



**RÉPUBLIQUE
FRANÇAISE**

*Liberté
Égalité
Fraternité*



IP PARIS



Striking Back at Cobalt: Using Network Traffic Metadata to Detect Cobalt Strike Masquerading Command and Control Channels

Clément Parssegny, Johan Mazel, Olivier Levillain, Pierre Chifflier
ANSSI (French Cybersecurity Agency), Télécom Sud Paris

- 1 What is Cobalt Strike?
 - Main features
 - *Command and Control* (C2) in Cobalt Strike

- 2 Detection of Cobalt Strike C2 traffic
 - Datasets
 - Machine learning
 - Features
 - Results

- 3 Conclusion

1. What is Cobalt Strike?

Definition

Pentest framework can perform major kill-chain steps including:

- Payload generation
- Command and Control (C2)
- Many commands for reconnaissance, code injection, data exfiltration, etc.
- Audit report generation

Examples: Brute Ratel, **Cobalt Strike**, Havoc, Sliver...

Related works: Detection of Cobalt Strike

- Motivation: well-known attackers use it (ex: Conti, Mustang Panda, Nobelium) [1]
- Several academic papers:
 - VanDerEijk et al. [2]
 - Ramos et al. [3, 4]
 - Yang et al. [5]
- Technical reports:
 - Talos [6]
 - BlackBerry [7]

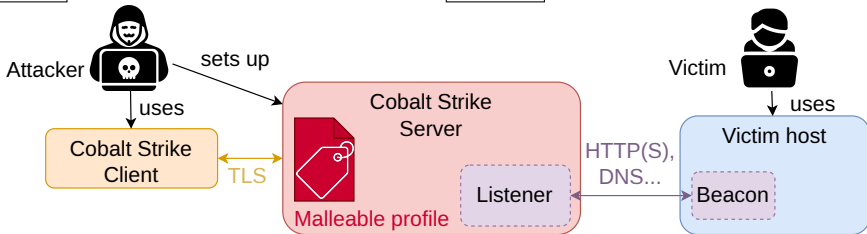
Cobalt Strike C2: Architecture

Johan

Cobalt Strike C2: architecture ?

Clément

ok



Cobalt Strike C2: Malleable profile



Johan

Cobalt Strike C2: malleable profile ?

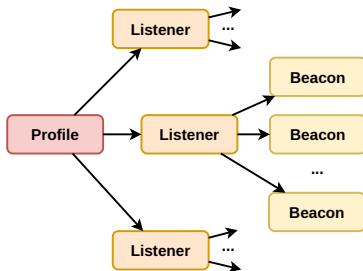
Clément

ok

Definition

Configuration file that contains rules for communication between the *Listener* and the *Beacons* (and more...).

Parameter examples: *sleeptime*, data obfuscation, URI, TLS certificate, post-exploitation behavior...



2. Detection of Cobalt Strike C2 traffic

Threat model



- The attacker establish C2 covert channels using HTTP, HTTPS or DNS
- We, defenders, passively monitor network traffic
- No application layer analysis

Research question

Can standard **Johan** "or classic" ? **Clément** *dans le papier on emploie standard network features (duration, packet size and direction...) be used to differentiate Cobalt Strike C2 traffic from benign traffic ?* **Johan** *hum on utilise pas vraiment directement "packet size and direction" donc il faudrait reformuler, non ?* **Clément** *la direction est utilisée car c'est une feature par direction. Pour la durée, elle est dans les netflow donc à ce stade de la réflexion elle est incluse.*

Our approach needs:

- Data
- Machine learning tools (binary supervised classification)
- Features

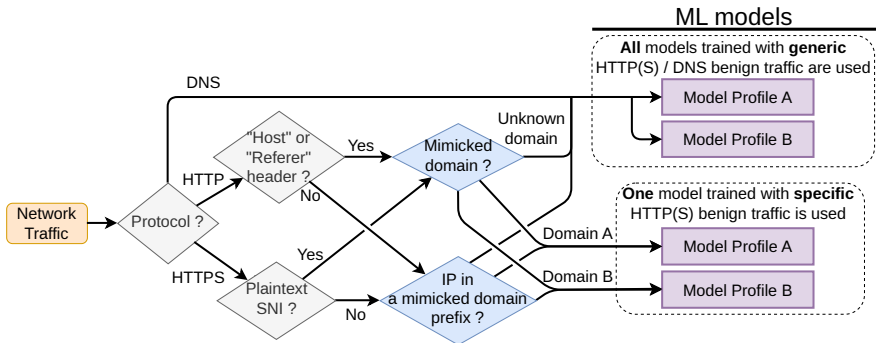
- NCC's collected beacons dataset [8]
- Cobalt Strike C2 network traffic generation platform
- Benign network traffic datasets from Stratosphere IPS [9], UPC [10] and UPN [11]
- Real world Cobalt Strike C2 traffic [12]

