



Know Your Insider

Unmasking **Lateral Movement** with Splunk UBA

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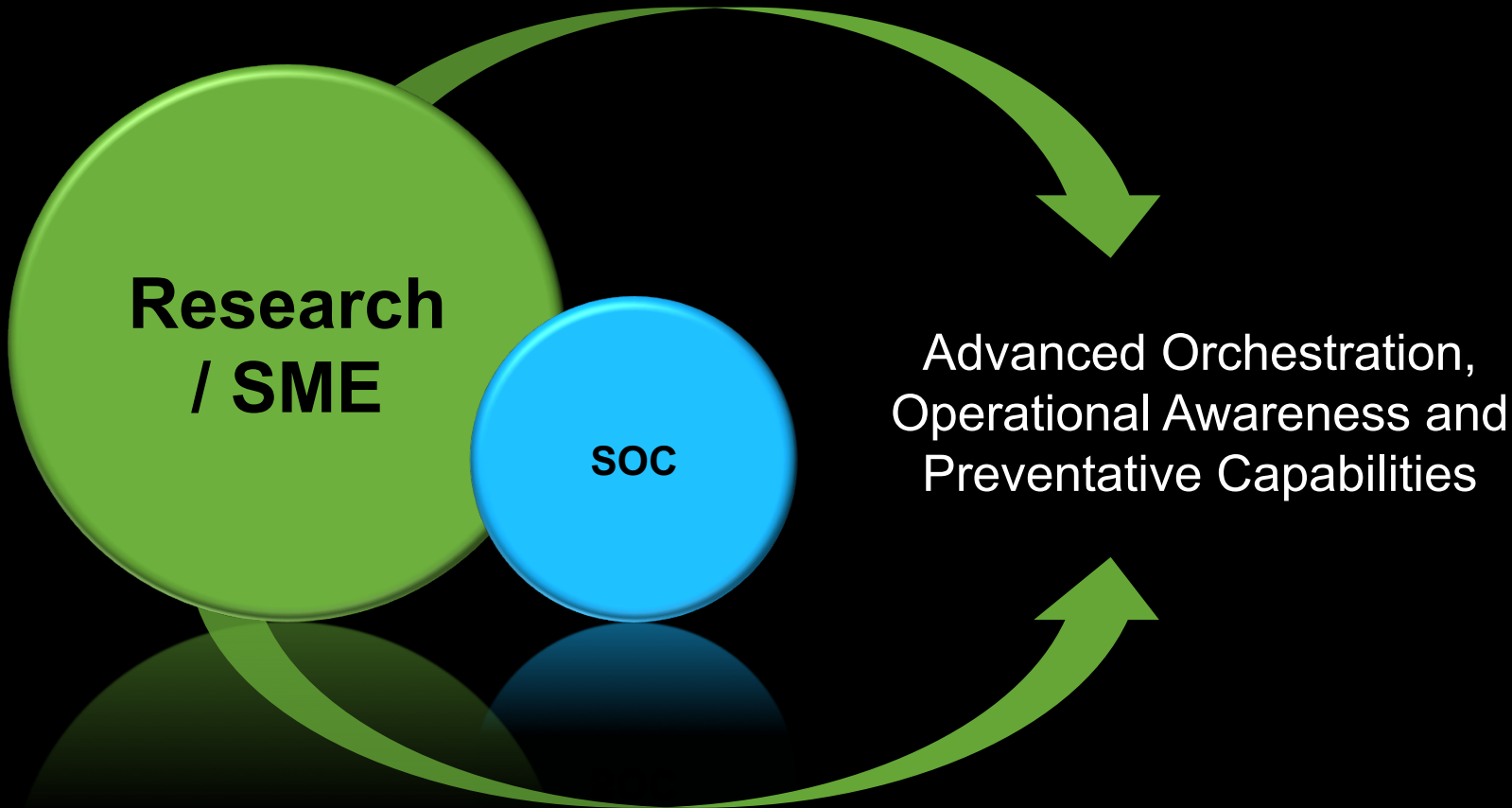
Agenda

