

By the Numbers: Towards Standard Evaluation Metrics for Programmable Logic Controllers' Defenses

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Improved, Stuxnet-Like PLC Malware Aims to Disrupt Critical Infrastructure

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Feds Uncover a ‘Swiss Army Knife’ for Hacking Industrial Control Systems

The malware toolkit, known as Pipedream, is perhaps the most versatile tool ever made to target critical infrastructure like power grids and oil refineries.



Background

Programmable Logic Controllers (PLC)



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- Increasingly interconnected, e.g., cloud.

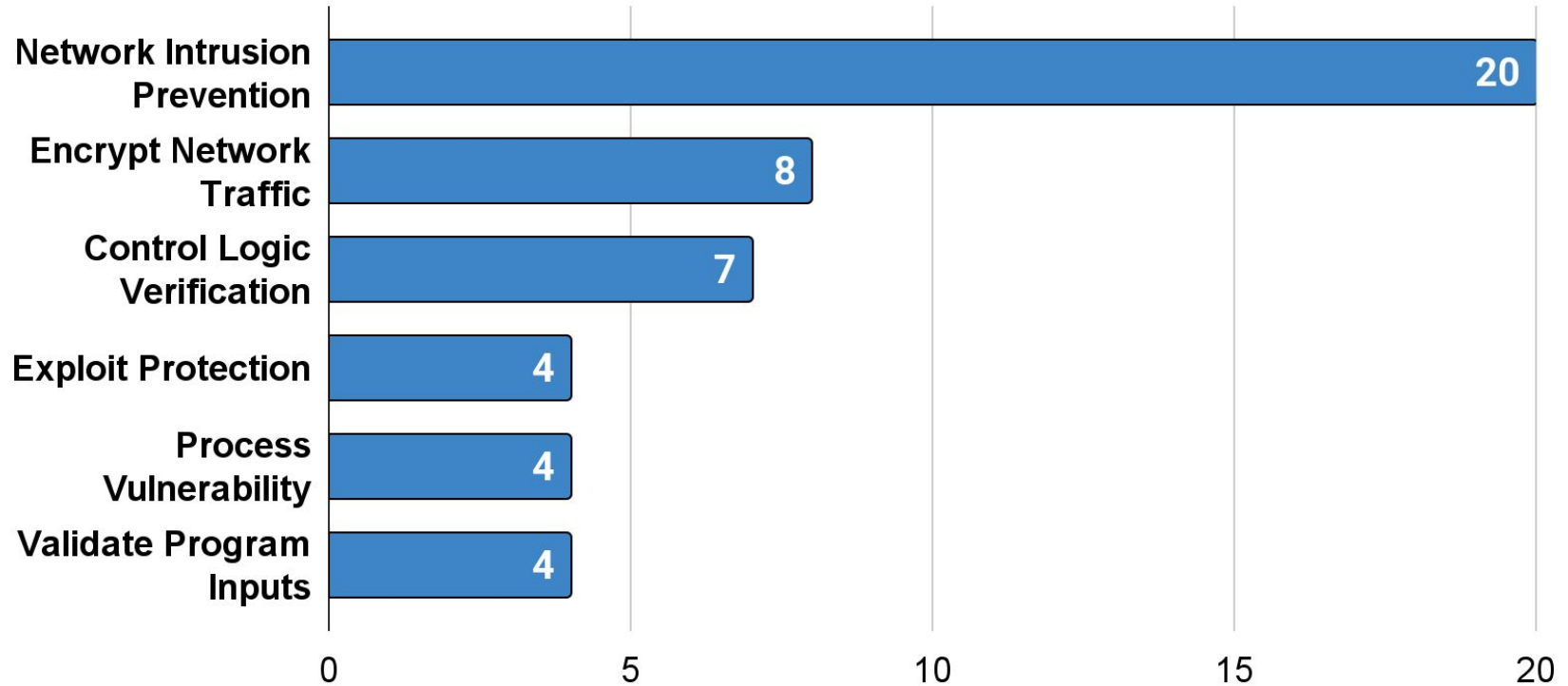


Programmable Logic Controllers (PLC)

- Control physical industrial equipment, e.g., pumps.
- Varied software and hardware architectures.
- Increasingly interconnected, e.g., cloud.
- Yet, little to no built-in security features.