- A baseline to compare with: "*A machine learning based approach to detect stealthy cobalt strike C&C activities from encrypted network traffic*", Ramos et al. [3].
- An algorithm: Random Forest with hyperparameter tuning
- A validation method: stratified k-fold cross-validation
- A performance metric: F_1 score
- A feature importance metric: Mean Decreasing Impurity (MDI)

Feature group name	Flow information							
	Nb packets	Packet size	OSI layer used for size	Duration	TCP flags	TCP history	Protocol	Service
Netflow v5	$\mathcal{B}$	total ($\mathcal{B}$)	L3	✓	✓	-	-	-
Netflow v9	$\mathcal{U}$	total ($\mathcal{U}$) minimum & maximum (S)	L3	✓	✓	-	-	-
Ramos et al.	$\mathcal{B}$	total ($\mathcal{B}$)	L4	-	-	✓	✓	✓

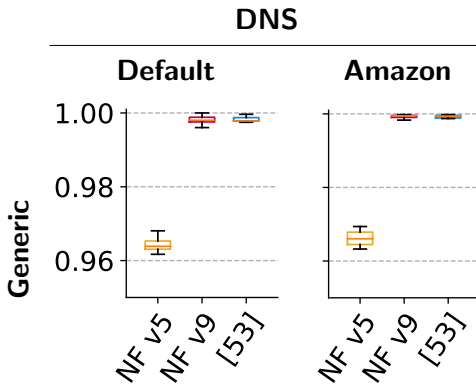
Table: $\mathcal{B}$: bi-direction $\mathcal{U}$: uni-directional S: sent packets only (Beacon to Listener) L3/4: Layer 3/4. Byte counts are based on the layer payload

Proposed method



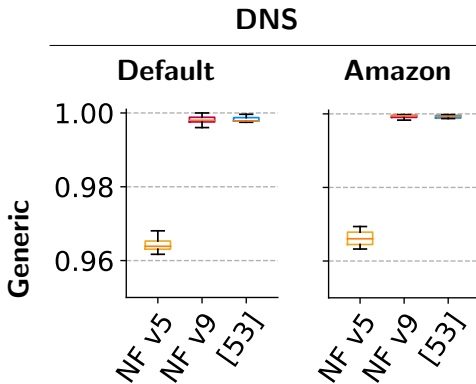
Johan *tu mets les takeaway de ces slide en haut, mais en fait, c'est une conclusion que tu déduis de la figure, il faut le mettre en bas de la slide, avec "⇒" ? ou carrément un bloc takeaway ? possiblement, ne pas l'afficher de suite*

Clément *modifié*

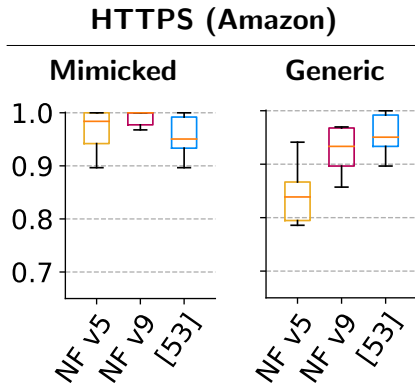


Johan *tu mets les takeaway de ces slide en haut, mais en fait, c'est une conclusion que tu déduis de la figure, il faut le mettre en bas de la slide, avec "⇒" ? ou carrément un bloc takeaway ? possiblement, ne pas l'afficher de suite*

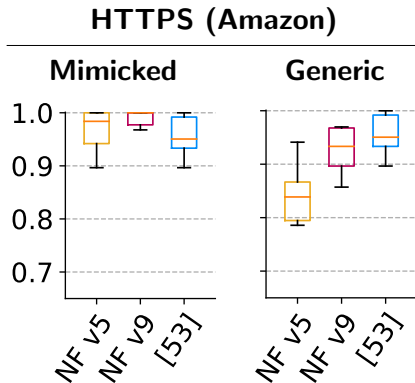
Clément *modifié*



Results



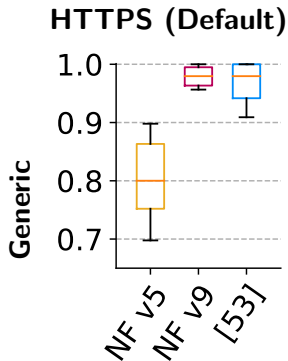
[53] refers to the baseline.