- ▶ Stats & Industry Challenges
- ▶ Insider Threat Stages
- ▶ Technical Challenges
- ▶ Lateral Movement in the Real World
- ▶ UBA Detects Lateral Movement
- ▶ Demo



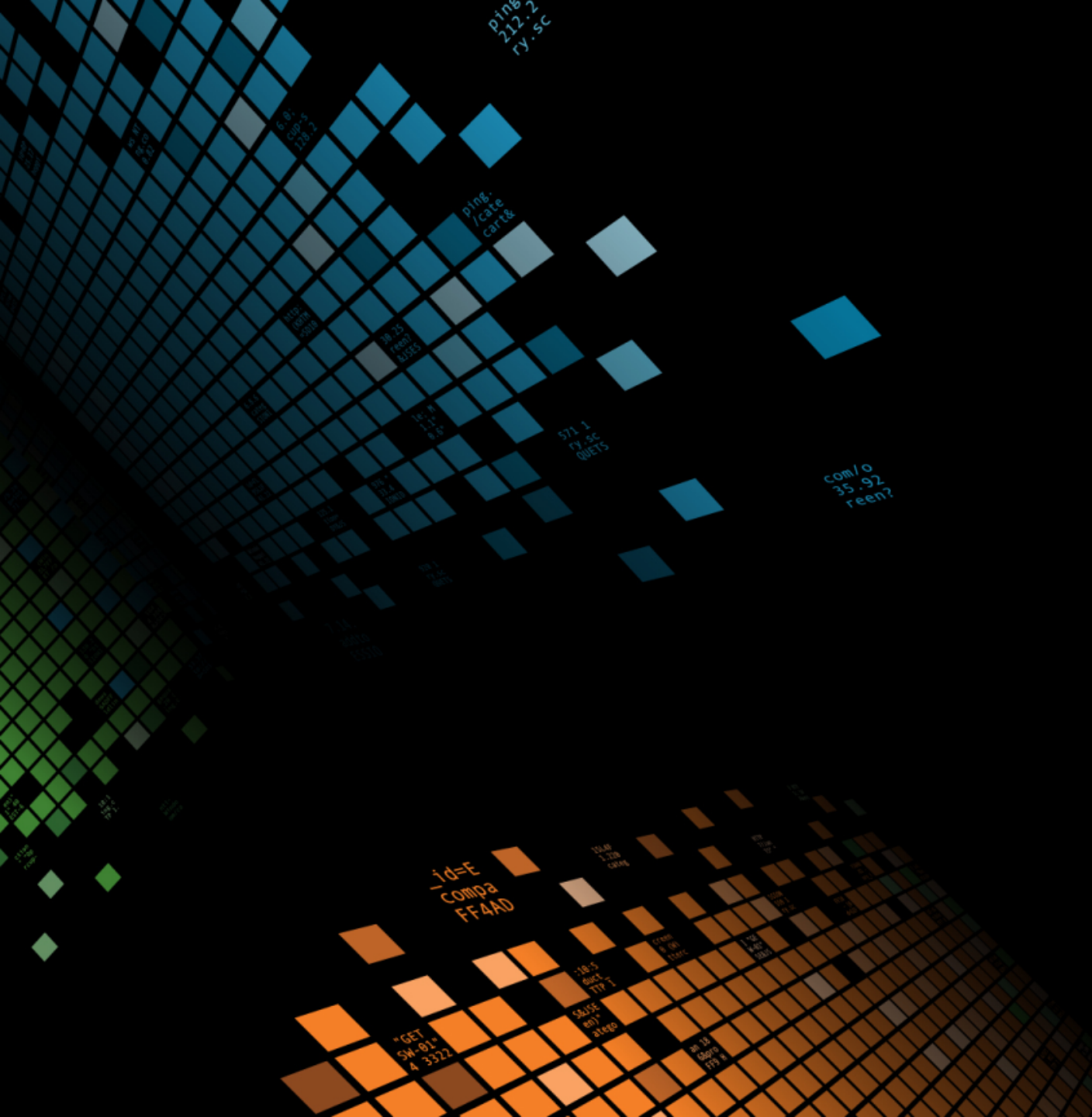
Stats, History & Industry Challenges

A Better Model For Today



