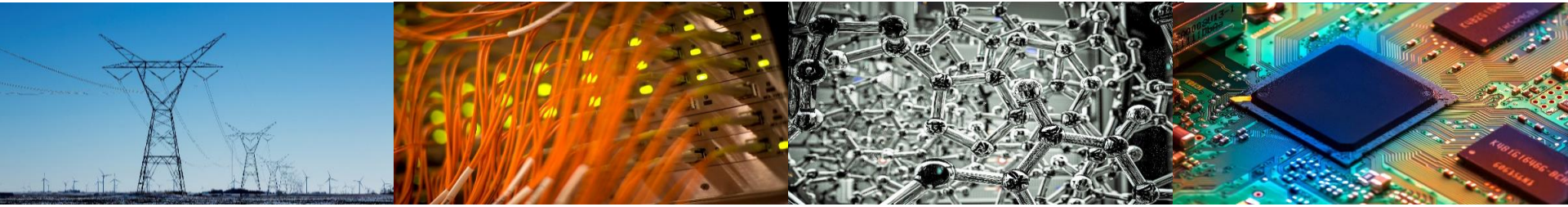


The Threat of AI-Driven Smart Malware

The Case of Availability Attacks on Computing Systems through Alteration of Environmental Control



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Advanced Targeted Attacks => AI-Driven Smart Malware

- *Malicious actors:*
 - Actively learn a target entity's infrastructure and normal behavior/operations and use this knowledge to devise an attack strategy
 - Dedicate an effort to maintain anonymity and stay beyond the radar of security monitoring system
 - Highly sophisticated - expertise in a target system/infrastructure
 - Patient in preparing and executing attack strategy, i.e., malicious activities may span a long time
 - Agile to work around victim's defenses

- *What Changed in Recent Years?*
 - Targeted Attacks evolved as a highly evasive attacks powered by artificial intelligence (AI) -> **AI-Driven Smart Malware**

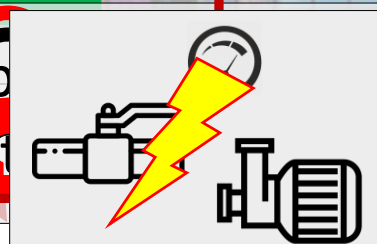
Operational risk for large computing infrastructure are telepresence targets for adversaries

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- **Outages** in large computing infrastructure are telepresence targets for adversaries
e.g., ~ \$9,000/min (Emergency response)
- **Multiple factors** can trigger outages
e.g., hardware/software failures



CPS plays a critical role in keeping such infrastructure available
Human error, control failure, human errors



UPS failure in UK data center grounded 75K passengers. Loss of \$106M (2017)

Cooling failure in MS data center resulted in 21hrs outage (2018)

Smart Malware to Bring Down Computing Enterprise

- **Indirect attack**

- An attacker exploits *relatively weak security* of a CPS that manages the environment in which a major computing enterprise (e.g., HPC system or cloud infrastructure) operates
- CPS is often *outside the monitoring range* of security monitoring deployed in the computing infrastructure

- **Stealthy attack**

- Intruders *masquerade an attack as an accidental failure* in the CPS to mislead operators
- Attackers may *remain long time in the CPS* without being noticed

- **Smart malware**

- *Dynamically infer* (based on CPS operational data) attack strategies that mimic behavior corresponding to an accidental failure in the CPS