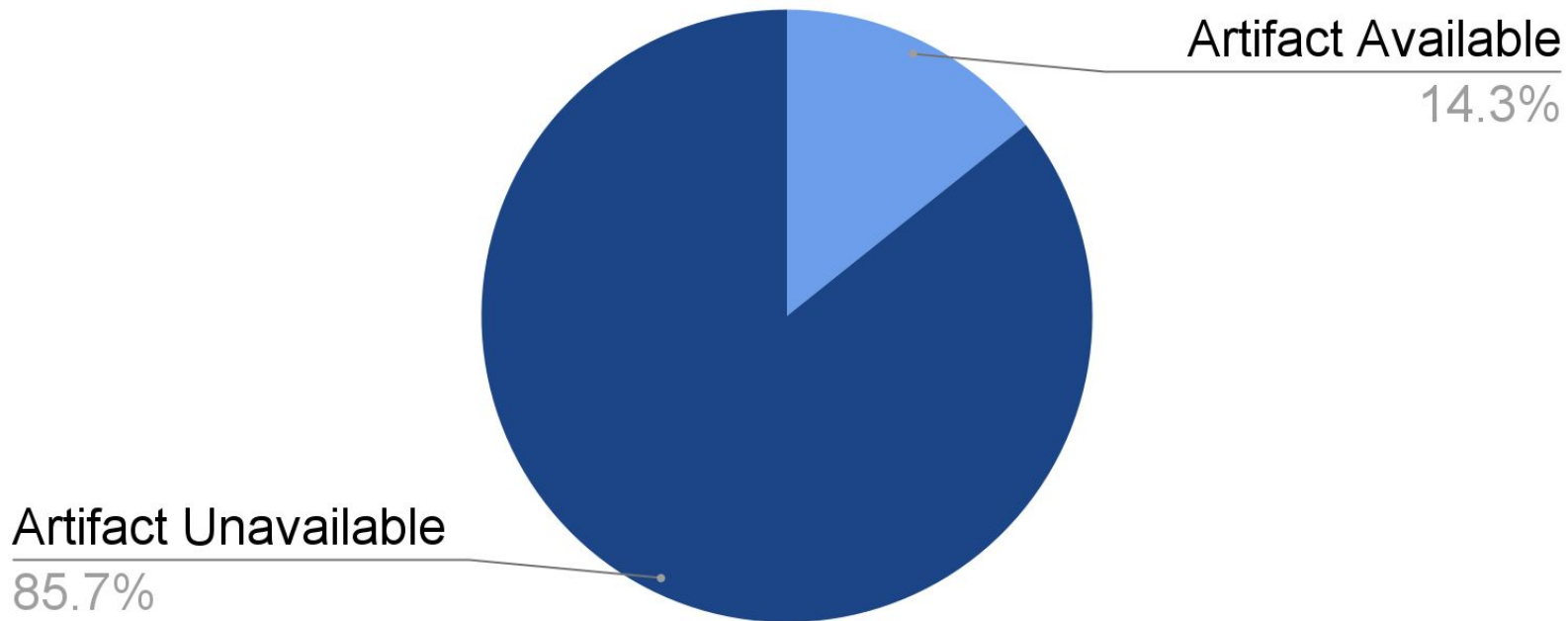
Defense Methods per Mitigation Category



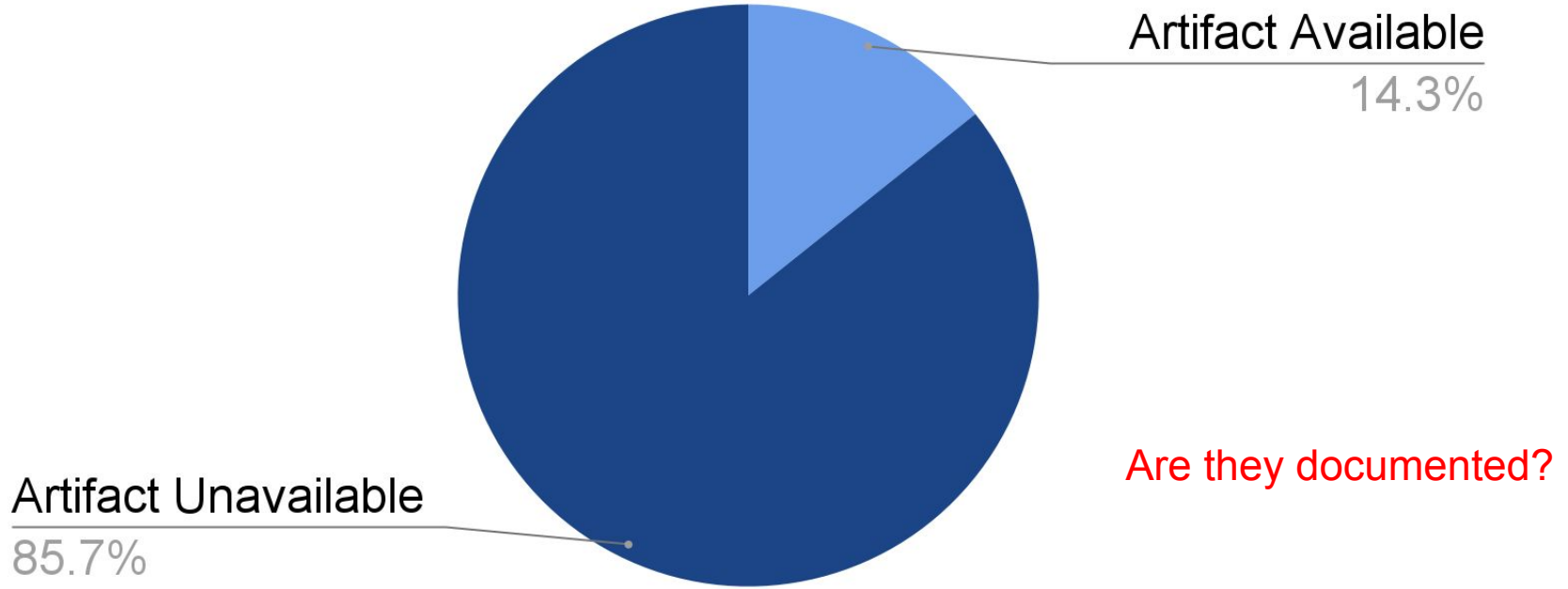
**BY ANDY COCKBURN, PIERRE DRAGICEVIC,
LONNI BESANÇON, AND CARL GUTWIN**

Threats of a Replication Crisis in Empirical Computer Science

PLC Security Papers' Artifact Availability

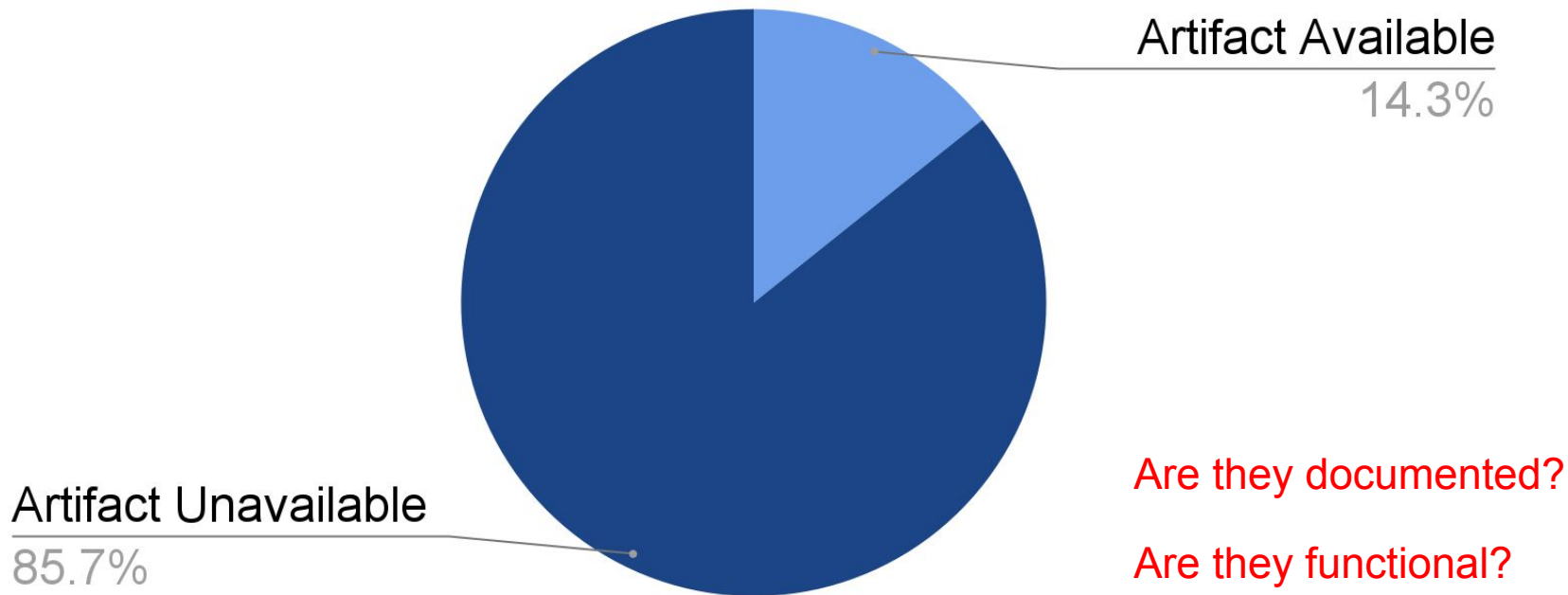


PLC Security Papers' Artifact Availability



Are they documented?

PLC Security Papers' Artifact Availability



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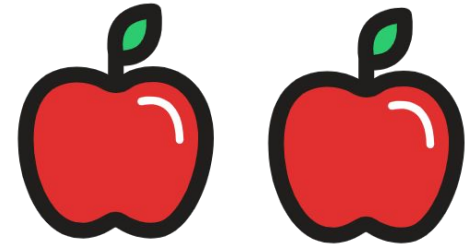
Are they functional?

Is there an **alternative** to research artifacts to **improve** PLC security research **reproducibility**?

Evaluation Metrics

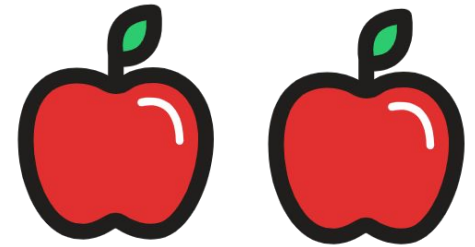
Evaluation Metrics

- Provide the **standards** by which different algorithms, systems, or artifacts are **compared**.



