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# Towards Attack Resilient Data Analytics for Power Grid Operations

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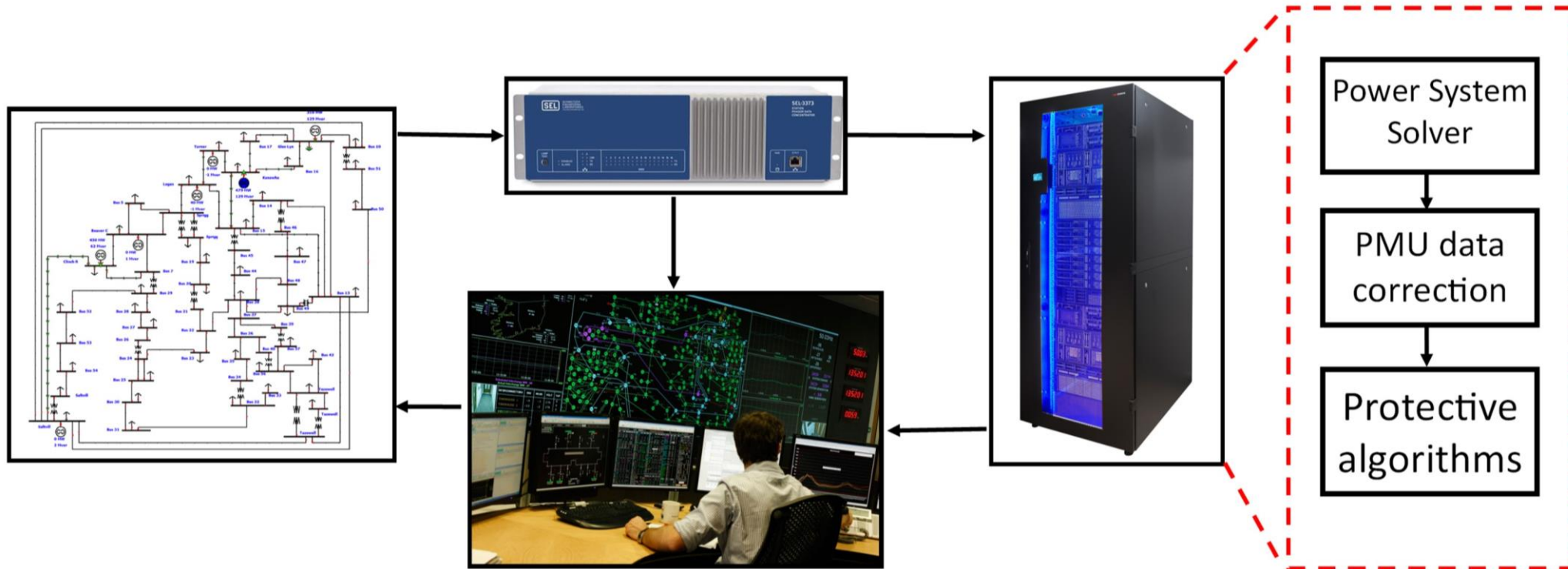
## Motivation

- Modernizing power grid
- Bad data = bad decisions
- Blackouts
- Why GPS attacks?

