



Data Driven APT Attribution and AI/ML Research

2022 TF-CSIRT & FIRST Virtual Symposium

Patrick MANA

EATM-CERT Manager – EUROCONTROL EATM-CERT

Bahtiar MUSTAFA

Cyber-security expert, CISSP – EUROCONTROL EATM-CERT





Why? How? What?



- Objective: Improve attribution
- Why?
 - Aviation is a critical infrastructure Subject to "strategic" threats (thus well identified APTs)
 - Cyber attacks on aviation are "popular" and attractive for the media
 - Very similar technologies used all over the world
 - Attribution is not an obsession ... But we need to improve our prediction capability of future attacks
- How? Two-step approach
 - SW-based tool to identify potential APTs based on MITRE ATT&CK TTPs
 - AI/ML app to analyse the attack context in order to refine attribution

Summary

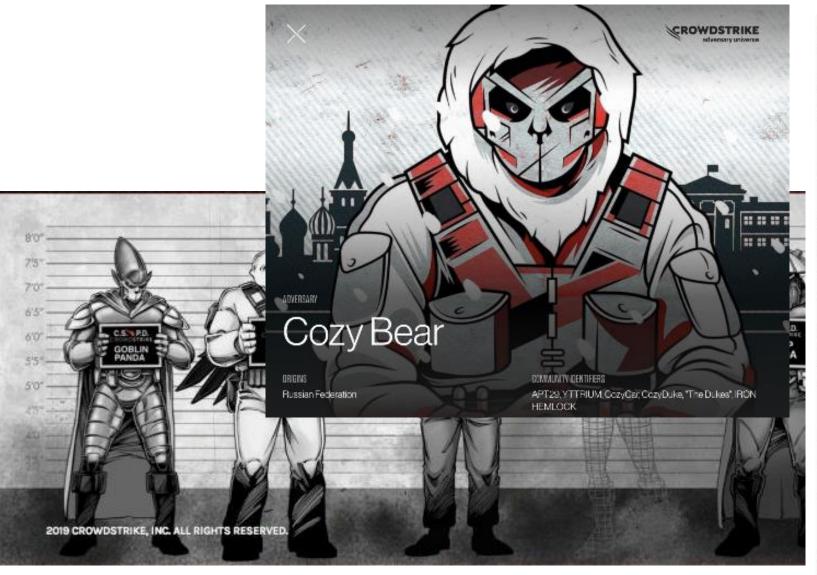


- Problem
 - Attribution

- Solution: 2-step approach
 - Step1: AFiT
 - Step2: AI/ML tool

APT Groups





Adversary		Category or Nation-State				
	SPIDER	ECRIME				
#	CHOLLIMA	DEMOCRATIC PEOPLE'S REPUBLIC OF KOREA (NORTH KOREA)				
	JACKAL	HACKTIVIST				
	TIGER	INDIA				
B	KITTEN	IRAN				
	LEOPARD	PAKISTAN				
	PANDA	PEOPLE'S REPUBLIC OF CHINA				
8	BEAR	RUSSIAN FEDERATION				
	CRANE	SOUTH KOREA				
	BUFFALO	VIETNAM				

Home > Groups > APT29



APT29

APT29 is threat group that has been attribute (SVR).[1][2] They have operated since at least networks in Europe and NATO member coun APT29 reportedly compromised the Democra summer of 2015.[3][4][5][6]

In April 2021, the US and UK governments at compromise cyber operation to the SVR; pub APT29, Cozy Bear, and The Dukes.[7][8] Victim consulting, technology, telecom, and other or Asia, and the Middle East. Industry reporting campaign as UNC2452, NOBELIUM, StellarPa