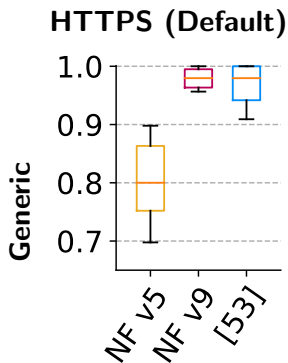
⇒ Better performance if mimicked domain identified

[53] refers to the baseline.

Results



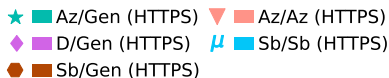
[53] refers to the baseline.



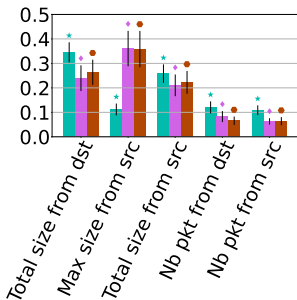
⇒ Netflow v5 is not that effective but Netflow v9 performs equally or better than the Ramos et al. baseline

[53] refers to the baseline.

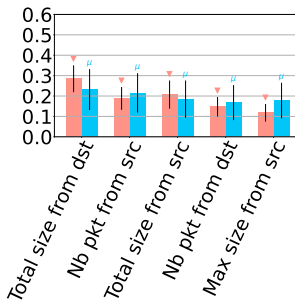
Feature importance: Netflow v9 (HTTPS)



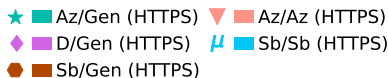
Generic



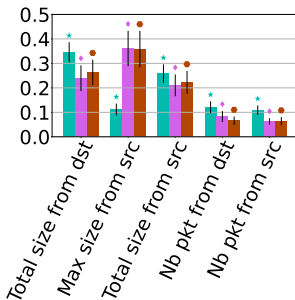
Mimicked



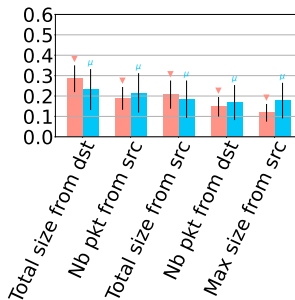
Feature importance: Netflow v9 (HTTPS)



Generic



Mimicked



⇒ Total size exchanged from the server has more importance in the decision

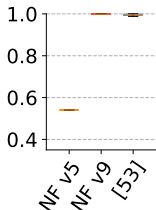
Detection on real-world Cobalt Strike traffic



- 1 trace with HTTP and known domain
- 4 traces with HTTPS and Johan *and* Clément *ok* unknown Johan
unknown ? Clément *ok* domain

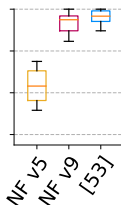
HTTP

11-06

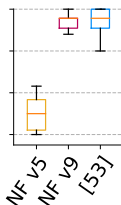


HTTPS

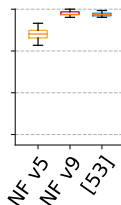
01-31



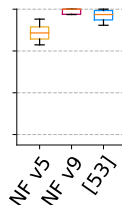
05-23



07-12



10-03



[53] refers to the baseline.

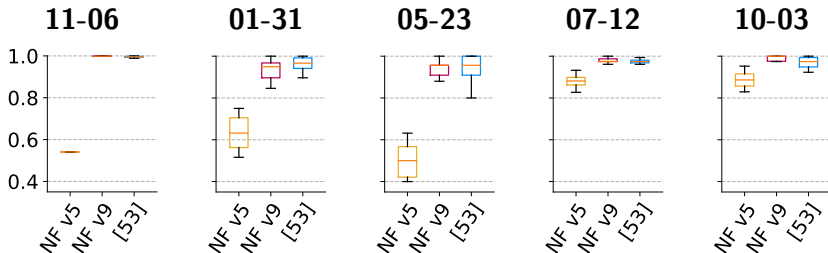
Detection on real-world Cobalt Strike traffic



- 1 trace with HTTP and known domain
- 4 traces with HTTPS and Johan *and* Clément *ok* unknown Johan
unknown ? Clément *ok* domain

HTTP

HTTPS



⇒ Encouraging results but not enough traces to be confident
[53] refers to the baseline.