# Project Description

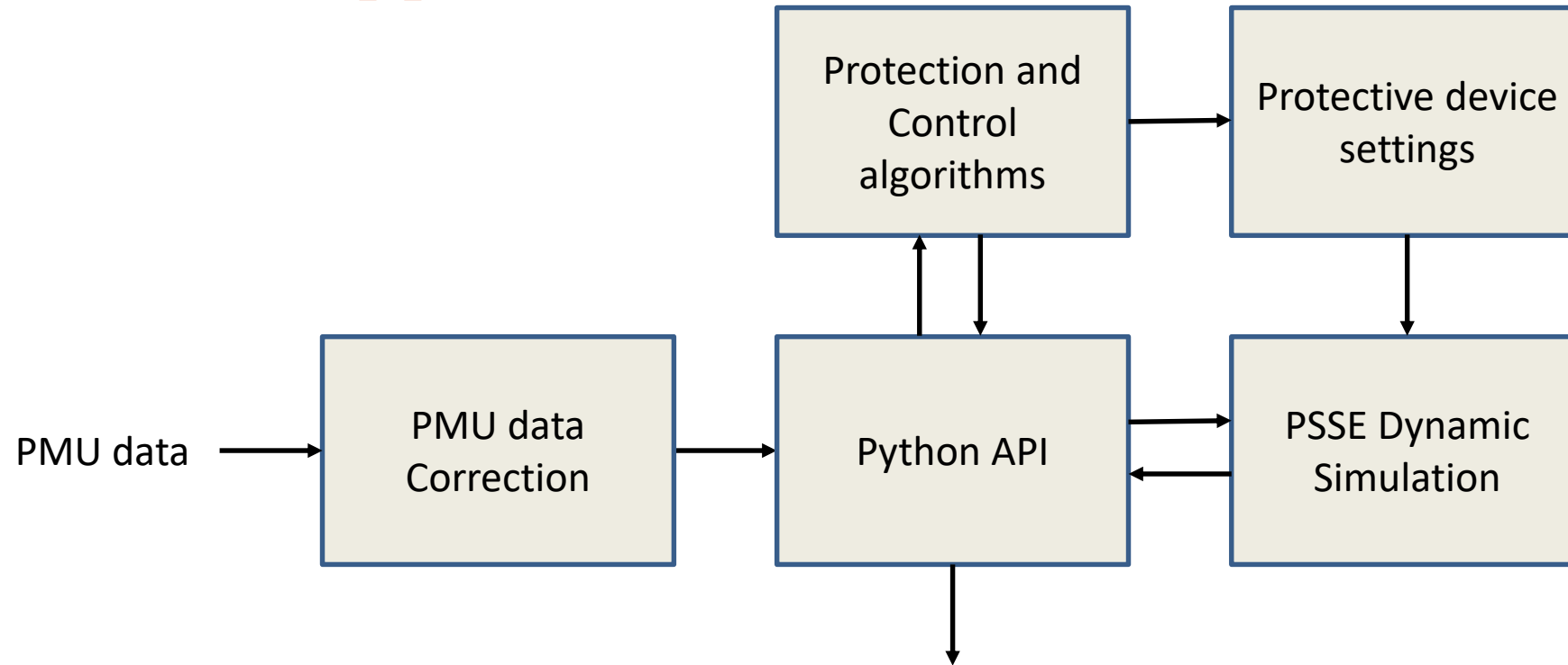


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# Overview of Approach



## Control Actions:

- Update relay settings
- Load shedding
- Line/Generator disconnect



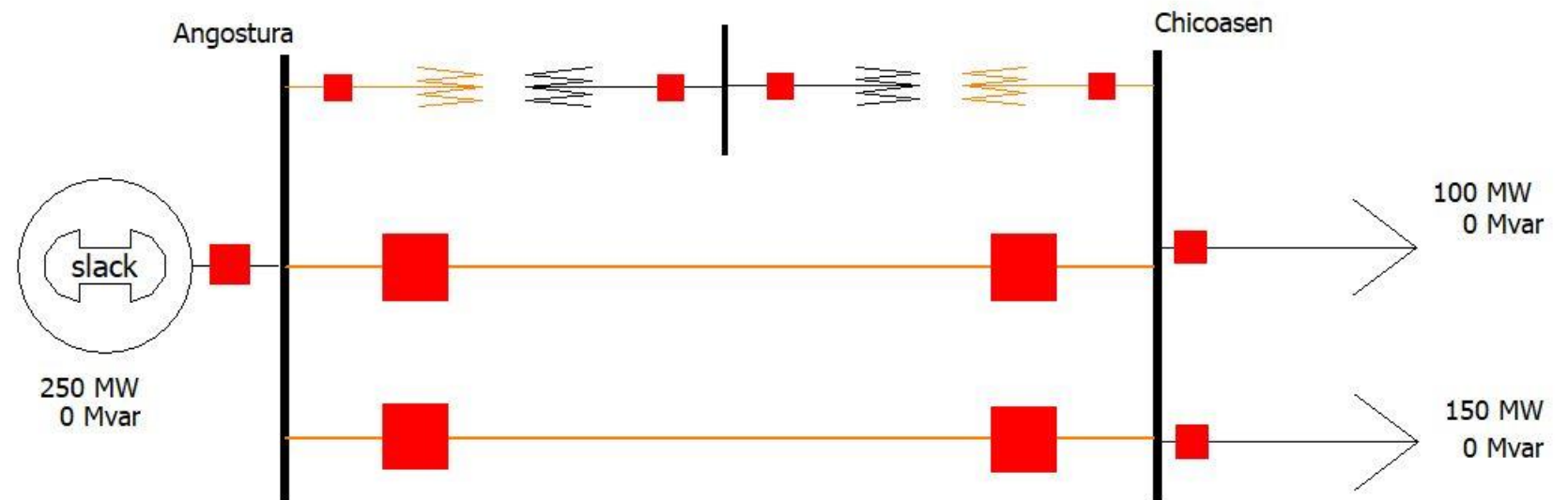
## Realistic attacks on PMU devices

- Removing from service
- Hacking PMU to PDC connection