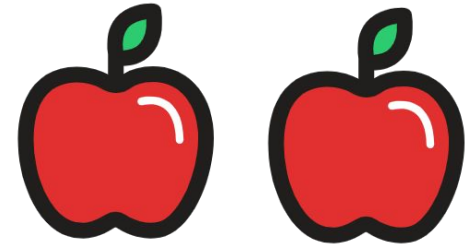
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Evaluation Metrics

- Provide the **standards** by which different algorithms, systems, or artifacts are **compared**.
- Provide **quantitative** measures to assess the **performance** of the artifact.
- Do not require access to artifacts.



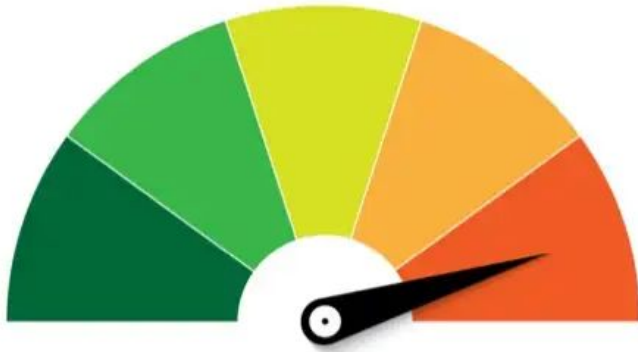
Existing Evaluation Metrics for PLCs