Associated Group Desc

Name
NobleBaron
Dark Halo
StellarParticle

Techniques Used

Name

Use

ID

Domain

ATT&CK[®] Navigator Layers ▼

	Enterprise	T1548	.002	Abuse Elevation Control Mechanism: Bypass User	APT29 has bypassed UAC. ^[21]								
		Account Control			Software								
r I	Enterprise	T1087	Account Discovery		AF sei	ID	Name	References	Techniques				
1	Enterprise	T1098	.001	Account Manipulation: Additional Cloud Credentials	AP Pri	S0552	AdFind	[27]	Account Discovery: Domain Account, Domain Trust Discovery, Permission Groups Discovery: Domain Groups, Remote System Discovery, System Network Configuration Discovery				
(.002	Account Manipulation: Exchange Email Delegate Permissions	Ma Se	S0635	BoomBox	[16]	Account Discovery: Email Account, Account Discovery: Domain Account, Application Layer Protocol: Web Protocols, Boot or Logon Autostart Execution: Registry Run Keys / Startup Folder, Deobfuscate/Decode Files or Information, Execution Guardrails, Exfiltration Over Web Service: Exfiltration to Cloud Storage, File and Directory Discovery, Ingress Tool				
	Enterprise	T1583	.001	Acquire Infrastructure: Domains	AP [23]				Transfer, Masquerading, Obfuscated Files or Information, Signed Binary Proxy Execution: Rundll32, System Information Discovery, System Owner/User Discovery, User Execution: Malicious File, Web Service				
			.006	Acquire Infrastructure: Web Services	AF the	S0054	CloudDuke	[3]	Application Layer Protocol: Web Protocols, Ingress Tool Transfer, Web Service: Bidirectional Communication				
	Enterprise	T1595	.002	Active Scanning: Vulnerability Scanning	AF en	S0154	Cobalt Strike	[26][9][13] [15][16][14]	Abuse Elevation Control Mechanism: Bypass User Account Control, Abuse Elevation Control				
	Enterprise	T1071	.001	Application Layer Protocol: Web Protocols	AF	30101	SSSGIT STITLE		Mechanism: Sudo and Sudo Caching, Access Token Manipulation: Token Impersonation/Theft, Access Token Manipulation: Parent PID Spoofing, Access Token Manipulation: Make and Impersonate Token, Account Discovery: Domain Account,				
	Enterprise	T1560	.001	Archive Collected Data:	AF				Application Layer Protocol, Application Layer Protocol: DNS, Application Layer Protocol:				

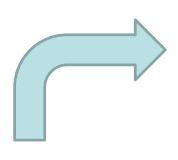




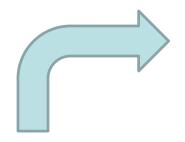
Initial Access	Execution	Persistence	Privilege Escalation	Defense Evasion	Discovery	Collection	Command and Control
Exploit Public-Facing Application	Exploitation for Client Execution	External Remote Services	Valid Accounts	Deobfuscate/Decode Files or Infor	Account Discovery	Data from Local System	Remote File Copy
External Remote Services	Windows Management Instrument	Valid Accounts	Accessibility Features	Indicator Removal on Host	Domain Trust Discovery	Automated Collection	Standard Non-Application Layer Protocol
Trusted Relationship	CMSTP	Accessibility Features	AppCert DLLs	Masquerading	File and Directory Discovery	Clipboard Data	Communication Through Removable Media
Valid Accounts	Command-Line Interface	Account Manipulation	Emond	Obfuscated Files or Information	Permission Groups Discovery	Input Capture	Connection Proxy
Drive-by Compromise	Graphical User Interface	Browser Extensions	Exploitation for Privilege Escalation	Valid Accounts	Process Discovery	Man in the Browser	Fallback Channels
Hardware Additions	AppleScript	Change Default File Association	Access Token Manipulation	Application Access Token	Remote System Discovery	Audio Capture	Multi-hop Proxy
Replication Through Removable M	Compiled HTML File	.bash_profile and .bashrc	AppInit DLLs	Binary Padding	System Information Discovery	Data from Information Repositorie	s Commonly Used Port
Spearphishing Attachment	Component Object Model and Dist	AppCert DLLs	Application Shimming	Compiled HTML File	Application Window Discovery	Data from Network Shared Drive	Custom Command and Control Protocol
Spearphishing Link	Control Panel Items	Applnit DLLs	Bypass User Account Control	Component Firmware	Browser Bookmark Discovery	Data from Removable Media	Custom Cryptographic Protocol
Spearphishing via Service	Dynamic Data Exchange	Application Shimming	DLL Search Order Hijacking	Access Token Manipulation	Network Sniffing	Data Staged	Data Encoding
Supply Chain Compromise	Execution through API	Authentication Package	Dylib Hijacking	BITS Jobs	Password Policy Discovery	Email Collection	Data Obfuscation
	Execution through Module Load	BITS Jobs	Elevated Execution with Prompt	Bypass User Account Control	Cloud Service Dashboard	Screen Capture	Domain Fronting
	InstallUtil	Bootkit	Extra Window Memory Injection	Clear Command History	Cloud Service Discovery	Video Capture	Domain Generation Algorithms
	Launchctl	Component Firmware	File System Permissions Weakness	CMSTP	Network Service Scanning		Multi-Stage Channels