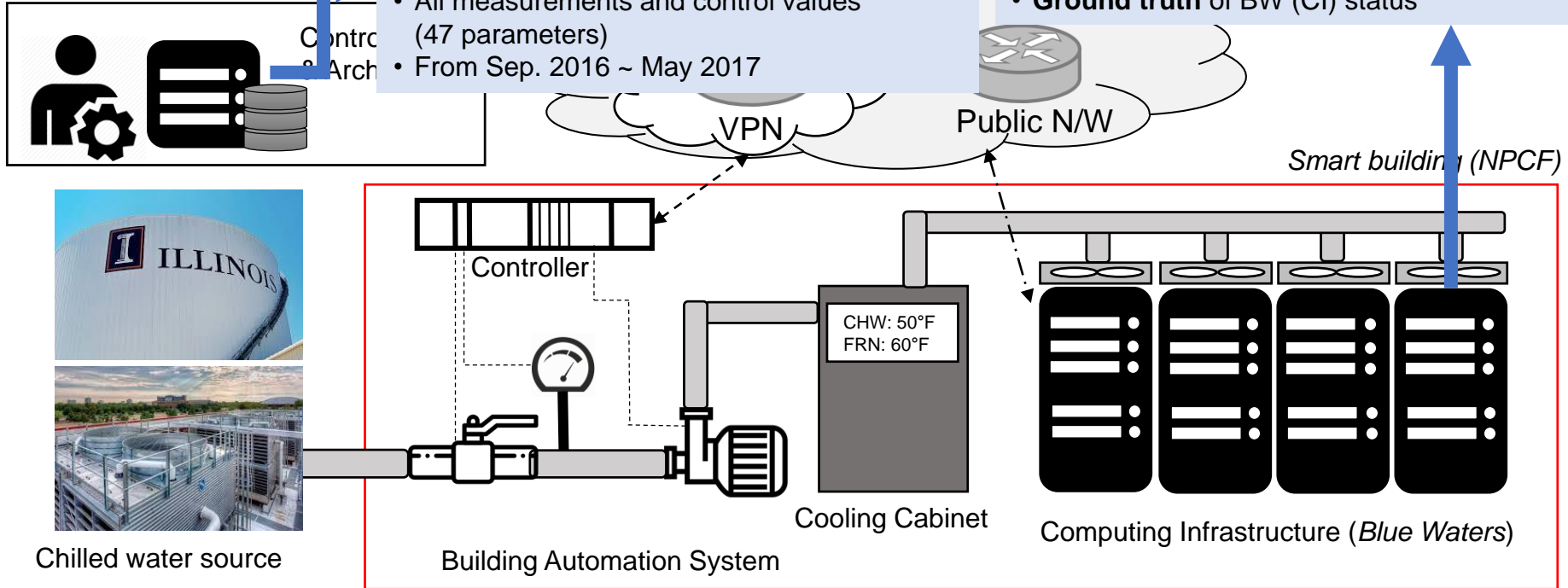
System & Data Overview

CPS operational data set:

- For **analysis of CPS operation** and **inference of failure related information**
- All measurements and control values (47 parameters)
- From Sep. 2016 ~ May 2017

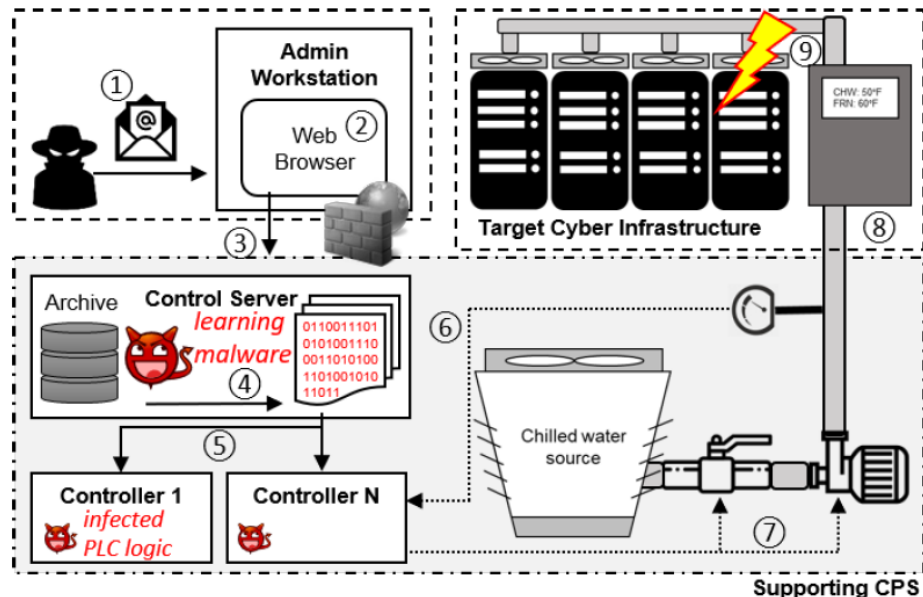
Blue Waters Incident reports:

- For **verification** of the prediction/inference (not available to attackers/malware)
- **Ground truth** of BW (CI) status