Overhead

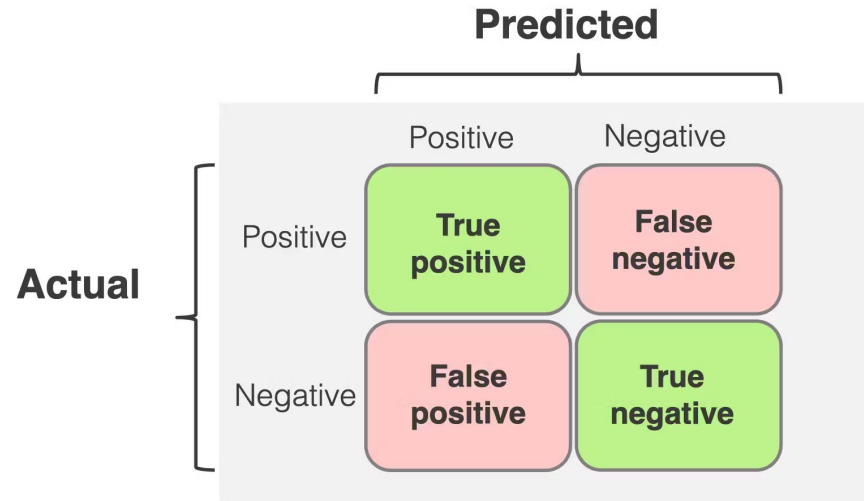


Existing Evaluation Metrics for PLCs

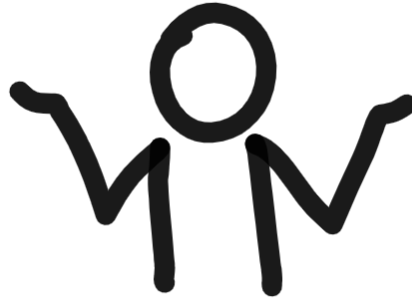
Overhead



Effectiveness

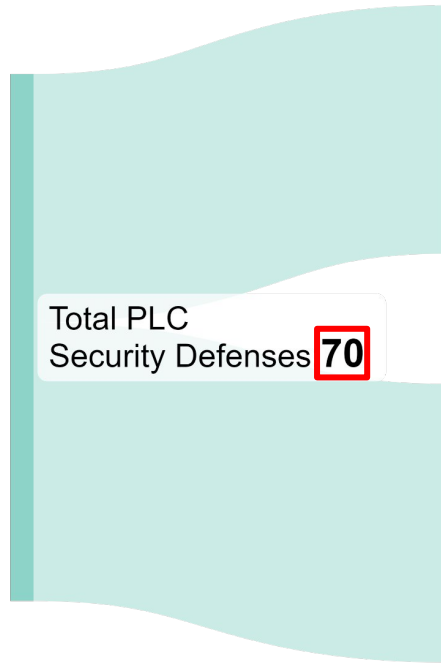


Existing Evaluation Metrics for PLCs

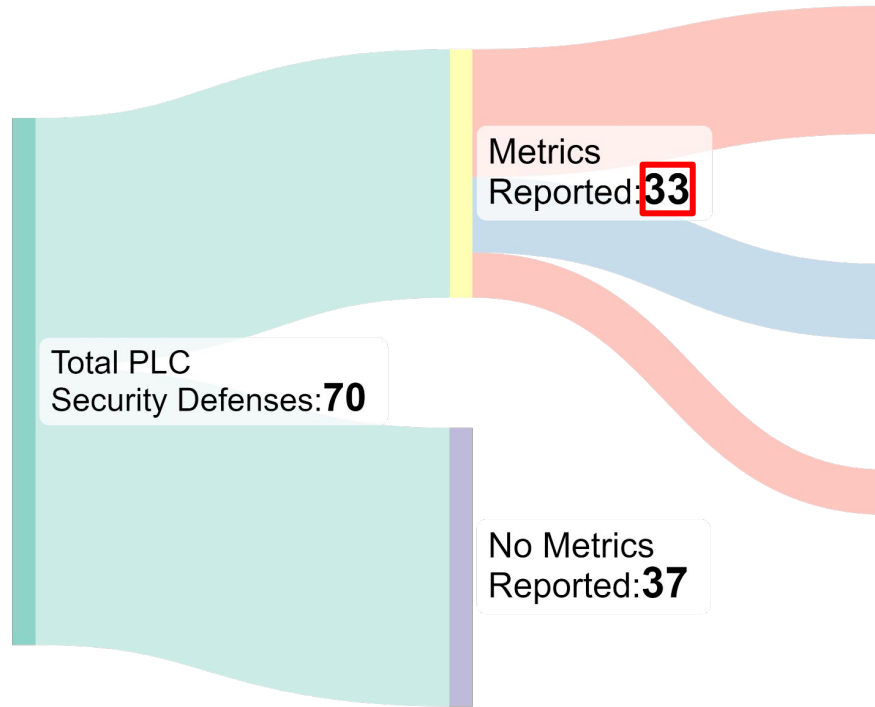


No security metrics

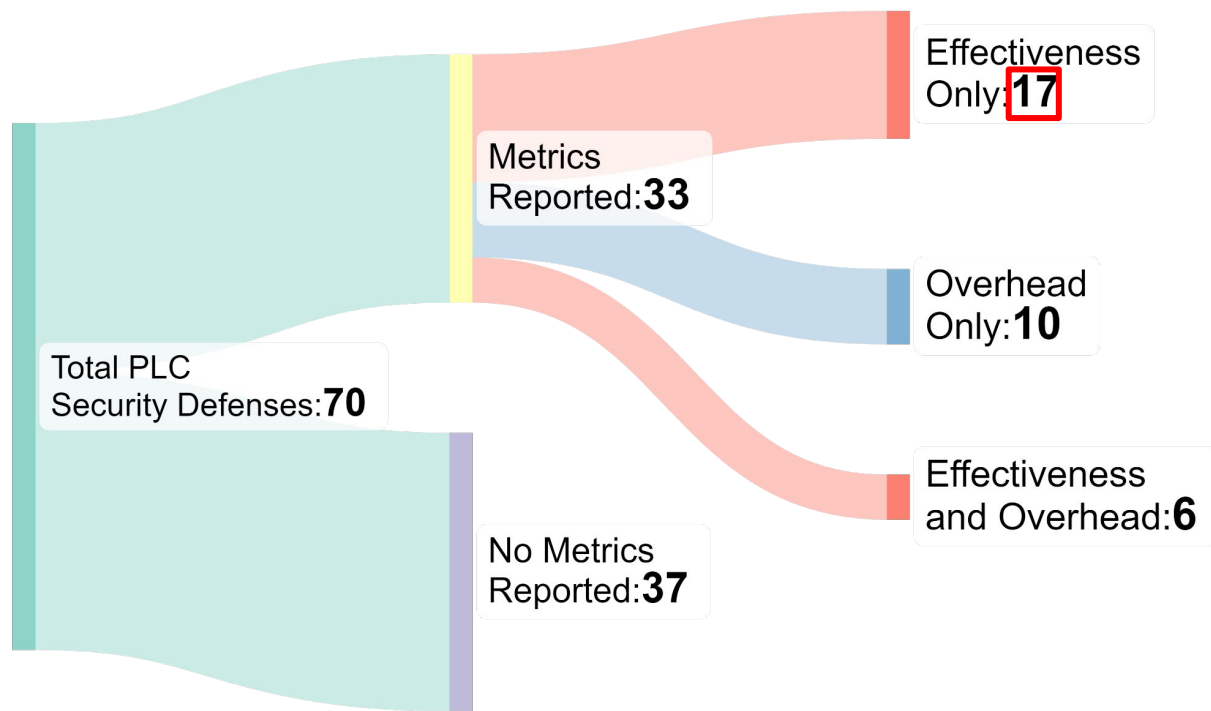
PLC Defenses Reported Metrics (2007-2023)



