

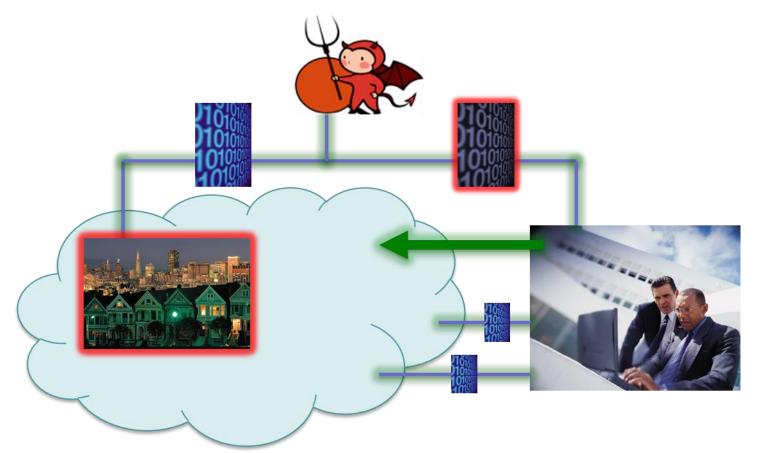
Security and Robustness Evaluation and Enhancement of Power System Applications:

Malicious Data Detection in State Estimation Leveraging System Losses & Estimation of Perturbed Parameters

Miao Lu, William Niemira, Rakesh B. Bobba, Peter Sauer, and William H. Sanders

GOALS

Reliable detection of bad data injection attacks that are potentially undetectable by conventional methods.



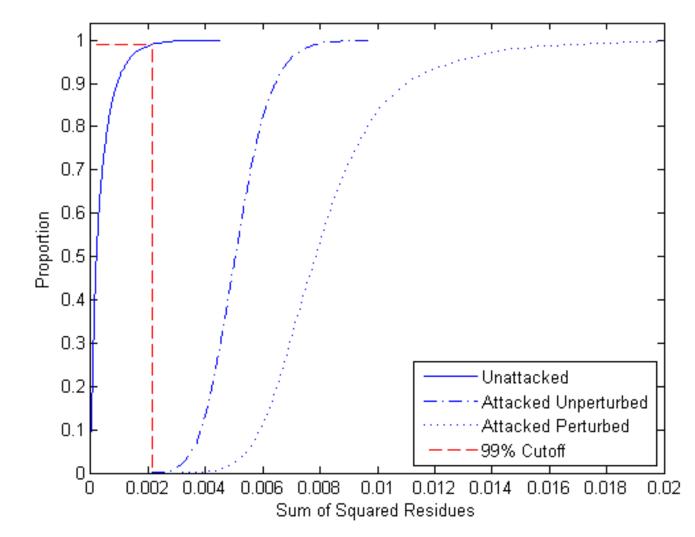
Improved understanding of full taxonomy of attacks that now are potentially undetectable by conventional methods.

FUNDAMENTAL QUESTIONS/CHALLENGES

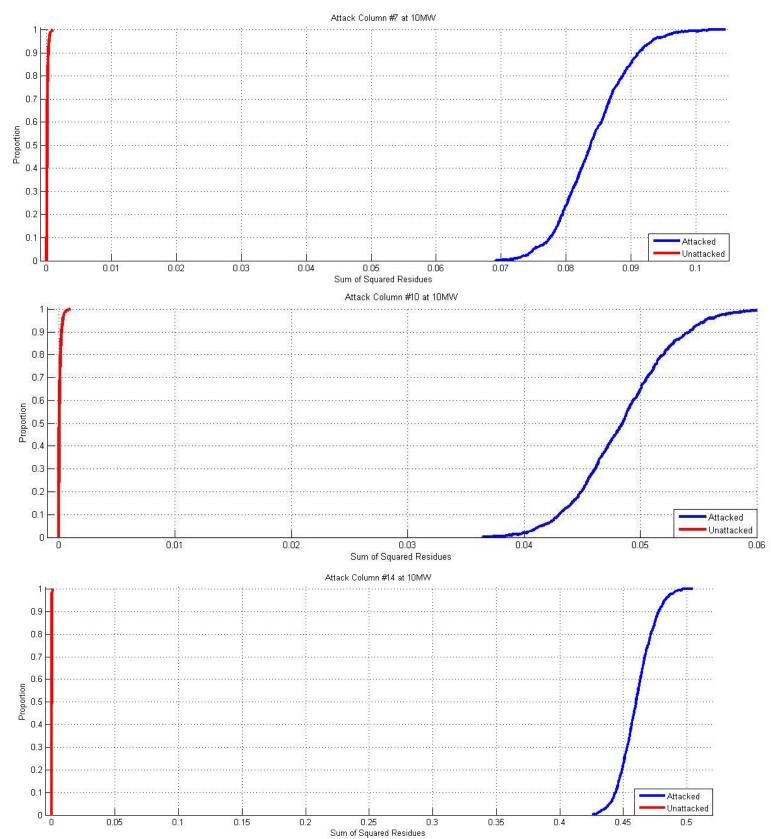
- For attacks using a DC model, can the approximations made by the attacker be leveraged for detection?

RESEARCH RESULTS (CONTINUED)

• Residual of estimated parameters (line reactance) alone turned out to be a decent indicator of attacks, especially at higher attack energy levels.