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Insider Threat Kill Chain



Insider Threat Stages



Too late to prevent



Human Driving Factors

Tipping Point

- Emotional
- Flight Risk

Lateral Movement

- Recon
- Enumeration
- Exploitation
- Offensive packages

Final Goal

- Exfiltration
- Destruction
- Modification

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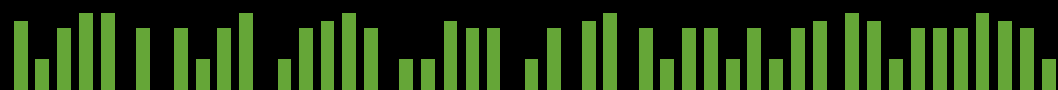
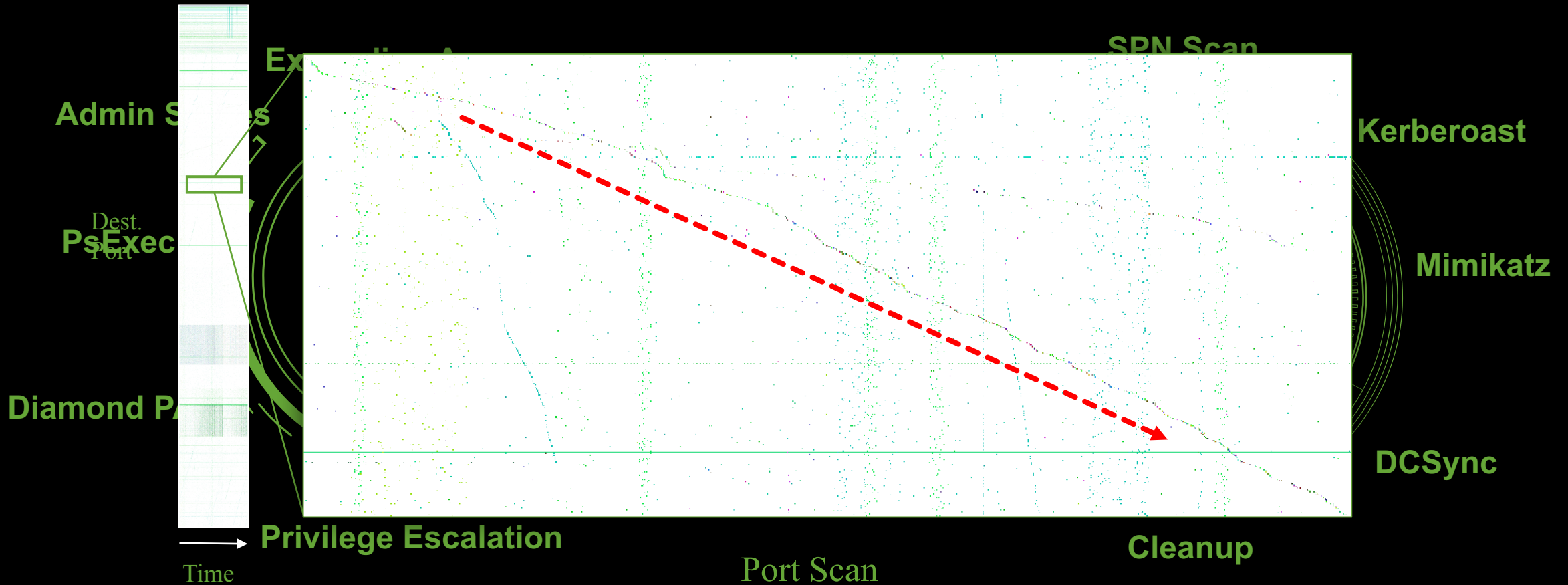
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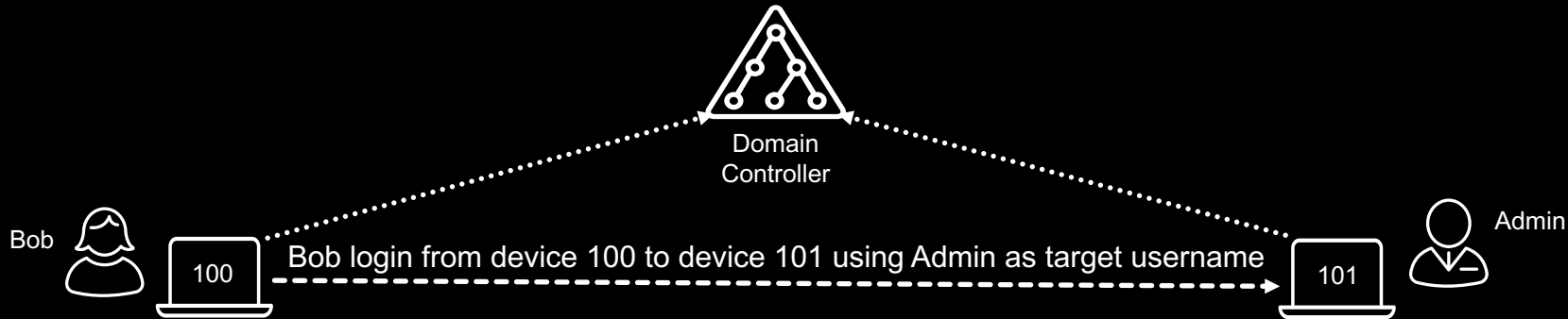
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Technical challenges faced by the SOC Analyst