- GPS Jamming
- Spoofing



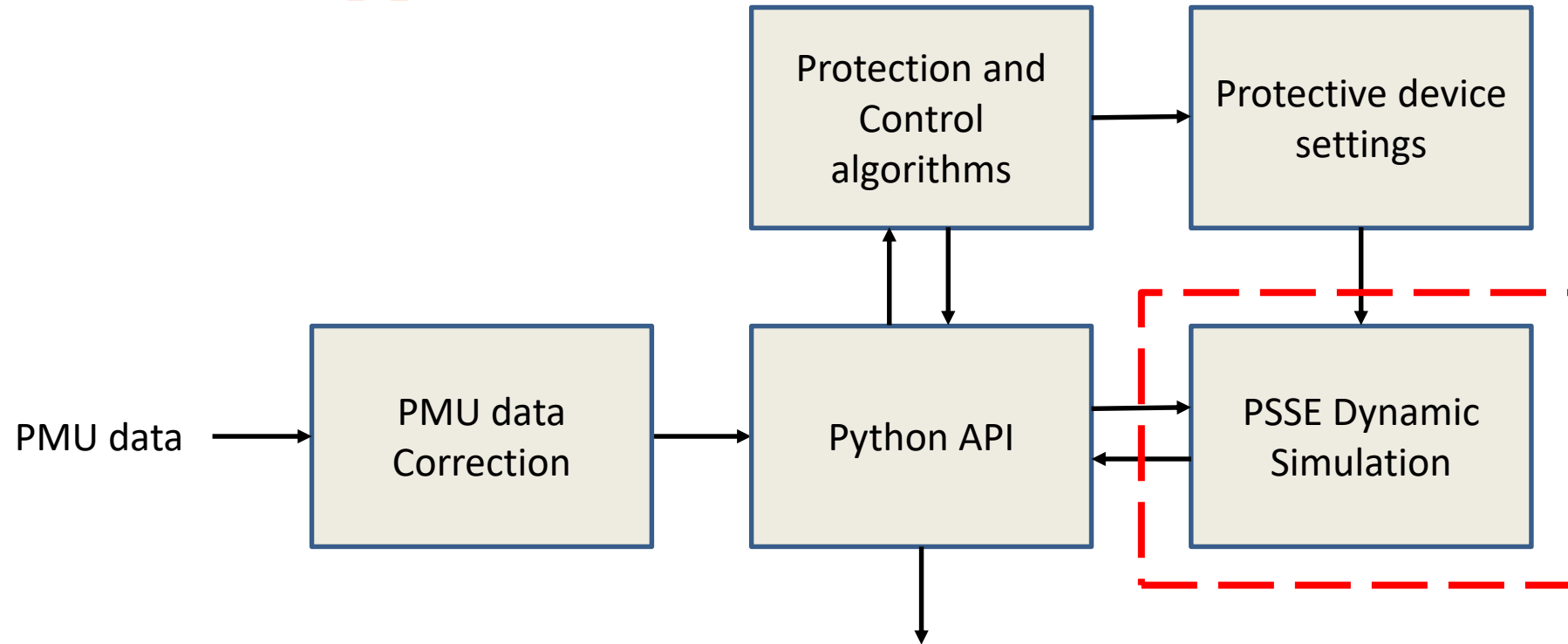
## Case Study: Chicoasen-Angostura transmission line

- Carry away clock
- If PMU data goes through PDC, max error is 200 ms





# Overview of Approach



## Control Actions:

- Update relay settings
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- Line/Generator disconnect