Problem: Attribution











APT29

Initial Access	Execution	Persistence	Privilege Escalation	Defense Evasion	Discovery	Collection	Command and Control
xploit Public-Facing Application	Exploitation for Client Execution	External Remote Services	Valid Accounts	Deobfuscate/Decode Files or Inform	Account Discovery	Data from Local System	Remote File Copy
xternal Remote Services	Windows Management Instrument	Valid Accounts	Accessibility Features			Automated Collection	Standard Non-Application Layer Protocol
rusted Relationship	CMSTP	Accessibility Features	AppCort DLIs			Clipboard Data	Communication Through Removable Media
alid Accounts	Command-Line Interface	Account Manipulation	Emond		Permission Groups Discovery	Input Capture	Connection Proxy
trive-by Compromise	Graphical User Interface	Browser Extensions	Exploitation for Privilege Escalation	Valid Accounts	Process Discovery	Man in the Browser	Fallback Channels
lardware Additions		Change Default File Association	Access Token Manipulation	Application Access Token	Remote System Discovery	Audio Capture	Multi-hop Proxy
eplication Through Removable Mi	Compiled HTML File	.bash_profile and .bashre	Applnit DLLs	Binary Padding	System Information Discovery	Data from Information Repositorie	s Commonly Used Port
pearphishing Attachment	Component Object Model and Dist	AppCert DLLs	Application Shimming	Compiled HTML file	Application Window Discovery	Date from Network Shared Drive	Custom Command and Control Protocol
pearphishing Link	Control Panel Items	Applnit DLLs	Bypass User Account Control	Component Firmware	Browser Bookmark Discovery	Data from Removable Media	Custom Cryptographic Protocol
pearphishing sia Sersice	Dynamic Data Exchange	Application Shimming	DLL Search Order Hijacking	Access Token Manipulation	Network Sniffing	Date Staged	Data Encoding
upply Chain Compromise	Execution through API	Authentication Package	Dylib Hijacking	BITS Jobs	Password Policy Discovery	Email Collection	Data Obfuscation
	Execution through Module Load	BITS Jobs	Elevated Execution with Prompt	Bypass User Account Control	Cloud Service Dashboard	Screen Capture	Domein Fronting
	InstallUtil	Bootet	Extra Window Memory Injection	Clear Command History	Cloud Service Discovery	Video Capture	Domain Generation Algorithms
	Launchctl	Component Firmware	File System Permissions Weakness	CMSTP	Network Service Scanning		Multi-Stage Channels





	· -	-	-	-			-
Initial Access	Execution	Persistence	Privilege Escalation	Defense Evasion	Discovery	Collection	Command and Control
Exploit Public-Facing Application	Exploitation for Client Execution	External Remote Services	Valid Accounts	Deobfuscate/Decode Files or Inform	Account Discovery	Data from Local System	Remote File Copy
External Remote Services	Windows Management Instrument	Valid Accounts	Accessibility Features	Indicator Removal on Host	Domain Trust Discovery	Automated Collection	Standard Non-Application Layer Protocol
Trusted Relationship	CMSTP	Accessibility Features	AppCert DLLs	Masquerading	File and Directory Discovery	Clipboard Data	Communication Through Removable Media
Valid Accounts	Command-Line Interface	Account Manipulation	Emond	Obfuscated Files or Information	Permission Groups Discovery	Input Capture	Connection Proxy
Drive-by Compromise	Graphical User Interface	Browser Extensions	Exploitation for Privilege Escalation	Valid Accounts	Process Discovery	Man in the Browser	Fallback Channels
Hardware Additions	AppleScript	Change Default File Association	Access Token Manipulation	Application Access Token	Remote System Discovery	Audio Capture	Multi-hop Proxy
Replication Through Removable M	Compiled HTML File	.bash_profile and .bashrc	AppInit DLLs	Binary Padding	System Information Discovery	Data from Information Repositorie	es Commonly Used Port
Spearphishing Attachment	Component Object Model and Dist	AppCert DLLs	Application Shimming	Compiled HTML File	Application Window Discovery	Data from Network Shared Drive	Custom Command and Control Protocol
Spearphishing Link	Control Panel Items	Applnit DLLs	Bypass User Account Control	Component Firmware	Browser Bookmark Discovery	Data from Removable Media	Custom Cryptographic Protocol
Spearphishing via Service	Dynamic Data Exchange	Application Shimming	DLL Search Order Hijacking	Access Token Manipulation	Network Sniffing	Data Staged	Data Encoding
Supply Chain Compromise	Execution through API	Authentication Package	Dylib Hijacking	BITS Jobs	Password Policy Discovery	Email Collection	Data Obfuscation
	Execution through Module Load	BITS Jobs	Elevated Execution with Prompt	Bypass User Account Control	Cloud Service Dashboard	Screen Capture	Domain Fronting
	InstallUtil	Bootkit	Extra Window Memory Injection	Clear Command History	Cloud Service Discovery	Video Capture	Domain Generation Algorithms
	Launchctl	Component Firmware	File System Permissions Weakness	CMSTP	Network Service Scanning		Multi-Stage Channels
·							· ·



What if some information is missing?