3. Conclusion

Conclusion



- Detection of Cobalt Strike and other pentest frameworks is a challenge
- Standard network metadata features produce encouraging results
- Better performance is observed when the mimicked traffic is identified

Future work



- Evaluate the method on "data sending" profiles (Dropbox, videoconferencing, etc.)
- Evaluate the generalization capability of the method
- Extend the method to other C2 frameworks

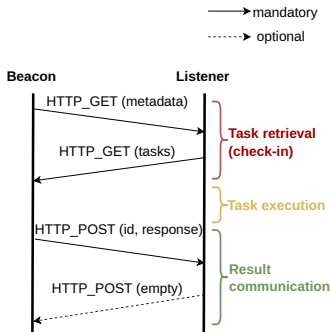
Johan *à merger avec conclusion ?* **Clément** *je parle pas dans cette slide.
C'est juste pour afficher les points à retenir pendant les questions*

Takeaway

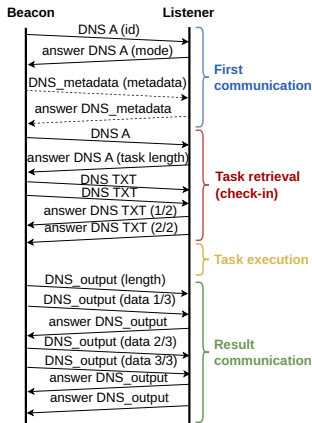
- Standard network features allows detection despite mimicking capability
- Determining the domain mimicked optimize the performance
- Method tested on real-world traffic
- Artifacts available at:
<https://github.com/cp-tsp/ares2025-artifacts>

Appendix

Example of communication



(a) HTTP



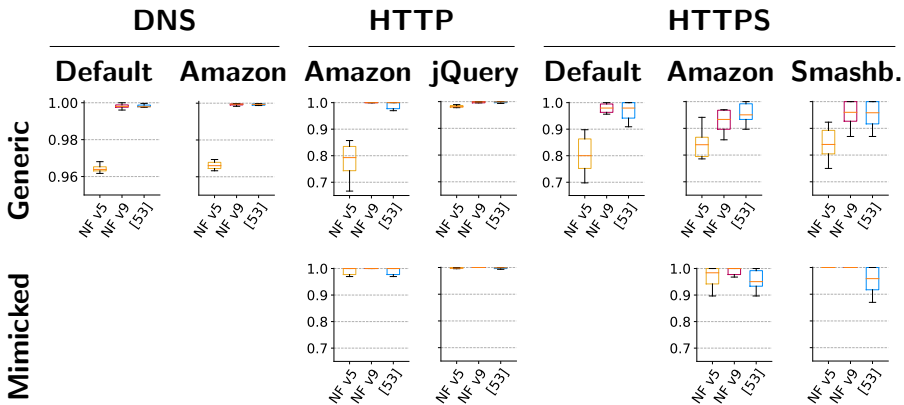
(b) DNS in TXT mode.

Most common domains mimicked in the NCC's dataset



Spoofer domain	Nb of TLSH-based grouped profiles	Nb of instances	Nb of unique profiles
code.jquery.com	30	4 949	601
www.amazon.com	36	3 662	243
download.windowsupdate.com	42	993	145
locations.smashburger.com	2	827	3
www.google.com	40	722	195
www.bing.com	29	548	92
ocsp.verisign.com	24	520	54
www.microsoft.com	33	360	67
onedrive.live.com	15	316	63
audio-sv5-t1-3.pandora.com	7	281	38

Boxplots



[53] refers to the baseline.