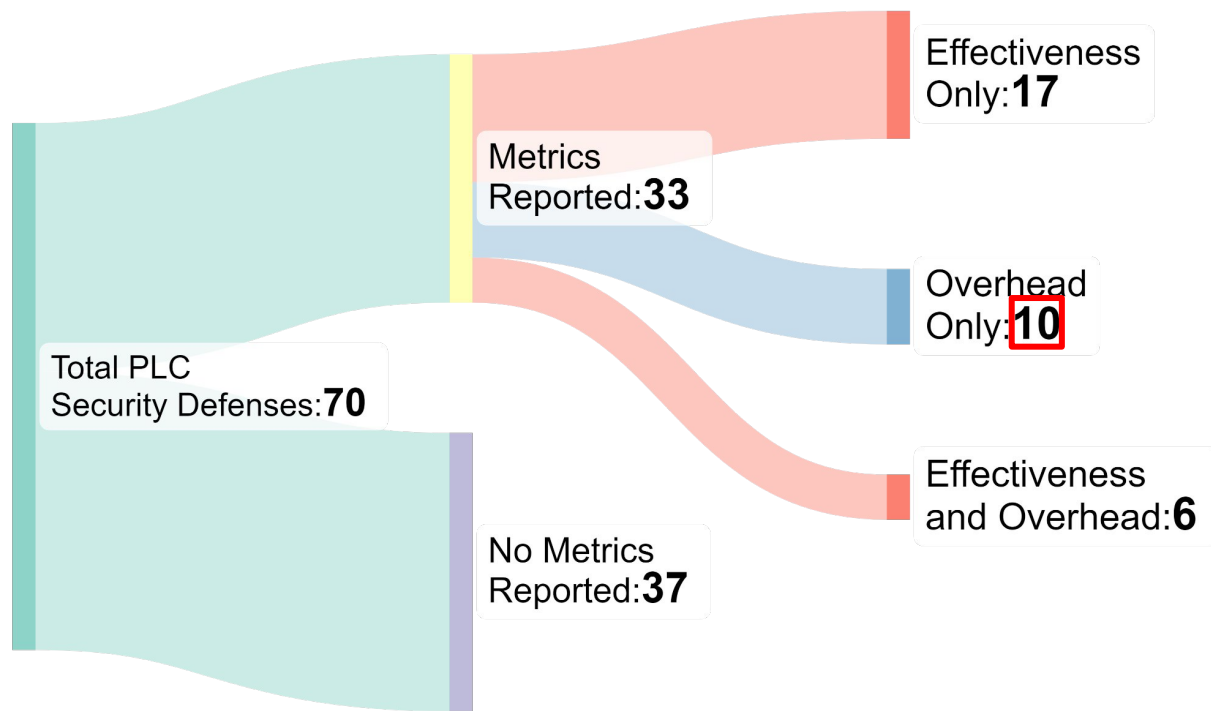
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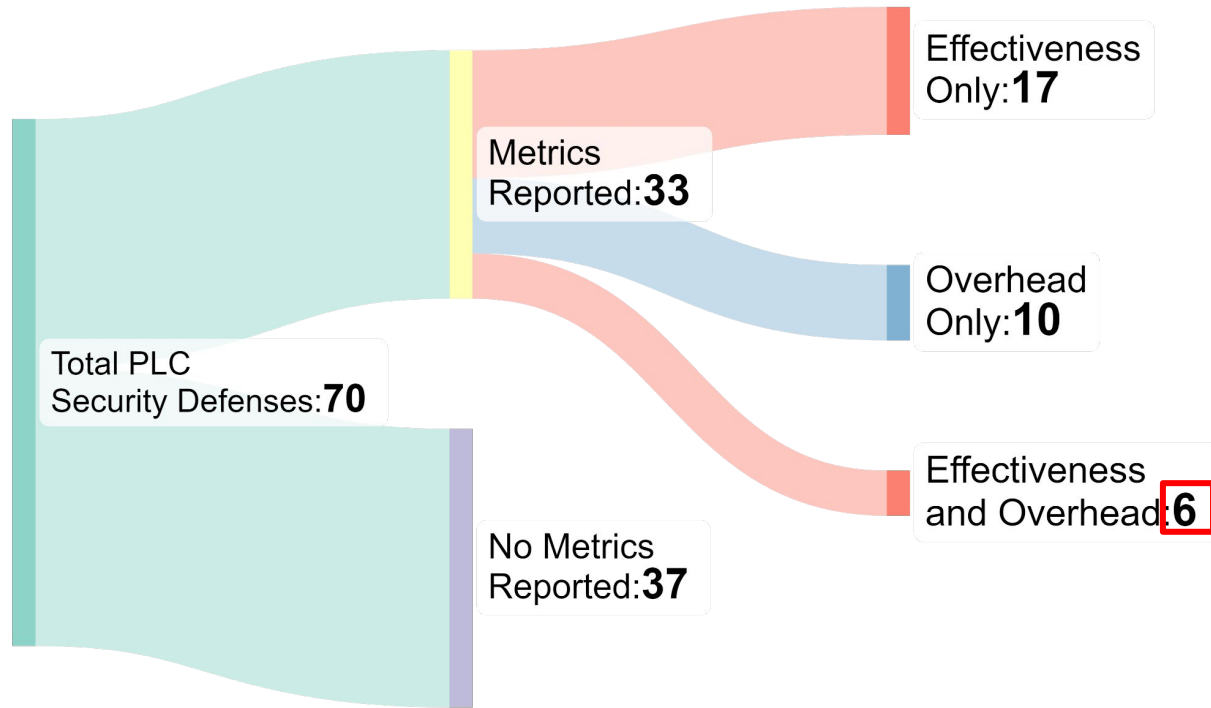
PLC Defenses Reported Metrics (2007-2023)