Techniques, Tactics & Procedures (TTPs)



A Login Activity from the Perspective of Active Directory Logs



► Lsass.exe

- 2 login events (4648)
- 1 Process Creation event (4688)

4624 => An account was successfully logged on
 4648 => A logon was attempted using explicit credentials
 4672 => Special privileges assigned to new logon

4661 => A handle to an object was requested

4769 => A Kerberos service ticket was requested

► Kerberos

- 6+ login events (4624)
- 2 Object Access events (4661)
- 4+ privilege escalation 4672
- Multiple Service Ticket requests

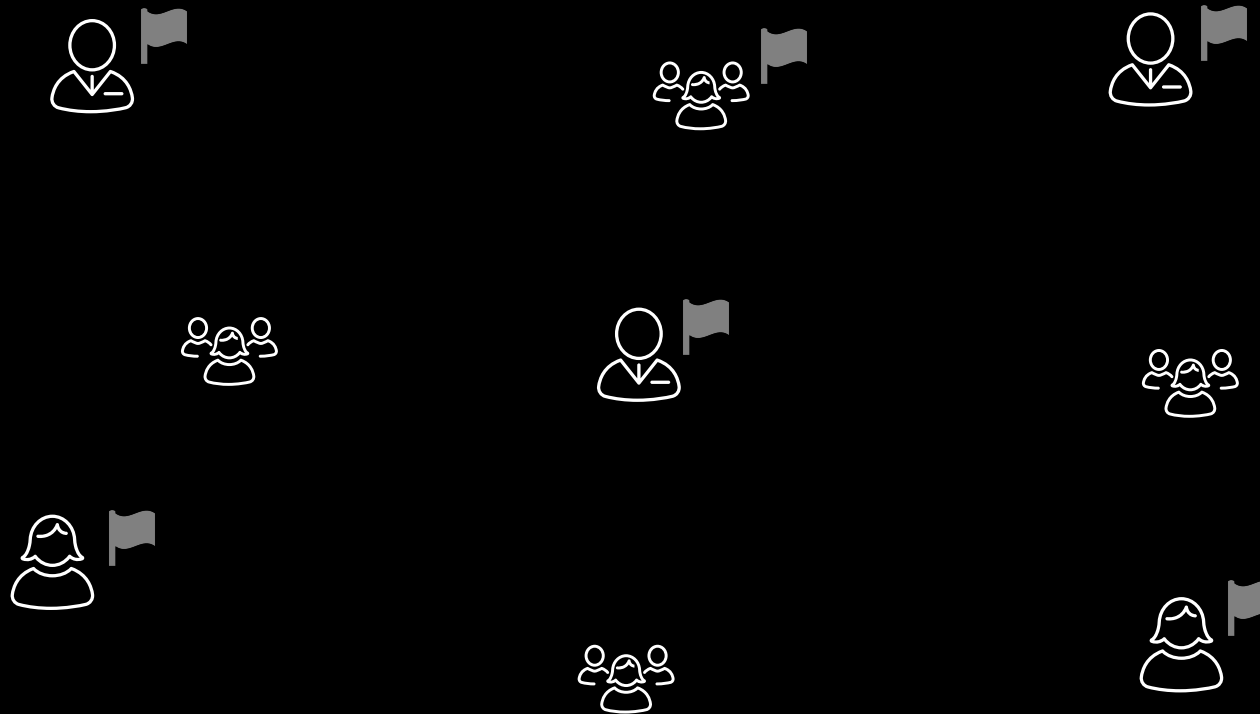
► Winlogon.exe

- 2 login events (4624)
- One 4648 event
- 1 Special Privilege event
- 2 process creation event
- Multiple Object Access event