Initial Access	Execution	Persistence	Privilege Escalation	Defense Evasion	Discovery	Collection	Command and Control
Exploit Public-Facing Application	Exploitation for Client Execution	External Remote Services	Valid Accounts	Deobfuscate/Decode Files or Inform	n Account Discovery	Data from Local System	Remote File Copy
External Remote Services	Windows Management Instrumenta	Valid Accounts	Accessibility Features	Indicator Removal on Host	Domain Trust Discovery	Automated Collection	Standard Non-Application Layer Protocol
Trusted Relationship	CMSTP	Accessibility Features	AppCert DLLs	Masquerading	File and Directory Discovery	Clipboard Data	Communication Through Removable Media
Valid Accounts	Command-Line Interface	Account Manipulation	Emond	Obfuscated Files or Information	Permission Groups Discovery	Input Capture	Connection Proxy
Drive-by Compromise	Graphical User Interface	Browser Extensions	Exploitation for Privilege Escalation	n Valid Accounts	Process Discovery	Man in the Browser	Fallback Channels
Hardware Additions	AppleScript	Change Default File Association	Access Token Manipulation	Application Access Token	Remote System Discovery	Audio Capture	Multi-hop Proxy
Replication Through Removable Me	Compiled HTML File	.bash_profile and .bashrc	AppInit DLLs	Binary Padding	System Information Discovery	Data from Information Repositories	s Commonly Used Port
Spearphishing Attachment	Component Object Model and Disti	a AppCert DLLs	Application Shimming	Compiled HTML File	Application Window Discovery	Data from Network Shared Drive	Custom Command and Control Protocol
Spearphishing Link	Control Panel Items	Applnit DLLs	Bypass User Account Control	Component Firmware	Browser Bookmark Discovery	Data from Removable Media	Custom Cryptographic Protocol
Spearphishing via Service	Dynamic Data Exchange	Application Shimming	DLL Search Order Hijacking	Access Token Manipulation	Network Sniffing	Data Staged	Data Encoding
Supply Chain Compromise	Execution through API	Authentication Package	Dylib Hijacking	BITS Jobs	Password Policy Discovery	Email Collection	Data Obfuscation
	Execution through Module Load	BITS Jobs	Elevated Execution with Prompt	Bypass User Account Control	Cloud Service Dashboard	Screen Capture	Domain Fronting
	InstallUtil	Bootkit	Extra Window Memory Injection	Clear Command History	Cloud Service Discovery	Video Capture	Domain Generation Algorithms
	Launchctl	Component Firmware	File System Permissions Weakness	CMSTP	Network Service Scanning		Multi-Stage Channels

Solution



Data driven APT attribution

Based on observed TTPs

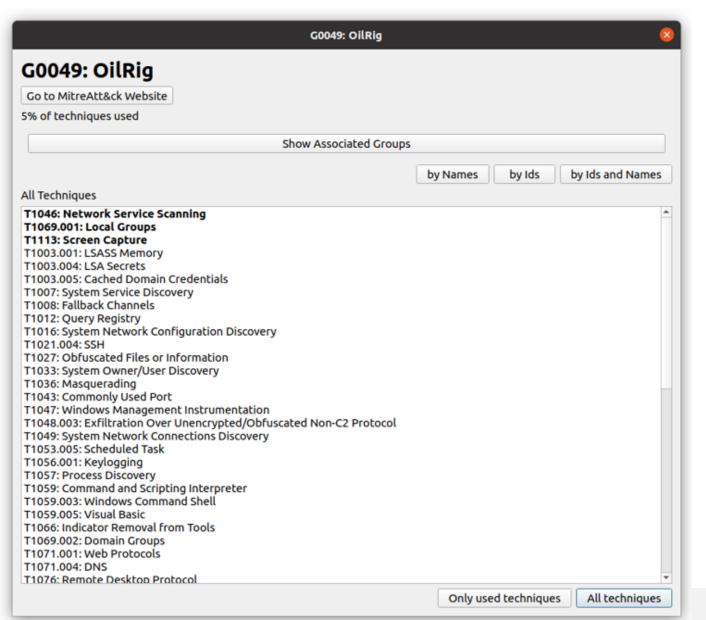
- 2 step approach:
 - Step 1: AFiT tool
 - Step 2: AI/ML tool for data (TTP) extraction from free text

1st step: Adversary Finder tool



1st step: SW based tool – Adversary Finder Tool (AFiT)

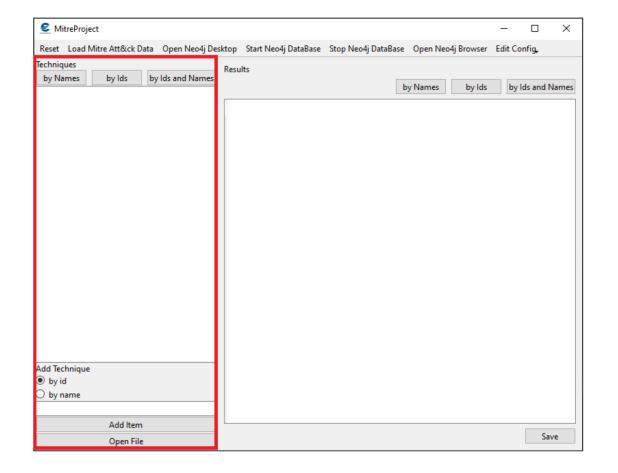
- Free tool developed by EATM-CERT
- APT database from MITRE ATT&CK
- Used to show how MITRE ATT&CK can be used
- Support the promotion and use of MITRE ATT&CK in aviation
- Use TTPs to predict APT group
- Support prediction based on TTP similarity