Learning curves

Az/Gen (DNS)
D/Gen (DNS)

Az/Az (HTTP) jQ/Gen (HTTP)
Az/Gen (HTTP) jQ/jQ (HTTP)

Az/Az (HTTPS) Sb/Gen (HTTPS)
Az/Gen (HTTPS) Sb/Sb (HTTPS)
D/Gen (HTTPS)

DNS

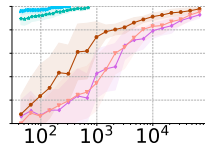
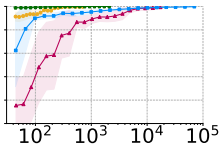
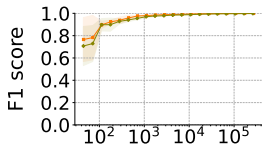
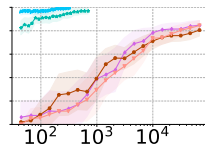
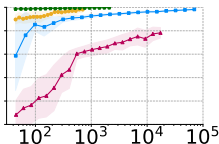
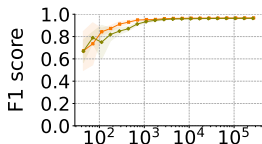
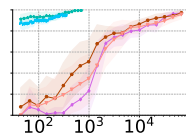
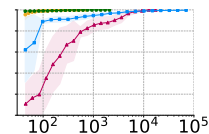
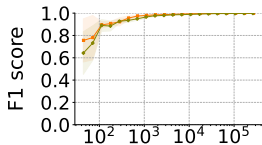
HTTP

HTTPS

Ramos et
al.

NF v5

NF v9



Feature importance: Netflow v9

Generic

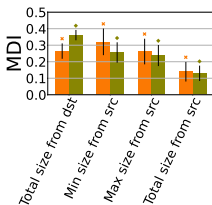
Mimicked

✖ Az/Gen (DNS)
◆ D/Gen (DNS)

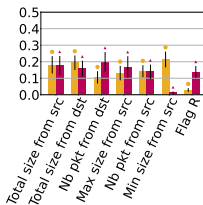
● Az/Gen (HTTP) ▲ jQ/Gen (HTTP)
■ Az/Az (HTTP) ◆ jQ/jQ (HTTP)

★ Az/Gen (HTTPS) ◆ D/Gen (HTTPS) ● Sb/Gen (HTTPS)
▼ Az/Az (HTTPS) μ Sb/Sb (HTTPS)

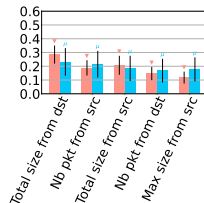
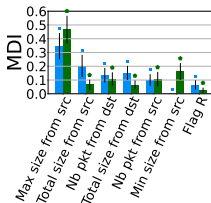
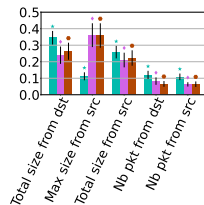
DNS



HTTP



HTTPS



Bibliography

- [1] MitreAtt&ck. <https://attack.mitre.org/software/S0154/>.
- [2] Coen Schuijt Vincent van der Eijk. *Detecting Cobalt Strike beacons in NetFlow data*. 2020.
- [3] Fabian Martin Ramos and Xinyuan Wang. "A Machine Learning Based Approach to Detect Stealthy Cobalt Strike C&C Activities from Encrypted Network Traffic". In: *Machine Learning for Networking*. 2022.
- [4] Fabian Martin Ramos and Xinyuan Wang. "Detecting Stealthy Cobalt Strike C&C Activities via Multi-Flow based Machine Learning". In: *ICMLA*. 2023.
- [5] Xiaodu Yang et al. "PETNet: Plaintext-aware encrypted traffic detection network for identifying Cobalt Strike HTTPS traffics". In: *Comput. Nets*. (2024).
- [6] N.Mavis. *The art and science of detecting Cobalt Strike*. 2020.
- [7] T.J.O'Leary et al. *Finding Beacons In The Dark*. 2021.
- [8] Yun Zheng Hu. *Mining data from Cobalt Strike beacons*. <https://www.nccgroup.com/us/research-blog/mining-data-from-cobalt-strike-beacons>. 2022.

Bibliography (cont.)



- [9] Stratosphere. *Stratosphere Laboratory Datasets*.
<https://www.stratosphereips.org/datasets-overview>. 2015.
- [10] UPC.
<https://historic.cba.upc.edu/monitoring/traffic-classification.html>.
2015.
- [11] Víctor Labayen et al. “Network traffic and code for machine learning classification”.
In: *Machine Learning for Networking*. 2020.
- [12] MTA. <https://www.malware-traffic-analysis.net/2023/>.