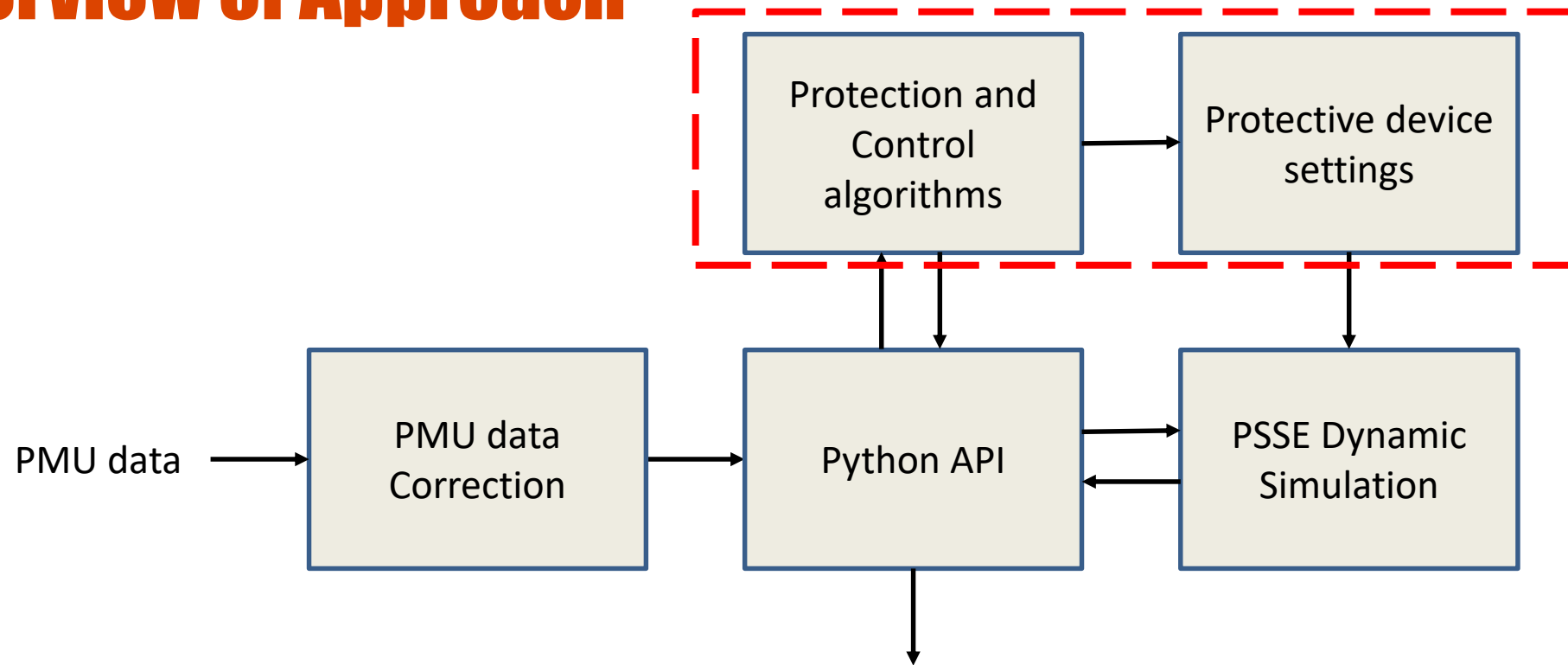
## PSS®E Simulation

- RTS 1996
- Creating a realistic power grid
  - Primarily based on BPA recommendations and current grid operations
  - Implementing an angle change attack