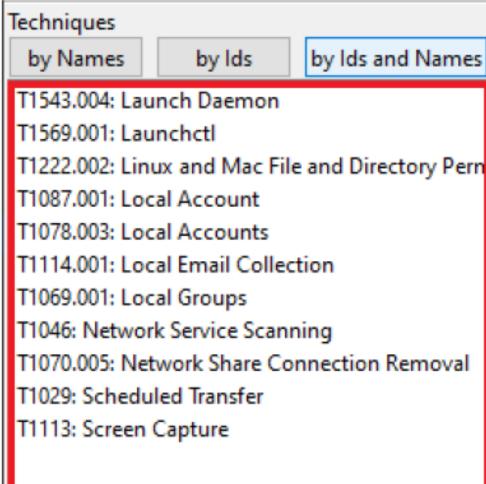
Reset Load Mitre Att&ck Data Open Neo4j De	sktop Start	: Neo4j DataBase Stop Neo4j Data	Base Open Ne
Techniques	Results		
by Names by Ids by Ids and Names T1029: Scheduled Transfer T1569.001: LaunchCtl T1543.004: Launch Daemon T1070.005: Network Share Connection Removal T1222.002: Linux and Mac File and Directory Pen T1078.003: Local Accounts T1069.001: Local Groups T1114.001: Local Email Collection T1087.001: Local Account T1046: Network Service Scanning T1113: Screen Capture			
	Count	Group	
T1543.004: Launch Daemon T1070.005: Network Share Connection Removal T1222.002: Linux and Mac File and Directory Perr T1078.003: Local Accounts T1069.001: Local Groups T1114.001: Local Email Collection T1087.001: Local Account T1046: Network Service Scanning T1113: Screen Capture	3 out of 11 27%	G0049: OilRig G0050: APT32 G0114: Chimera G0116: Operation Wocao	
	2 out of 11 18%	G0010: Turla G0059: Magic Hound G0081: Tropic Trooper G0087: APT39 G0106: Rocke G0139: TeamTNT	
by Names by Ids by Ids and Names F1029: Scheduled Transfer F1569.001: Launchctl F1543.004: Launch Daemon F1070.005: Network Share Connection Remova F1222.002: Linux and Mac File and Directory Pe F1078.003: Local Accounts F1069.001: Local Groups F11114.001: Local Email Collection F1087.001: Local Email Collection F1087.001: Local Account F1046: Network Service Scanning F1113: Screen Capture	1 out of 11 9%	G0006: APT1 G0007: APT28 G0018: admin@338 G0019: Naikon G0027: Threat Group-3390 G0037: FIN6 G0039: Suckfly G0043: Group5 G0045: menuPass G0046: FIN7 G0047: Gamaredon Group G0051: FIN10 G0056: PROMETHIUM G0060: BRONZE BUTLER G0069: MuddyWater G0070: Dark Caracal G0074: Dragonfly 2.0 G0077: Leafminer G0080: Cobalt Group G0086: Stolen Pencil G0091: Silence G0094: Kimsuky G0096: APT41 G0105: DarkVishnya G0115: GOLD SOUTHFIELD G0117: Fox Kitten G0125: HAFNIUM G0126: Higaisa G0131: Tonto Team G0132: CostaRicto G0135: BackdoorDiplomacy	
Add Item			
Open File			