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PLC Defenses Reported Metrics (2007-2023)



Main Problem:

**Metrics are not being reported
and are not standardized**

Our contribution:

Set of Standard Evaluation Metrics for PLC Defenses

Research Questions

1. What are the key evaluation metrics for PLC Defenses?



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2. What are the challenges in obtaining these evaluation metrics?



Research Questions

1. What are the key evaluation metrics for PLC Defenses?



2. What are the challenges in obtaining these evaluation metrics?



3. How can these challenges be addressed?



How did we select our standard metrics?

Multiple PLC
Architectures



CODESYS

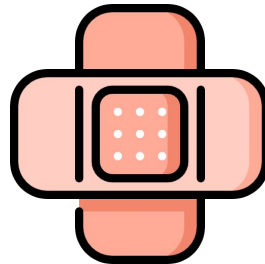
How did we select our standard metrics?

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CODESYS

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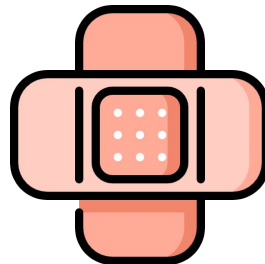
Multiple PLC Defenses



Straightforward



CODESYS



Our Standard Evaluation Metrics



Overhead

Our Standard Evaluation Metrics



Overhead



Security

Our Standard Evaluation Metrics



Overhead



Security



Effectiveness

Our Standard Evaluation Metrics: Overhead



Metric	Unit
Scan Cycle	milliseconds (ms)
Total Runtime Cycles	milliseconds (ms)
CPU Cycles	milliseconds (ms)
Total RAM Usage	Kilobytes (KiB)

Our Standard Evaluation Metrics: Security



Metric	Unit
ROP Gadgets	Integer
Memory Region Ratio (MRR)	Kilobytes (KiB)
Privileged Cycles	milliseconds (ms)

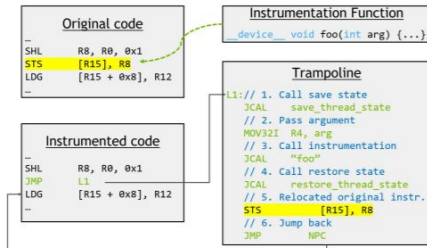
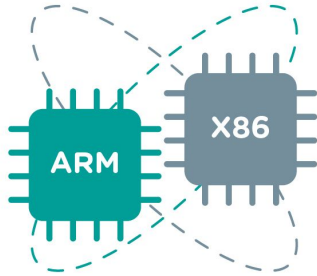
Our Standard Evaluation Metrics: Effectiveness



Metric	Unit
True Positive	Integer
True Negative	Integer
False Positive	Integer
False Negative	Integer
Accuracy	Float

What are the challenges obtaining our evaluation metrics?

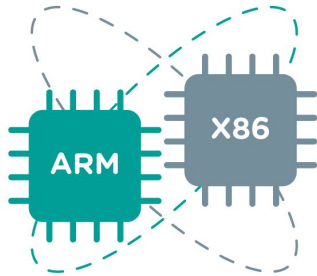
No standard
benchmarking tool



What are the challenges obtaining our evaluation metrics?

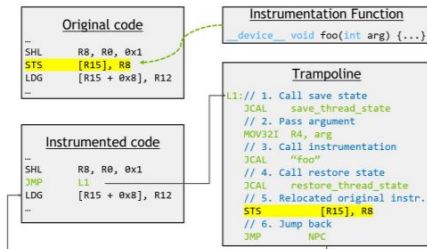
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Proprietary Software
and Hardware



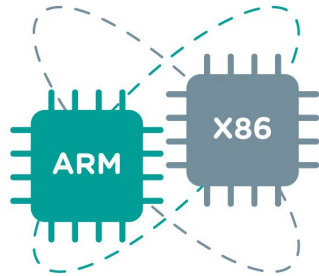
SIEMENS

**Rockwell
Automation**



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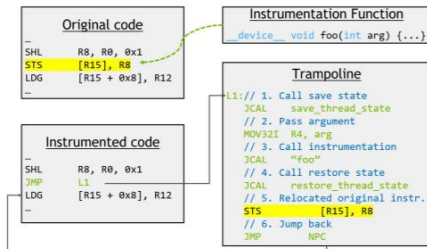
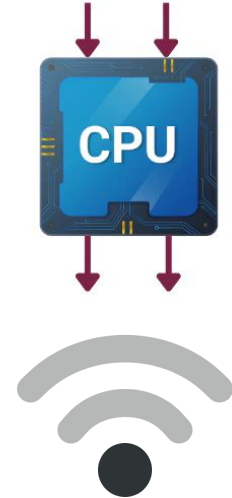