# Overview of Approach



## Control Actions:

- Update protection settings
- Load shedding
- Line/Generator disconnect



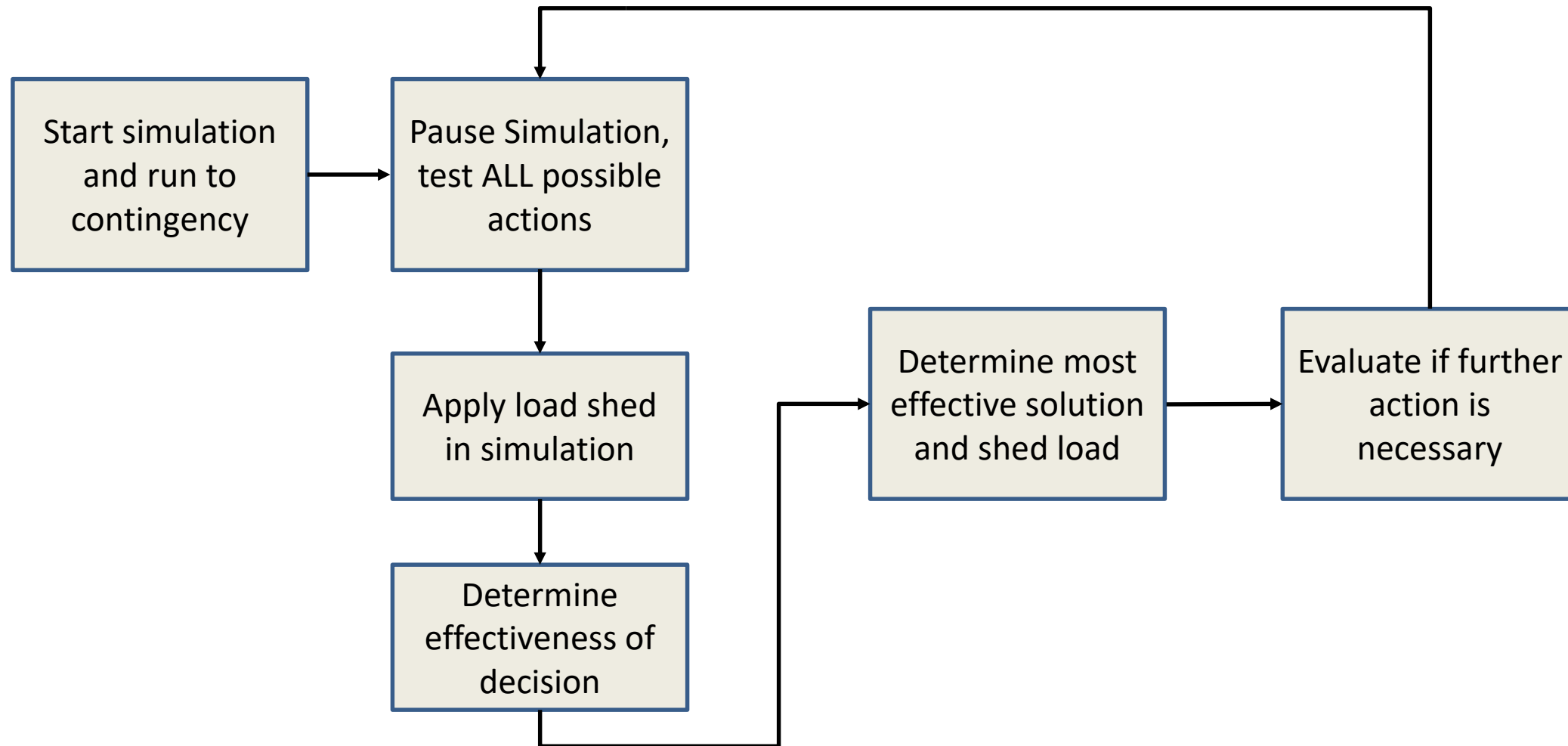
## Simulation - Protective devices

- Overcurrent relay
- Frequency/voltage relay
- Distance relay
- Volts/Hertz relay
- Load shedding relay
- No differential relay in PSSE

Devices	Count	Protective devices (typ)	Protective device (sim)	
Buses	73	2	0	0
Loads	51	2	1	51
Generators	99	2	5	495
Branches	105	3	2	210
Transformers	16	3	1	16
Total				772



