



*Setting the Standard for Automation™*

Engr. Felipe Sabino Costa

Moxa ICS Expert & ISA Cybersecurity Director (District 4)

***“Enhancing the Cybersecurity on Mission-critical Applications using Cognitive Technologies”***

Standards  
Certification  
Education & Training  
Publishing  
Conferences & Exhibits



# Engr. Felipe Sabino Costa

Moxa ICS Expert & ISA Cybersecurity Director (District 4)

- **+ 16 years** of Experience in Automation
- **+ 7 years** in Connectivity & Cybersecurity
- **ISA / IEC-62443 Official Instructor** and member of the Standard Committee
- Certifications: **US Defense, MIT, Stanford, IBM, NYU** and **Master's Degree in ICS in Spain**
- Specialization in **Innovation at Harvard** and **MBA** in Marketing
- **Post graduation in Artificial Intelligence (AI)** – In progress

Let's Connect!



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# Mission-critical Applications



# ***Mission-critical Applications (critical infrastructure)***

“There are 16 critical infrastructure\* sectors whose assets, systems, and networks, whether physical or virtual, are considered so vital to the United States that their incapacitation or destruction would have a debilitating effect on security, national economic security, national public health or safety, or any combination thereof.”

***The Cybersecurity and Infrastructure Security Agency (CISA)***

\*Chemical Sector, Commercial Facilities Sector, Communications Sector, Critical Manufacturing Sector, Dams Sector, Defense Industrial Base Sector, Emergency Services Sector, Energy Sector, Financial Services Sector, Food and Agriculture Sector, Government Facilities Sector, Healthcare and Public Health Sector, Information Technology Sector, Nuclear Reactors, Materials, and Waste Sector, Transportation Systems Sector, Water and Wastewater Systems Sector



# Secure

Physical Security  
Asset Inventory  
Hardening  
Patch Mgmt

# Defend

DMZ  
Anti-Malware  
Access Control

# Contain

Zone  
Firewalls  
Whitelisting

# Manage

SIEM  
Incident Management

# Anticipate

Anomaly &  
Breach detection  
Threat intelligence

# Industrial Cybersecurity Maturity Model

# Current Challenges



# Current Challenges

- **How to adjust current good practices for each system singularity.**
- **Lack of operator knowledge to detect configurations security flaws in different parameters (protocols, authentication, communication, etc.)**
- **High number of configuration possibilities (over Centillion singular possibilities for a single network asset)**



