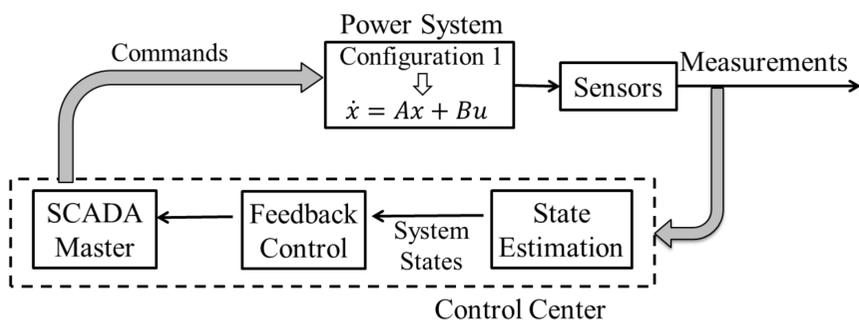


## GOALS

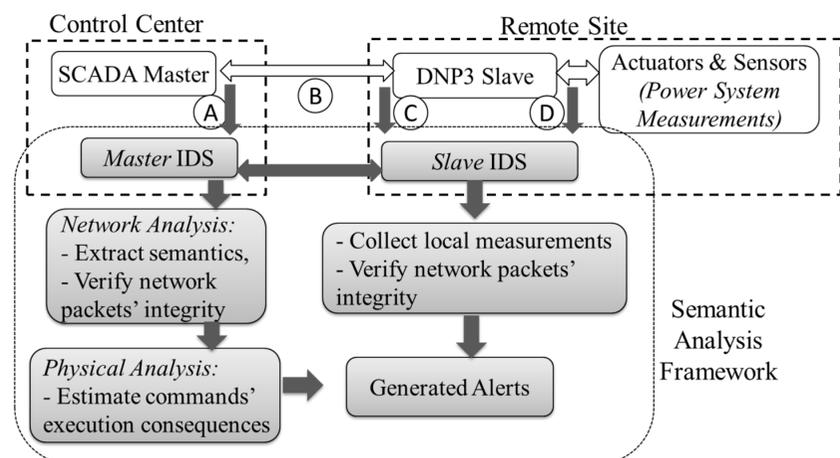
- Overall:
  - Detect control-related attacks that modify a power grid's physical configurations without exhibiting obvious network anomalies.
  - Combine system knowledge of both cyber and physical infrastructure in power grids to estimate the execution consequences of maliciously crafted control commands.
- Specifically:
  - Augment Bro IDS with DNP3 analyzer to monitor control commands and measurement data exchanged between SCADA master and substations.
  - Achieve rapid detections by adapting power flow analysis algorithm based on the observed control commands.

## FUNDAMENTAL QUESTIONS/CHALLENGES

- A sophisticated attacker can exploit system vulnerabilities and use seemingly legitimate commands to cause a wide range of system changes.
- The attack modifies the power system's open loop configurations.
  - System's steady states can be significantly changed.
  - System operator can lose control over some system states.
  - Measurements related to some states can become unobservable.