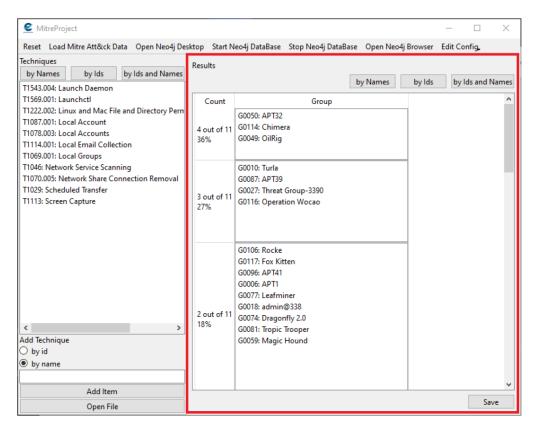


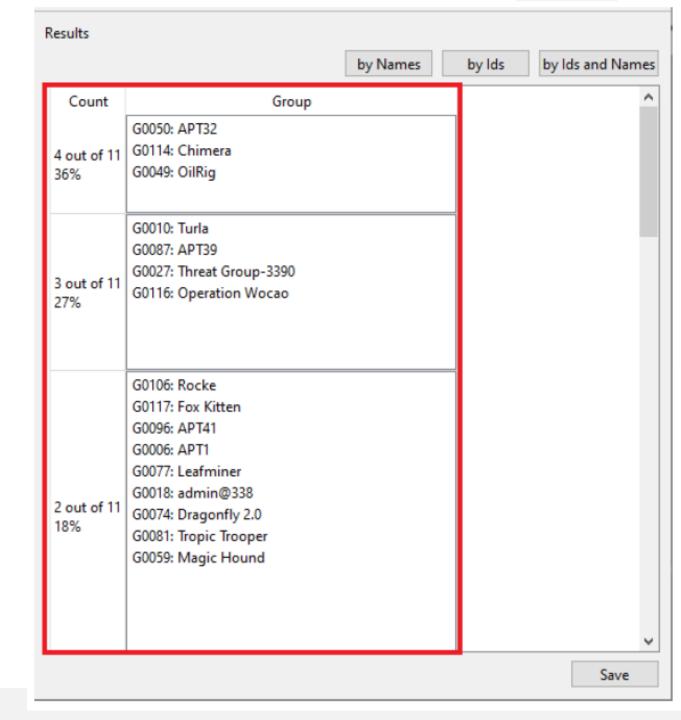
€ MitreProject	-	(
Reset Load Mitre Att&ck Data Open Neo4j Desktop Start Neo4j DataBase Stop Neo4j DataBase Open Neo4j Browser	Edit Config.	
Add Technique • by id • by name		
Add Item Open File	Save	