# **Static Model**

**(Current available solution)**



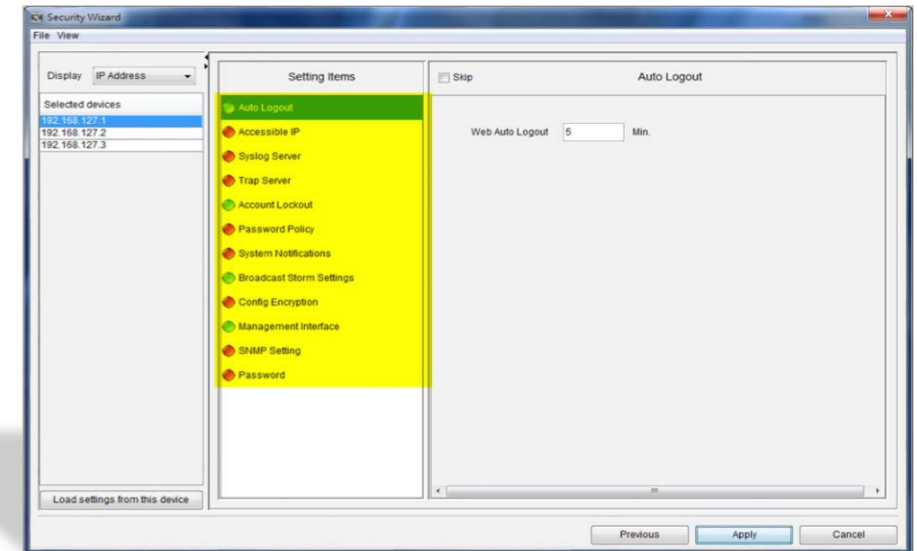
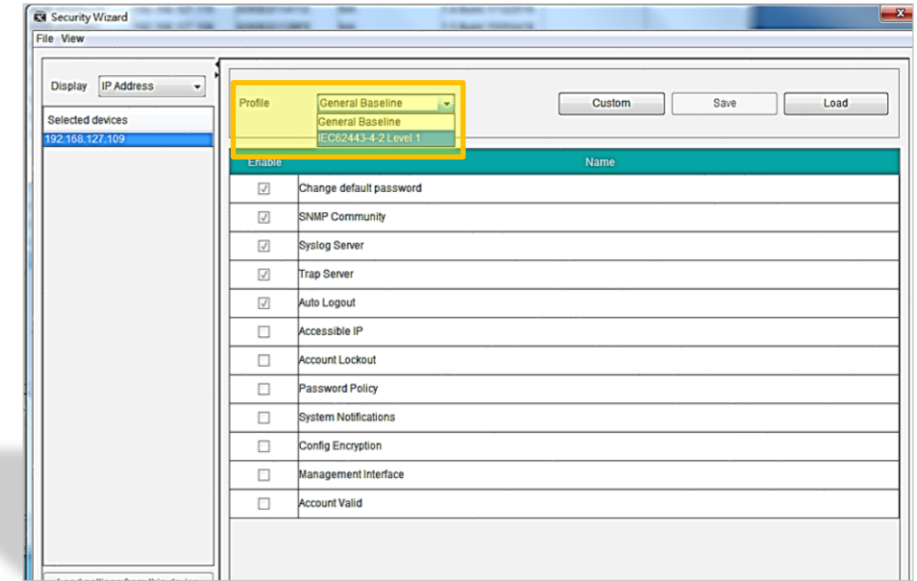


# Static Model

## RPA (robotic process automation)

### Characteristics:

- Establishment of a consistent configuration using good practices (e.g. ISO 27000, NIST, CIS, IEC-62443)
- Demands an intense upfront development
- Minimizes some potential vulnerabilities, compared to current manual checks
- May not address some communication system specifics
- Unable to adapt ICS changes and different types of threats dynamically