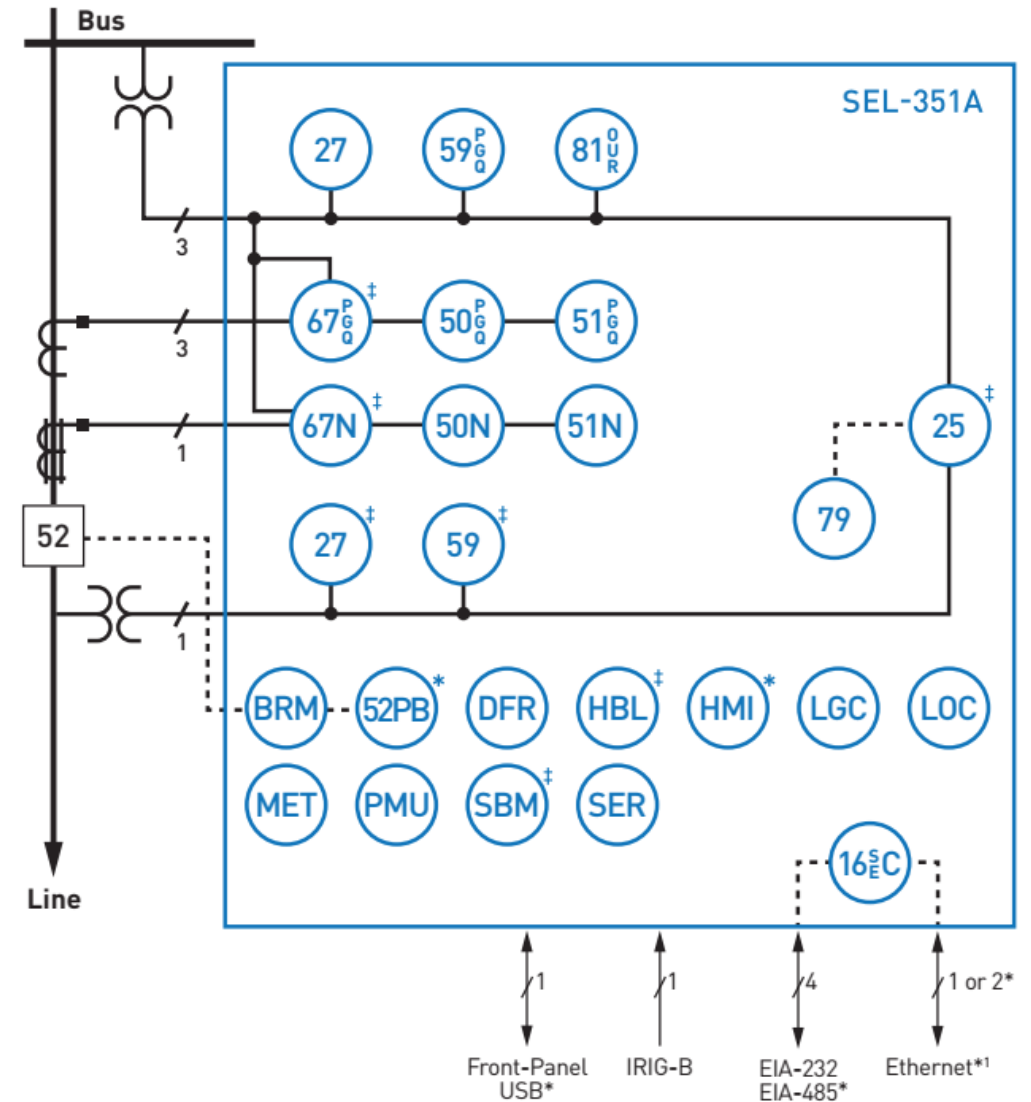
# Simulation – Rollout Policy





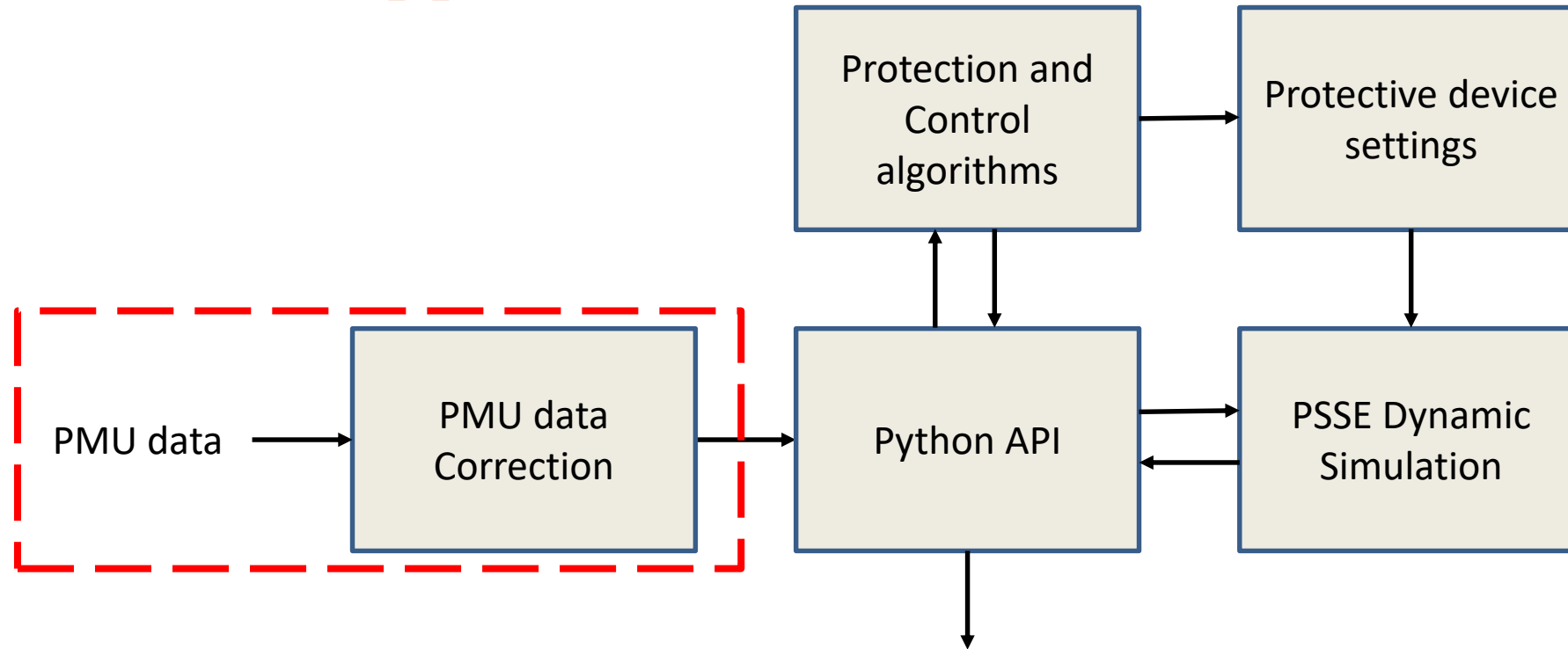
# Connection to real devices

- PMUs and relays
- Six settings groups
- USB, Ethernet, Serial





# Overview of Approach



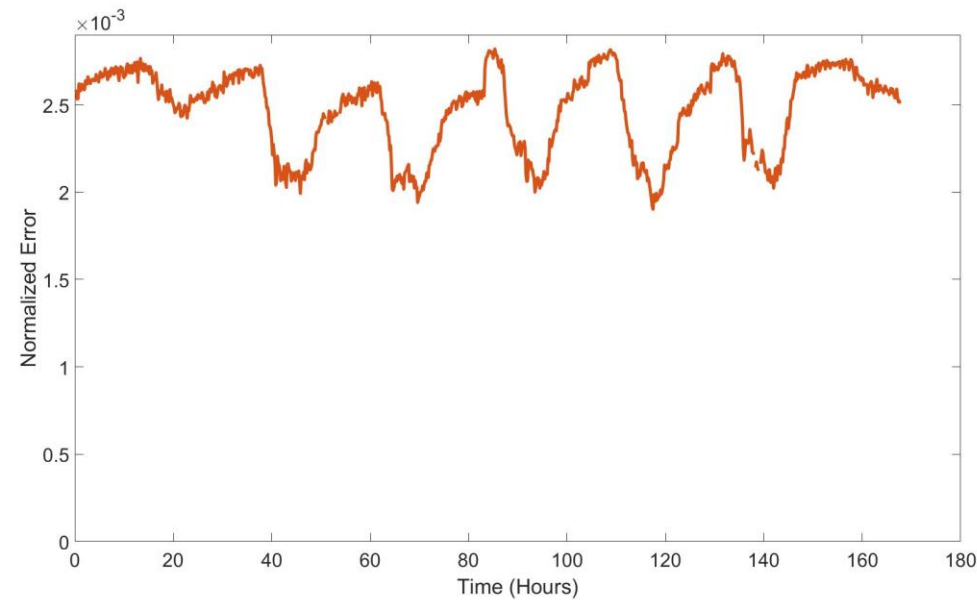
## Control Actions:

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## Motivation

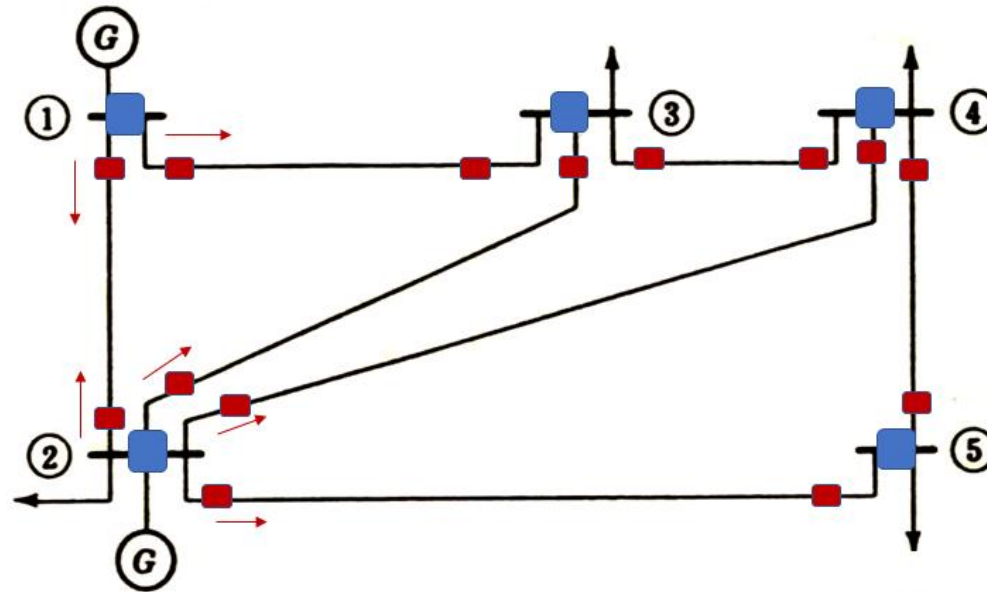
- Observing a low dimensional subspace for real time PMU data





## Motivation Contd.

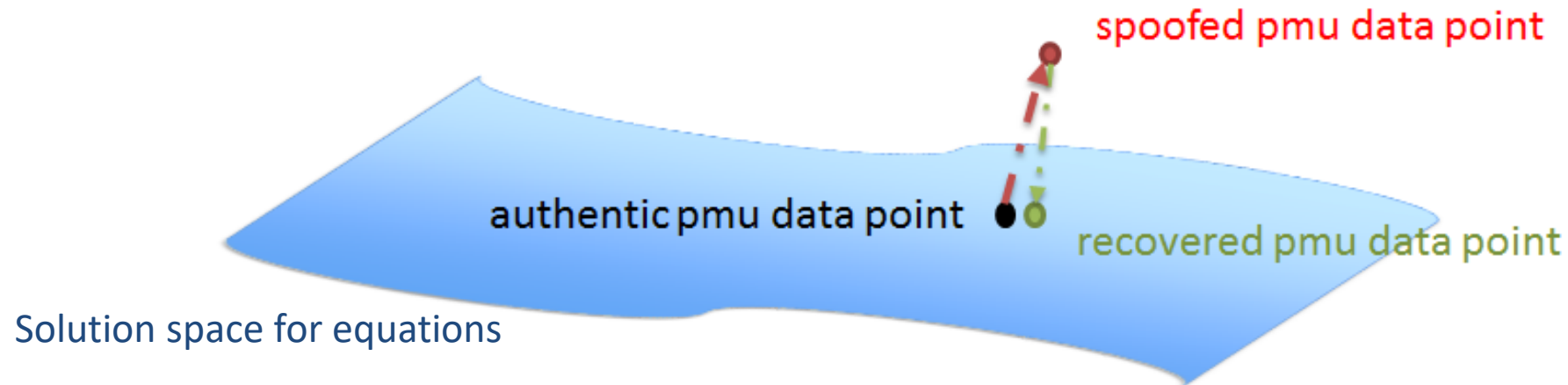
- Measurements collected from the power network are constrained by Kirchoff laws.