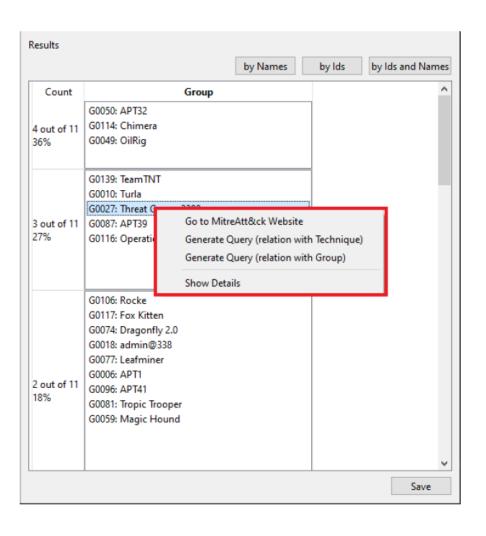








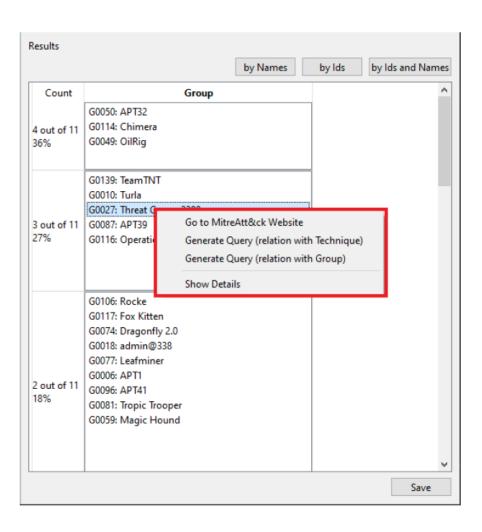


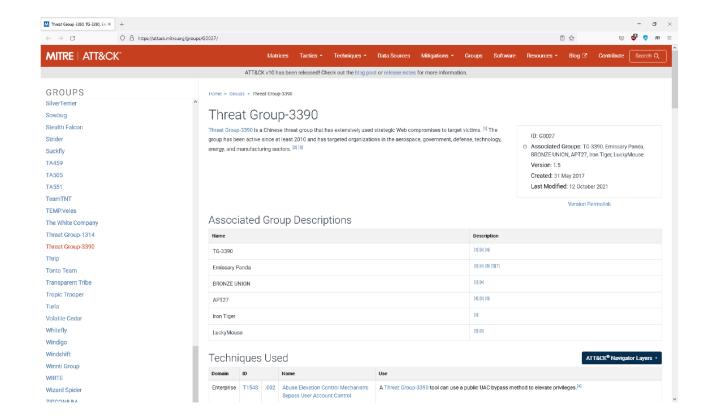


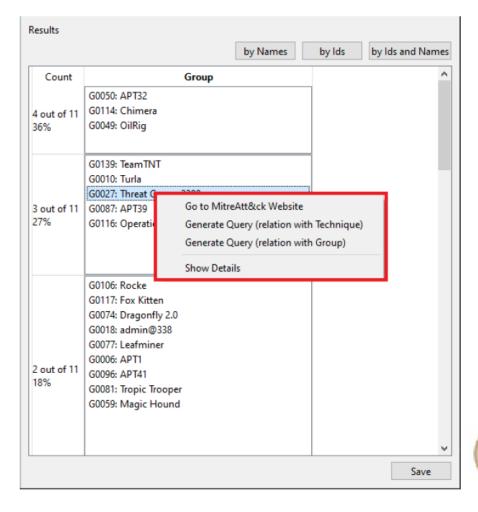


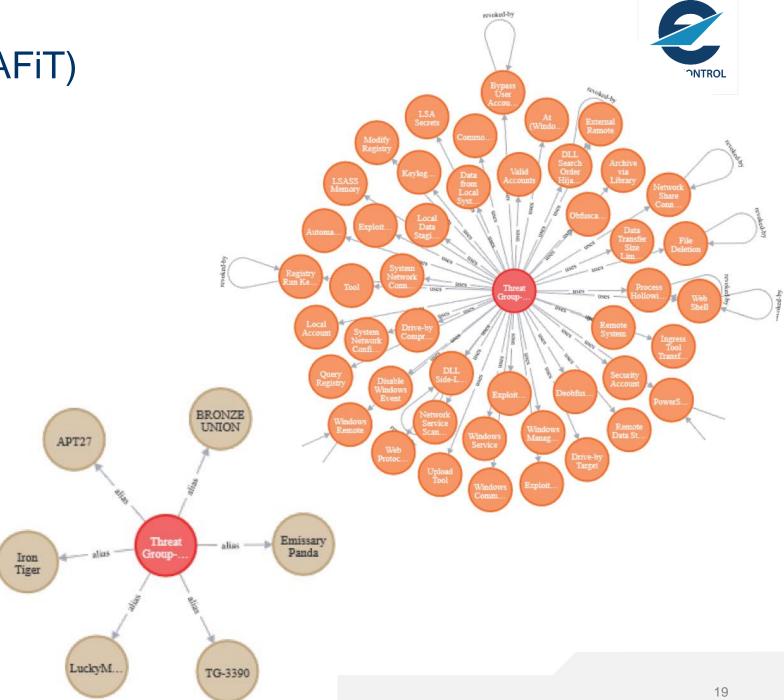




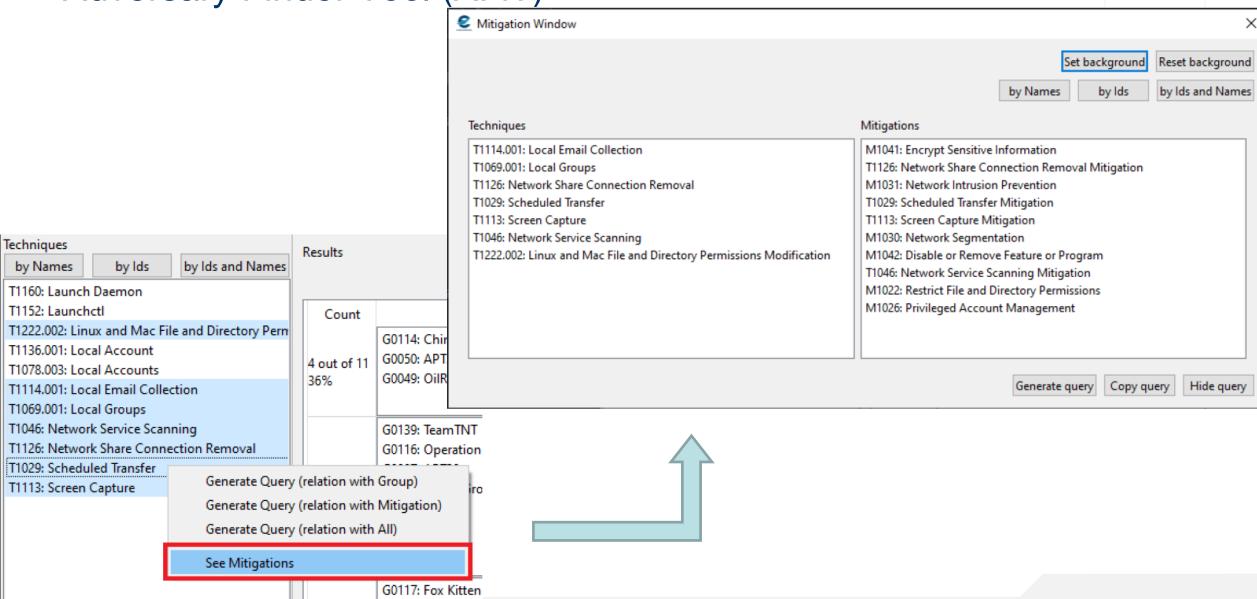




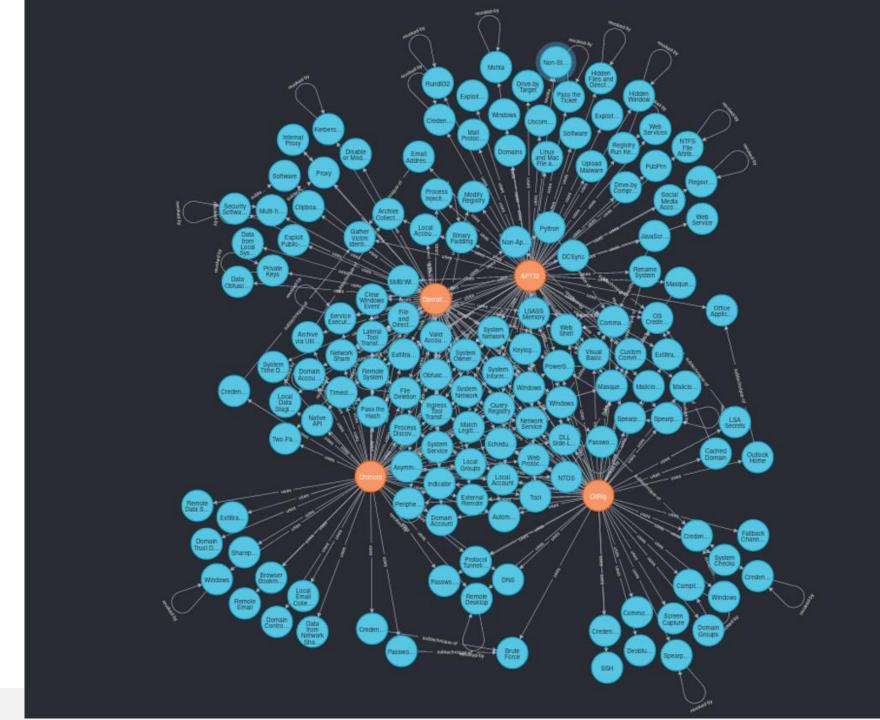












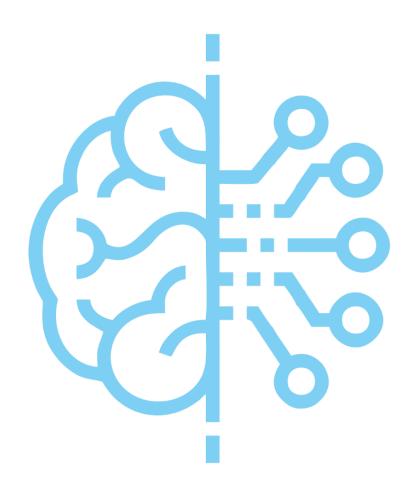


2nd step: AI/ML based tool

AI/ML app



- Find and structure data (though most data cannot be shared) in free text
- Create AI/ML model that could find patterns and make better predictions
 - Improve prediction by considering contextual info provided in the cyber attack report
 - Increase likelihood for some APTs decrease/exclude for others

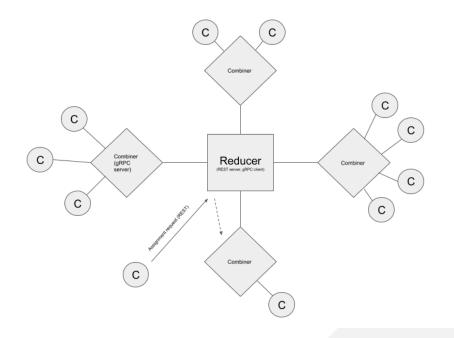






- Federated machine learning
 - Share only models as data cannot be shared
 - FEDn Project https://scaleoutsystems.github.io/fedn/
- Two modes to use it:
 - Frozen mode: simply apply it to without further enriching it
 - Enriching mode: apply it and further enrich the model with updated dataset





AI/ML app

T1566 Phishing

Context - target



Activity Summary

The threat actor crafted the phishing emails to masquerade as a U.S. Department of State Public Affairs official sharing an official document. The links led to a ZIP archive hat contained a weaponized Windows shortcut file hosted on a likely compromised legitimate domain, jmj[.].com. The shortcut file was crafted to execute a PowerShell command that read, decoded, and executed additional code from within the shortcut file.