# **Cognitive System Applied to Cybersecurity**

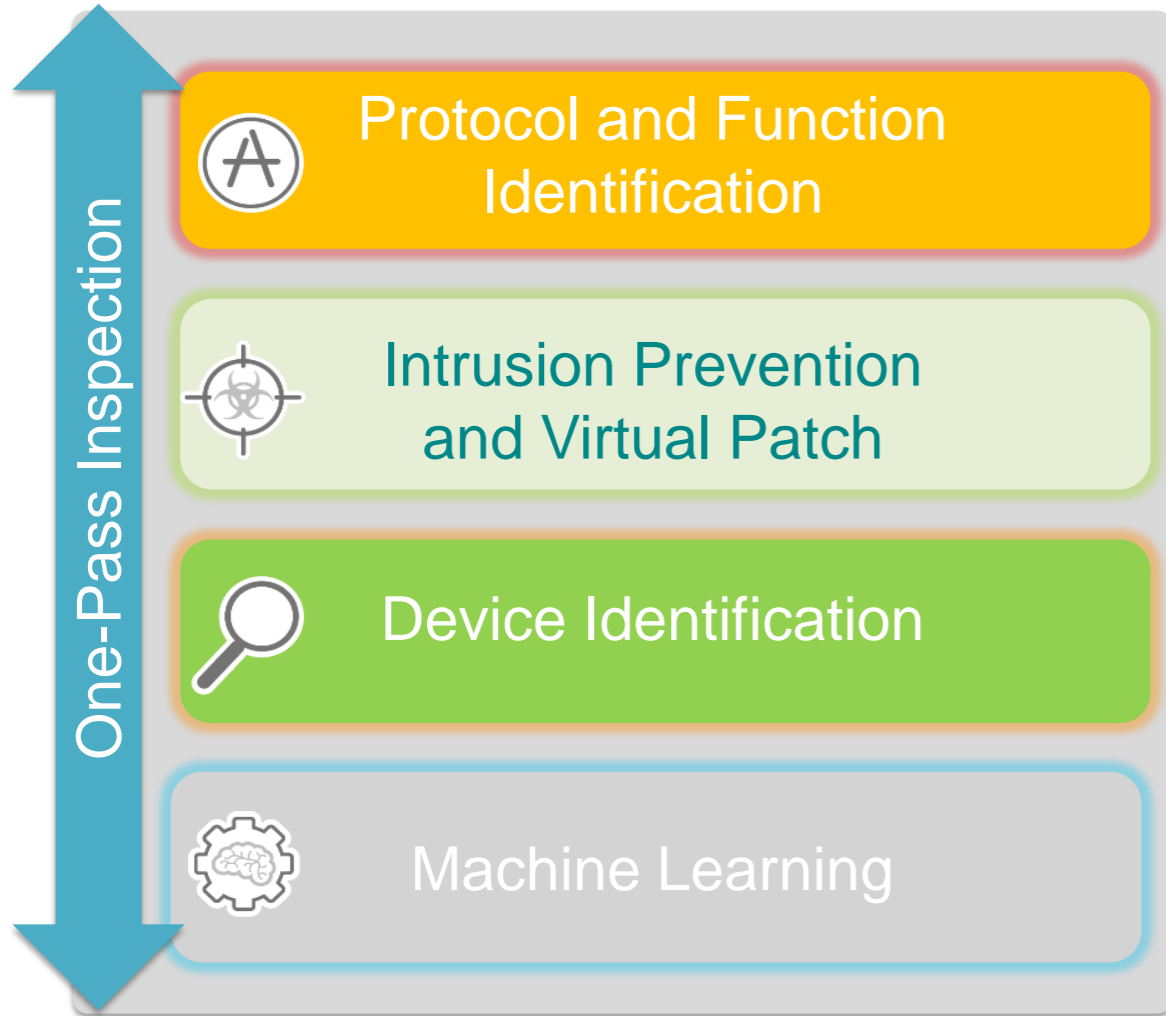


# Common Application Areas

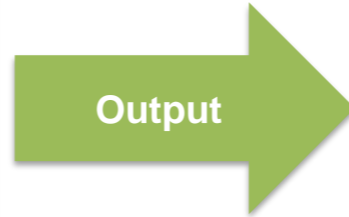
- **Malware detection**
- **Trigger anomalous network behavior**
- **Cybersecurity events triage**



# Reference Application



Intrusion Detection Systems (IDS)



```
[**] [122:1:0] (portscan) TCP Portscan [**]  
[Priority: 3]  
PROTO:255 172.16.52.1 -> 172.16.52.2  
[Similarity: 1]  
[**] [1:1002:7] WEB-IIS cmd.exe access [**]  
[Classification: Web Application Attack] [Priority: 1]  
02/28-13:34:26.5926 80.101.45.10:59494 ->  
TCP 172.16.52.1:56665 -> 172.16.52.2:80  
[Similarity: 1]  
[**] [1:1002:7] WEB-IIS cmd.exe access [**]  
[Classification: Web Application Attack] [Priority: 1]  
TCP 172.16.52.1:36329 -> 172.16.52.2:80  
[Similarity: 1]  
[**] [1:1444:3] TFTP Get [**]  
[Classification: Potentially Bad Traffic] [Priority: 2]  
UDP 172.16.52.2:1039 -> 172.16.52.1:69  
[Similarity: 1]  
[**] [1:1002:7] WEB-IIS cmd.exe access [**]  
[Classification: Web Application Attack] [Priority: 1]  
TCP 172.16.52.1:46661 -> 172.16.52.2:80  
[Similarity: 1]
```

Snort (Syslog)



# Dynamic Model

(Proposed Model)



