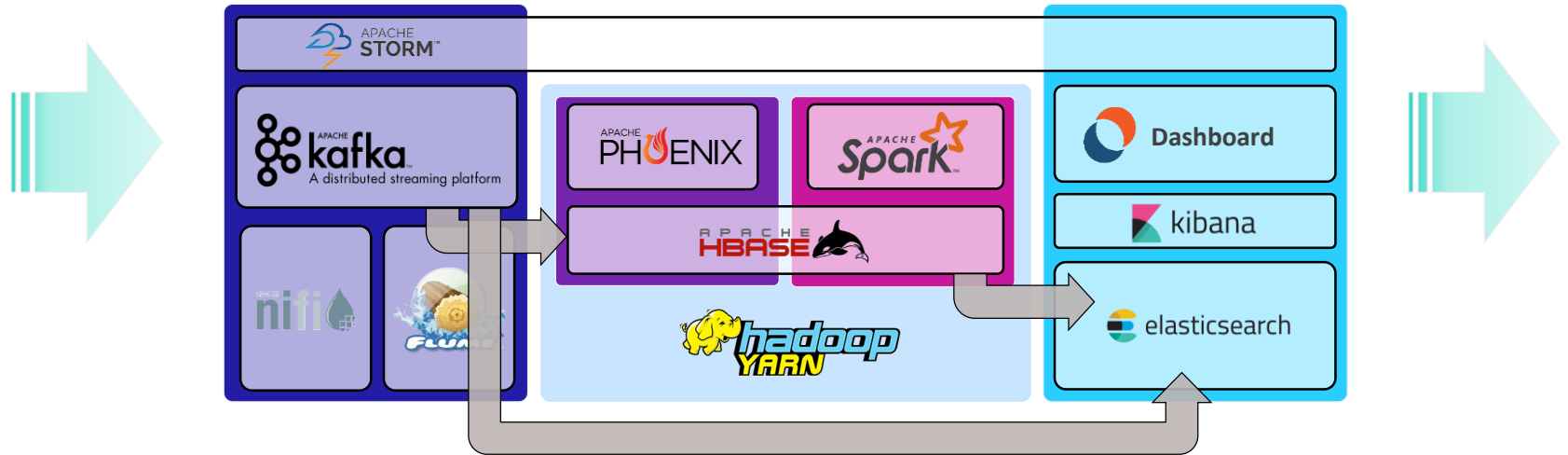
Machine learning is used in four primary roles





Big Data Architecture

Moving data: End-to-end



The logo consists of a stylized square icon on the left, composed of four white L-shaped segments that form a square with a small gap in the center. To the right of the icon, the words "MICRO" and "FOCUS" are stacked vertically in a white, uppercase, sans-serif font. A registered trademark symbol (®) is located at the top right of the word "MICRO".

MICRO®
FOCUS