Data-Driven Study of Attacks on Cyber-Physical Infrastructure Supporting Large Computing Systems

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Problem

We consider advances in cyber-attacks in the context of indirectness and automation.

- **Indirectness:** an attack that targets an auxiliary CPS that the target computing infrastructure relies on.
- **Automation**: an attack through a self-learning malware to: (i) derive actionable intelligence from data and (ii) launch an attack in the most opportune time

Challenges

- Detect attacks deployed with self-learning malware
- Detect and distinguish attacks from random failures
- Devise and validate the protection mechanisms by using real operational data

Scientific Impact

- Scientifically sound methods to jointly study reliability failures and malicious attacks against a CPS critical for the uninterruptible operation of a large computing infrastructure
- **Demonstration of new advanced attacks** which take advantage of machine learning to develop and execute an attack strategy
- **Define general principles for detecting attacks**, which combines the knowledge of both CPS and the tenant computing infrastructure
- A data-driven simulation testbed that emulates the CPS behavior and enables experimentation with different attack scenarios

Approach Overview

- Stage 1: Collection and analysis of operational data of the CPS and the cyber infrastructure.
- Stage 2: Study innovative ways to make the attack more sophisticated.
- Stage 3: Devise mitigation and detection methods.
- **Stage 4**: Validation and assessment.



Self-learning malware attack scenario



Sample Attack Strategy Simulation



(1)-(3): Initial compromise - access CPS control system/network

- Install and run learning malware (on CPS control server) 4: to infer failure causing anomalies from CPS operational data. Anomalies are used as attack strategies.
- (5), (6): Update malicious control logic containing the attack strategy and its triggering logic to the controller and wait for triggering condition
- ⑦-⑨: Abnormal event injected to the CPS and its impact cascades to the target cyber infrastructure

- Supply water temperature abnormality due to power interruption
- Shortage in cooling capacity for ~1hr

Broader Impact

- Identify potential advances in security threats by demonstrating the feasibility of masquerading a security attack as a reliability failure
- Improve the security of CPSes and provide an effective methodology for in-depth monitoring for improved resiliency
- Application of the proposed approach to CPSes in other domains (e.g., robots, AVs) to eliminate potential security risks

References

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