UBA Intelligence

UBA Detects Lateral Movement

Users with Anomalies

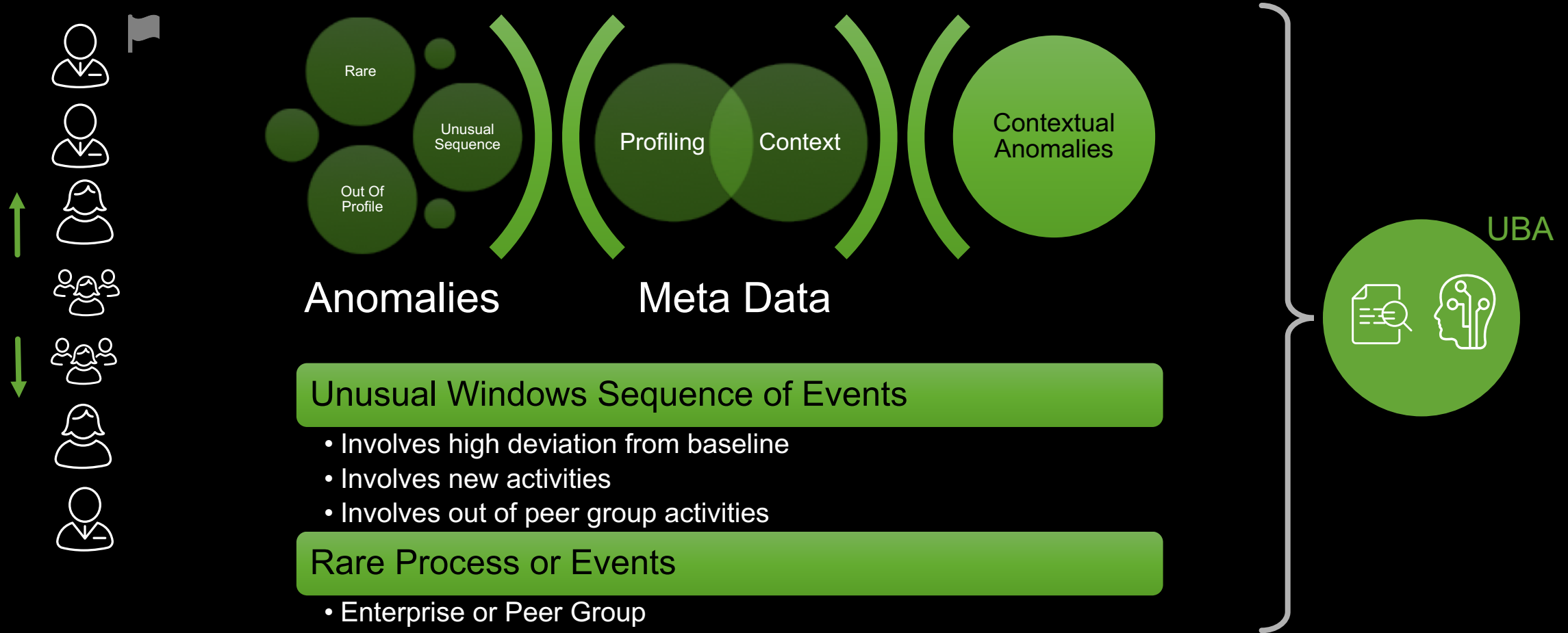


UBA



UBA Detects Lateral Movement

Mining Anomalies



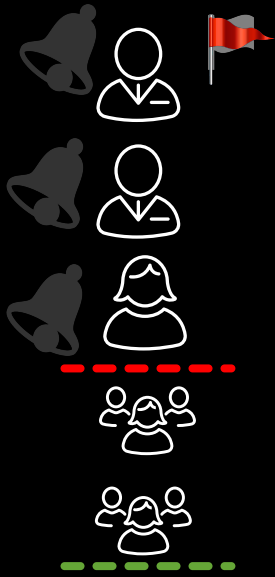
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UBA Detects Lateral Movement

Higher Level - Indicators of Compromise



- Enumeration
- Return Code
- Group Edits
- Lockouts

- Rare Process
- Rare Events
- Suspicious Process



- Anomalies reflect Insider movements, derive context and continuity

- Kerberos Service Tickets
- Kerberos Authentication



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Lateral Movement Demo



Lateral Movement

5 >>

Actions

Watchlists

Categories Internal Specialized Threat Model

Threat model observed the following stages of **Lateral Movement Kill Chain** phase while analyzing user's behavior before and after in time.

- **Suspicious or rare process:** This stage involves a process that is tagged as **suspicious and used for Lateral Movement** and a process that is only observed **across few users and days** and a process that is not seen in **enterprise or user's peer group**
- **Activities that deviated from the baseline:** This stage involves out of profile activities by the user
- **Probing activities:** This stage involves **repeatedly creating multiple new processes**, an indicator that is predominantly seen in lateral movement and **suspicious probe action**, caused by failure return codes for **ticket request across multiple devices** and **suspicious probe action**, caused by credential validation for multiple machines

Timeline

Start Date

22

Aug, 2017

Last Update

2

Sep, 2017

Duration

11d

Anomalies (4)

Unusual AD Event (4)

3

Users (1)

Ken Westin

0

Devices (2)