Upon execution, the shortcut file dropped a benign, publicly available, U.S. Department of State form and Cobalt Strike Beacon. Cobalt Strike is a commercially available post-exploitation framework. The BEACON payload was configured with a modified variation of the publicly available "Pandora" Malleable C2 Profile and used a command and a "trol (C2) domain – pandorasong[.]com – assessed to be a masquerade of the Pandora music streaming service. It sustomization of the C2 profile may have been intended to defeat less resilient network detection methods deposition to the defeat less resilient network detection methods deposition to the defeat less resilient network detection methods deposition. The shortcut metadata indicates it was built on the lower similar to so the shortcut used in the November 2016 campaign. The decoy content is shown in Figure 1.

U.S. Department of State

"OMB APPROVAL NO. 1485-0170
EXTRATION DATE: 01-31-2021
ESTIMATED BURDEN: 2 hours

TRAINING/INTERNSHIP PLACEMENT PLAN

SECTION 1: ADDITIONAL EXCHANGE VISITOR INFORMATION

Traince/intern Name (Surname/Primary, Given Name(3) (must match passport name)

E-mail Address

T1598.002 Spearphishing Attachment

T1059.001 Powershell

Context – similar attack

T1090.004 Domain Fronting

Call for cooperation



- AFiT tool: you can use it if interested,
 no need to share data with us.
 - Report bugs, suggestions, etc...
- AI/ML app
 - Federated learning approach:
 - Train model based on your dataset
 - Enrich the "central" model based on your locally trained model
 - No need to share data with us





THANK YOU

Patrick MANA (<u>patrick.mana@eurocontrol.int</u>)
Bahtiar MUSTAFA (<u>bahtiar.mustafa@eurocontrol.int</u>)