• Perturbation of parameters shifted the CDF further to the right, improving detectability.



- Can topology perturbation in combination with parameter estimation enhance the detectability of malicious data injection attacks?
- How can one further enhance the detection and localization of malicious data injection attacks?

RESEARCH PLAN

- Analyze the sensitivities of specific power system quantities to attacks and study their potential as indicators of attacks.
- Study the viability of parameter estimation along with topology \bullet (parameter) estimation as a means of detecting data injection attacks.
- Incorporate PMUs to further improve detectability.

RESEARCH RESULTS

• Tested 140 linear data injection attacks against the IEEE 14-bus system and observed residuals for different measurement types.

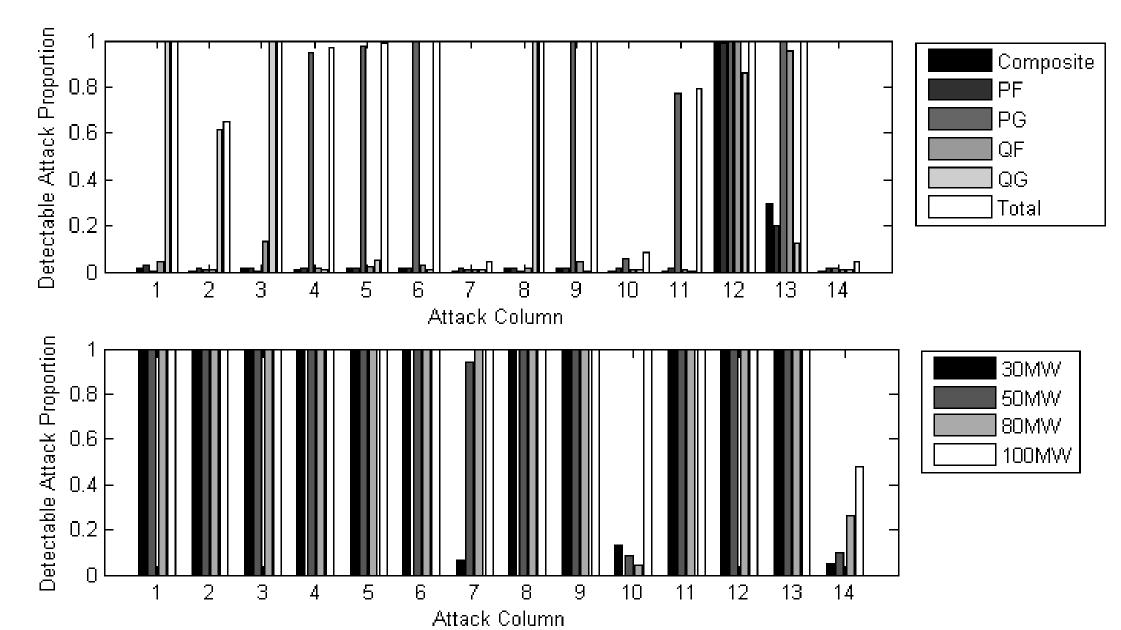
Residual Type	Attacks Detected
Weighted Composite	2
Real Power Flows	8
Real Power Injections	60
Reactive Power Flows	17
Reactive Power Injections	53

- A combined total of 113 out of 140 attacks (~81% of attacks) were
- Through incorporation of PMU measurements, attack detectability has been further enhanced through use of residues of phase angle differences.
- At the 10MW attack level, attacks in columns 7, 10, and 14 were detected.
- Attacks can be localized at locations where PMUs have been installed.

BROADER IMPACT AND PROJECT INTERACTION

This work indicates that conventional bad-data detection methods in

detected by the residual of the real and reactive power injections.



- The grouped bars indicate the total proportion of each attack column type detected at 30MW, 50MW, 80MW, and 100MW attack levels for the IEEE 14-bus system.
- At the 10MW level, 11 out of 14 injection attacks were detected.

EMS can be augmented to detect DC model-based false data injection attacks.

• The work also provides another meaningful application of PMUs.

FUTURE EFFORTS

- Further investigate the attacks that are difficult to detect for larger bus systems, and identify ways to detect them.
- Locate the specific measurements that are being attacked if malicious data appear.
- Provide optimum location for PMU placements to further improve the detection of malicious data injection attacks.

RELATED PUBLICATIONS

- W. Niemira, R. B. Bobba, P. Sauer, and W. H. Sanders. "Malicious Data Detection in State Estimation Leveraging System Losses & Estimation of Perturbed Parameters." IEEE SmartGridComm 2013.
- K. R. Davis, K. L. Morrow, R. Bobba, E. Heine. "Power Flow Cyber Attacks and Perturbation-Based Defense." IEEE SmartGridComm 2012.
- Andre Teixeira, Gyorgy Dan, Henrik Sandberg, Robin Berthier, Rakesh Bobba, and Alfonso Valdes. "Security of Smart Distribution Grids: Data Integrity Attacks on Integrated Volt/VAR Control and Countermeasures." American Control Conference 2014.

TRUSTWORTHY CYBER INFRASTRUCTURE FOR THE POWER GRID | TCIPG.ORG UNIVERSITY OF ILLINOIS | DARTMOUTH COLLEGE | UC DAVIS | WASHINGTON STATE UNIVERSITY FUNDING SUPPORT PROVIDED BY DOE-OE AND DHS S&T