## RESEARCH PLAN



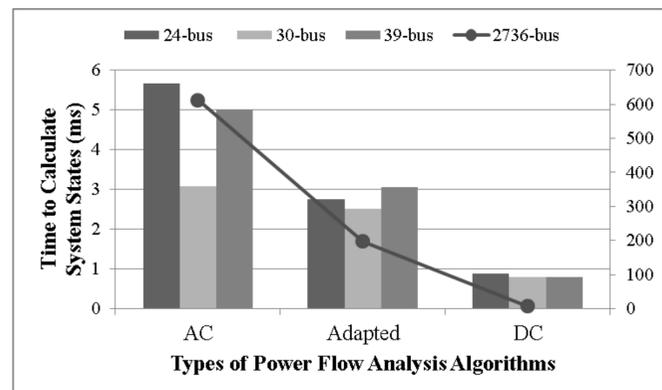
- Master IDS at the control center:
  - Distinguish critical commands from noncritical ones.
  - Collect measurements from multiple substations.
  - Include state estimation & contingency analysis components to estimate consequences of executing a given command.
- Slave IDS at the remote site.
  - Use local IDS to obtain trusted measurements directly from sensors.
    - Assume that concurrent physical tampering with a large number of distributed sensors is not practical for the attacker.
  - Validate absence of corrupted measurements at other locations.
- Adapt the parameters of the iterative algorithm, e.g., Newton-Raphson algorithm, used in power flow analysis.
  - As an *initial* solution, when a malicious command is issued, use the most recent known system state.
  - The *convergence threshold* is set such that the estimated system state is accurate.
  - Change the *number of iterations* to calculate system states for different control commands.

## RESEARCH RESULTS

- Compare the detection accuracies of the adapted algorithm ("Adapted") and the DC power flow analysis ("DC").
  - False negative (FN) rate is around 0.01%; false positive rate is 0.78% at most.

|         |    | 24-bus               | 30-bus               | 39-bus               | 2736-bus             |
|---------|----|----------------------|----------------------|----------------------|----------------------|
| Adapted | FP | $4.9 \times 10^{-6}$ | $7.8 \times 10^{-3}$ | 0                    | 0                    |
|         | FN | $1.2 \times 10^{-4}$ | $1.3 \times 10^{-4}$ | $1.2 \times 10^{-4}$ | $4.8 \times 10^{-6}$ |
| DC      | FP | 0.076                | 0.026                | 0.067                | 0.053                |
|         | FN | 0.013                | 0.20                 | 0.003                | 0.019                |

- Compare the execution time by using three different algorithms: the classical AC power flow analysis ("AC"), the adapted algorithm ("Adapted"), and the DC power flow analysis ("DC").
  - With the help of the adapted algorithm, the detection latency is reduced as much as 60%.



## BROADER IMPACT

- The adapted power flow analysis algorithm significantly reduces the detection latency.
  - The semantic analysis does not inject network traffic or modify normal operation of the power grid.
  - The semantic analysis can be extended to support appropriate remediation mechanisms to prevent physical damage from the attack.
  - The method and implementation of semantic analysis can be extended to other industrial control environments.
- The implemented network IDS can be equipped with other scenario-specific policies in different operational contexts.

## INTERACTION WITH OTHER PROJECTS

- Collaborate with International Computer Science Institute (ICSI) and the University of Illinois' National Center for Supercomputing Applications (NCSA).
  - The extension made on Bro to support the DNP3 protocol is included in Bro's current source code release (version 2.2).
  - New NSF award is being used to support further work.
- Collaborate with Ameren Technology Application Center (TAC).
  - Use Bro's DNP3 analyzer to analyze traffic data collected from real substations.
  - Develop appropriate security policies to deploy in the utility.

## FUTURE EFFORTS

- Study possible response mechanisms to attacks.
  - Exploit protection mechanisms for transient faults (e.g., the reclosing logic) deployed in intelligent relays as intrusion response mechanisms.
- Exploit control-theoretic approach to quantitatively study the impact of control-related attacks.

## SELECTED PUBLICATIONS

- Hui Lin, Adam Slagell, Zbigniew Kalbarczyk, Peter Sauer, and Ravishankar Iyer. "Semantic Security Analysis of SCADA Networks to Detect Malicious Control Commands in Power Grids." In *Proceedings of Smart Energy Grid Security Workshop, SEGWS 2013*.
- Hui Lin, Adam Slagell, Catello Di Martino, Zbigniew Kalbarczyk, and Ravishankar K. Iyer. "Adapting Bro into SCADA: Building a Specification-based Intrusion Detection System for the DNP3 Protocol." In *Proceedings of 8th Annual Cyber Security and Information Intelligence Research Workshop, CSIIRW 2012*. Top Three Paper Award.