Proprietary Software and Hardware

SIEMENS

Rockwell Automation

Different Environmental Conditions



Recommendation 1: Leverage existing tools

Benchmarking

arm Developer

OPENPLC 
TO A MORE
OPEN FUTURE

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Profiling

SIMATIC Controller
Profiling

TIA Portal



CODESYS Profiler

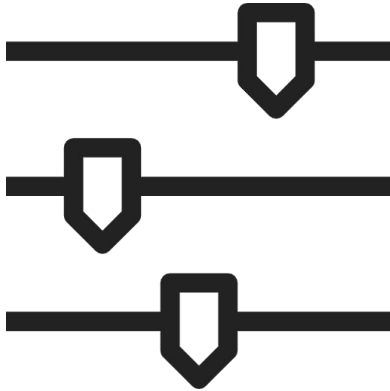
The CODESYS Profiler enables
level.
The CODESYS Profiler is part of

Aktuelle Version: 2.2.0.0
Article no.: 2101000004

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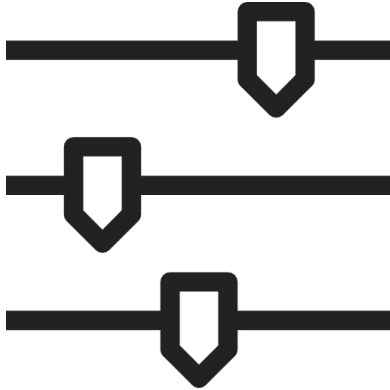
Recommendation 2: Normalize Environment Configuration

Track configuration

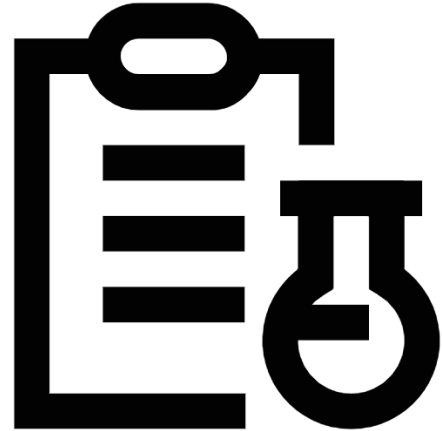


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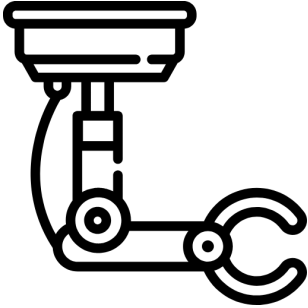
Track configuration



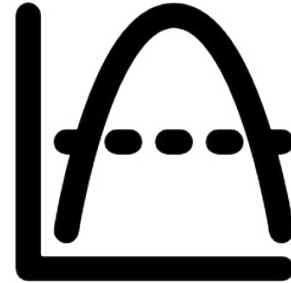
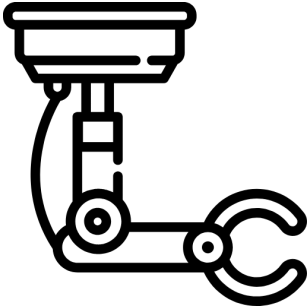
Report in paper



Recommendation 3: Worst-Case Execution Time (WCET)



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WCET over Average

Future Work

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 - How to **automate** it?
 - How many **sub-benchmarks** will such a framework require?
 - What **PLCs** will be **supported**?

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- We proposed a **set of standard evaluation metrics.**
- We **provided recommendations** on how to measure and report these metrics.
- We hope this work will **serve as a starting point** to improve the current state of evaluation metrics for PLC security.

Thank you!

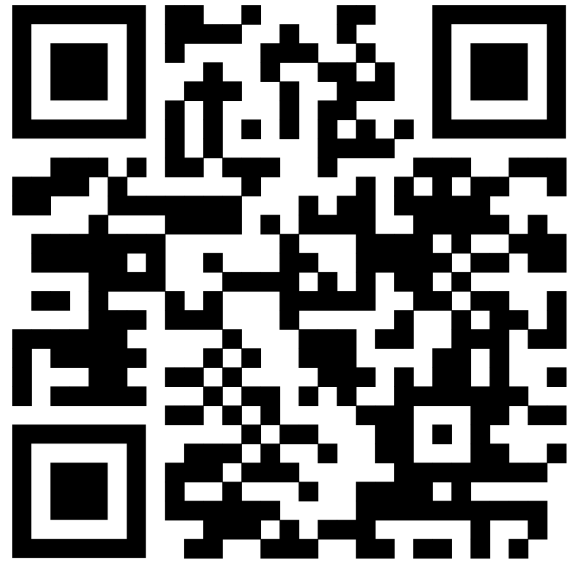
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