# Common ICS Vulnerabilities

**Proposed  
Enhancement**



- Poor Code Quality
- Vulnerable Web Services
- Poor Network Protocol Implementations
- Poor Patch Management
- Weak Authentication

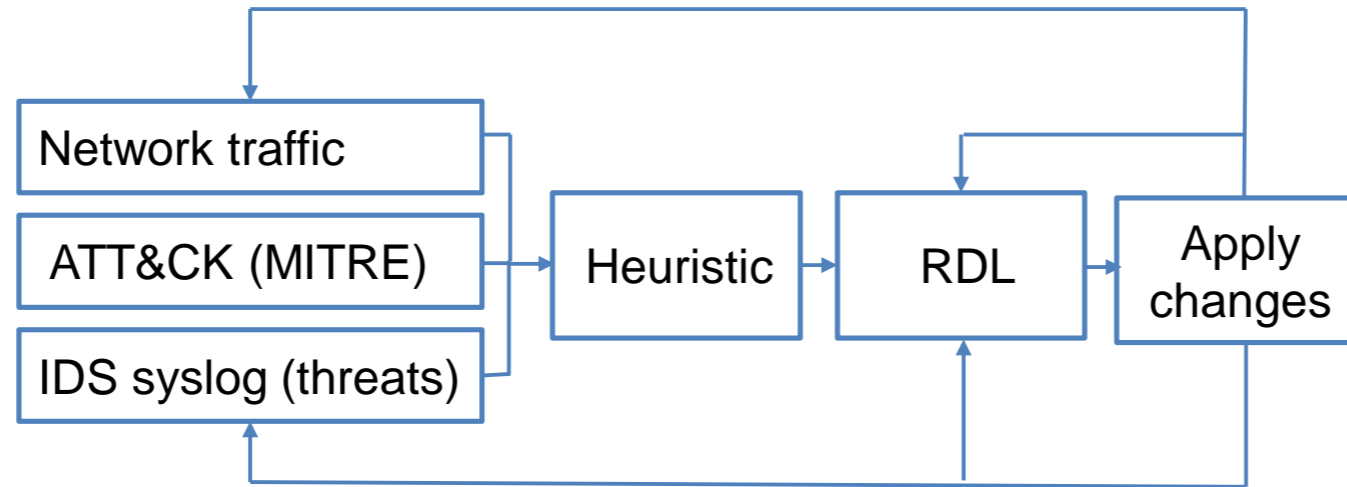
- Network Design
- Network Component Configurations
- Information Disclosure
- Least User Privileges Violation

Source: The Cybersecurity and Infrastructure Security Agency (CISA) "210W-07 ICS Cybersecurity Vulnerabilities"



# Dynamic Model

## DRL (Deep Reinforcement Learning)



Description	Role
Network traffic	Attacks and health system (baseline) indicators
ATT&CK (MITRE)	Solid attack framework to map different attack techniques
IDS syslog (threats)	Usually uses (ML) can provide specific attack flags
Heuristic	It will combine the specific technique and current alarms to suggest the most likely classes of configurations to RDL compute
RDL	Deep Reinforcement Learning the algorithm that will generate the insights (Lack of public and private datasets)
Apply changes	SNMP (API) The protocol that will effectively perform the changes Deploy suggested changes in the network assets



# Why Deep Reinforcement Learning?

- **Lack of historical data, empirical data from operators.**
- **Difficult to train the algorithm due the lack of public or private relevant data sets**
- **Complex to replicate the specific system (Proof of Concept)**
- **High number of configuration possibilities**





# Dynamic / Static models Comparison



## Static Model (Current)

Limited to the general good practices recommendation

Customizations limited to the operator knowledge

Demands an intense upfront development

May not address some communication system specifics

Unable to adapt ICS changes and different types of threats dynamically

## Dynamic Model (Proposed)

Not limited to good practices recommendation

Discover potential improvements

Reduced development to heuristics creation only

Insights generation based on specific traffic behavior and error/ attack logs

Able to adapt devices and threats which might change dynamically





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**Let's keep in touch**