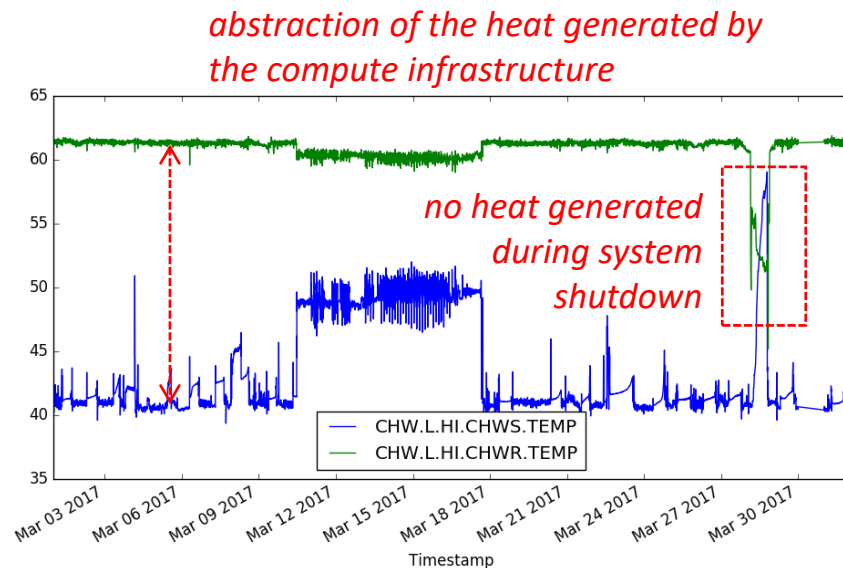
Smart Malware Approach

- *Steps 1 – 3*: initial compromise and establishment of a foothold in the target (up to installation)
- *Step 4*: cyclic sequence of procedures in reconnaissance and customization.
- *Step 5*: lateral movement into the physical control layer of the CPS
- *Step 6*: collection of information to evaluate the triggering condition
- *Steps 7 – 9*: acting on objective



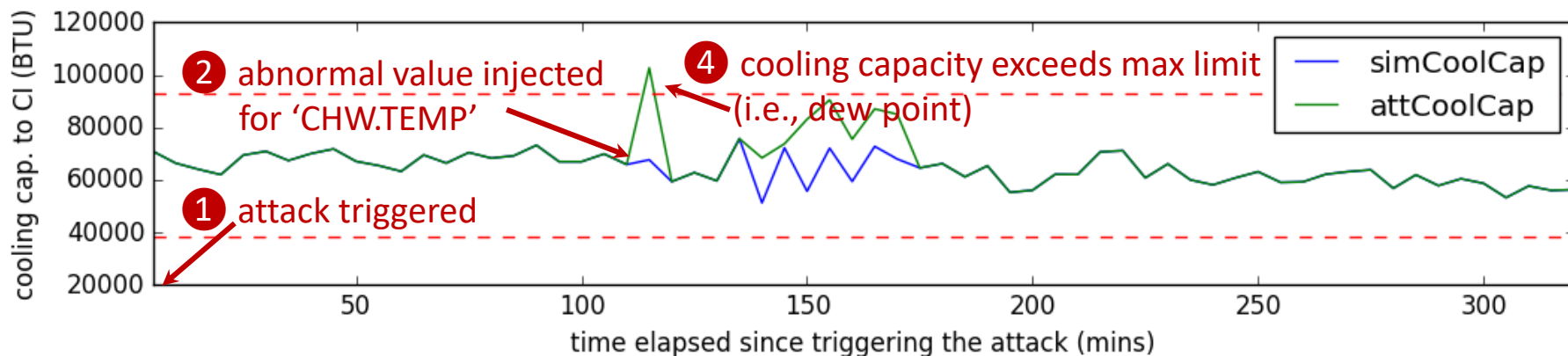
Filtration of Failure Data (Step B)

- Attacker wants to *masquerade* an attack as an accidental failure
- Needs data on computing infrastructure (CI) failures and corresponding CPS events
- But! **No knowledge on CI status only CPS data**
- **Observation:**
Chilled water return temperature constant
Nadirs indicate *less heat absorbed from CI*



Attack Strategies Simulated

- **Smart malware inferred three CI outage-related strategies from CPS data**
 - Supply water **temperature abnormality** due to power interruption
 - **Chilled water loop closure** for building maintenance operation
 - **Reduced cooling capacity** for emergency outage in computing infrastructure



- 3) In response to the fake increase in temperature, CPS-simulator increases flow (i.e., opens the valves)

Conclusions

- Self-learning Smart Malware no longer a remote possibility
 - Its success depends on the availability of the data
- Presented example of **smart malware** (smart building)
 - Generalizable to other systems that employ similar design & architecture
 - Strategies not hard-coded into malware – dynamically derived from data
- Protection against smart malware:
 - ***Supervised-learning driven detectors***
 - take advantage of knowledge on the runtime status of the control infrastructure and details of the CPS available to the operators
 - ***Multi-layered monitoring***: deploy monitors in the physical layer in addition to the cyber layer (e.g., dedicated IDS)

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