Internal

cnu2509kyq-a

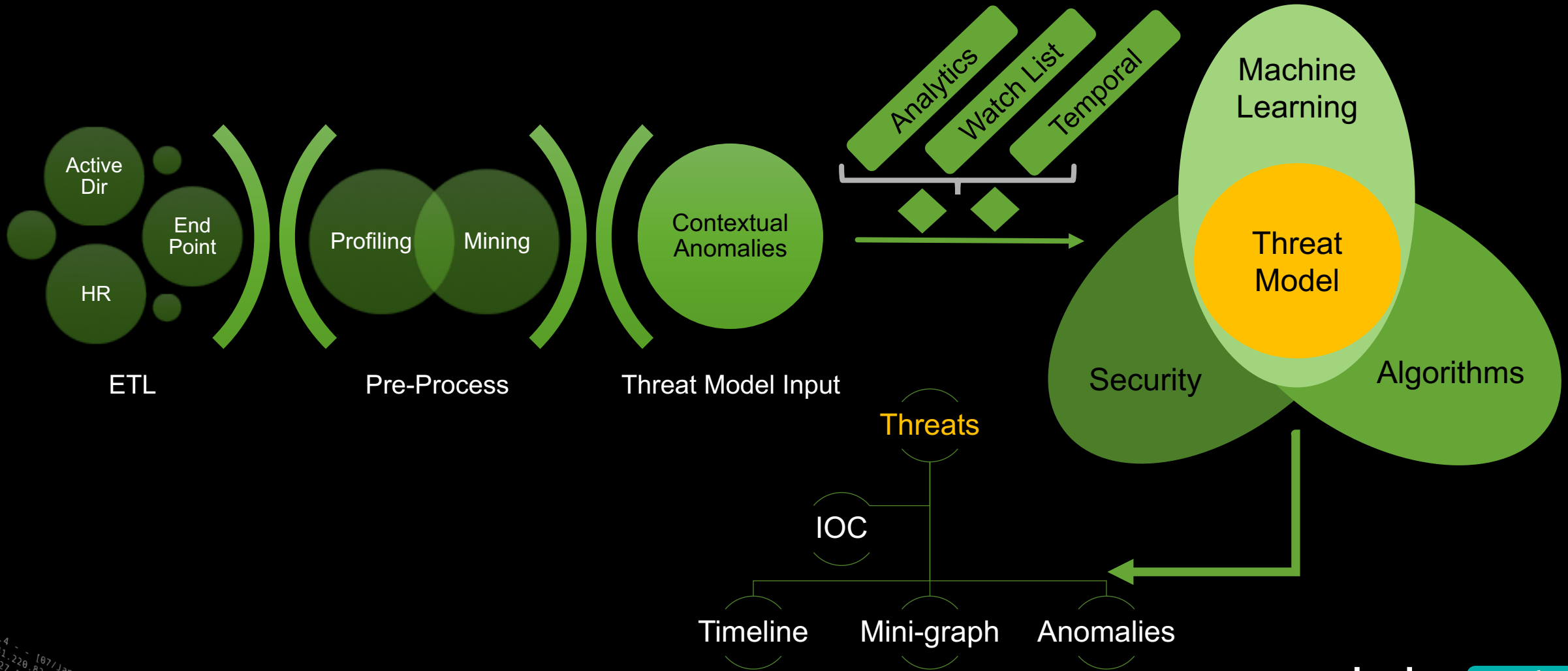
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Threat Relations

UBA Threat Model - Implementation



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Advanced Correlation and Analytics Layer

Deeper Insights With UBA to Detect Anomalies

splunk> ES

What we Know



splunk> UBA

What we Don't

Truly *Adaptive* and
Holistic Security

130.60.4 - - [07/Jan 18:10:57:153] "GET /category.screen?category_id=GIFTS&JSESSIONID=SD15L9FF10ADFF10 HTTP 1.1" 404 720 "http://buttercup-shopping.com/cart.do?action=view&itemId=EST-6&product_id=FL-SW-01" "Opera/9.80.2013.10400; rv:1.9.2.10400; like Gecko; Mozilla/5.0 (Macintosh; Intel Mac OS X 10_7_5; rv:1.9.2.10400; like Gecko; Firefox/3.6.10) AppleWebKit/537.73 (KHTML, like Gecko; Chrome/27.0.1453.94 Safari/537.73) Buttercup Shopping Cart

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Key Takeaways

Know Your Insider

1. TTPs vary, vast, in-memory and gets less noisy
2. Consider Authentication & Service tickets along with Login events
3. Insider Threat is a continuous process
4. SME Knowledge + ML + Active Research or Buy Splunk UBA 4.0

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