## High-level Idea

- Use the knowledge of the solution space to detect and mitigate the effect of data attacks







## PMU Measurement model

- Voltage phasor and outgoing power flow measurements collected from sparsely deployed PMUs

$$y = h(\theta) + e + a$$

$y$  = PMU measurement vector

$\theta$  = State vector

$a$  = Attack vector

$h(\cdot)$  = Nonlinear measurement function

$e$  = Gaussian random noise vector



## SCADA Measurement model

- Outgoing power flow and power injection measurements collected from a **trustworthy** set of SCADA meters

$$b = g(\theta) + e$$

$b$  = SCADA measurement vector

$g(\cdot)$  = Nonlinear measurement function

$\theta$  = State vector

$e$  = Gaussian random noise



## Data Correction Approach

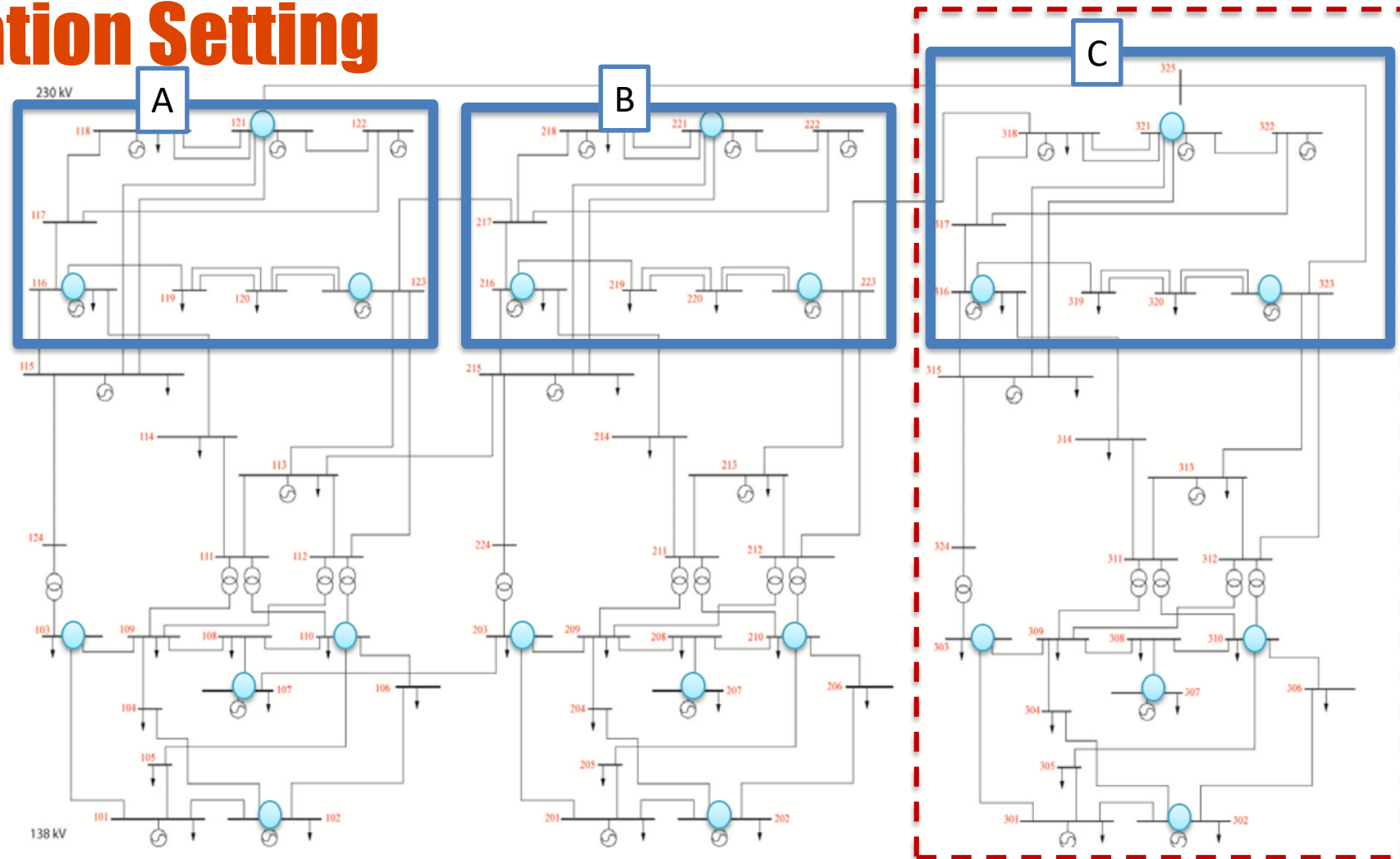
- Leverage both PMU and SCADA measurements

$$\theta^* = \operatorname{argmin}_{\theta} \left\| \begin{bmatrix} y \\ b \end{bmatrix} - \begin{bmatrix} h(\theta) \\ g(\theta) \end{bmatrix} \right\|_2$$

$$\hat{y} = h(\theta^*)$$

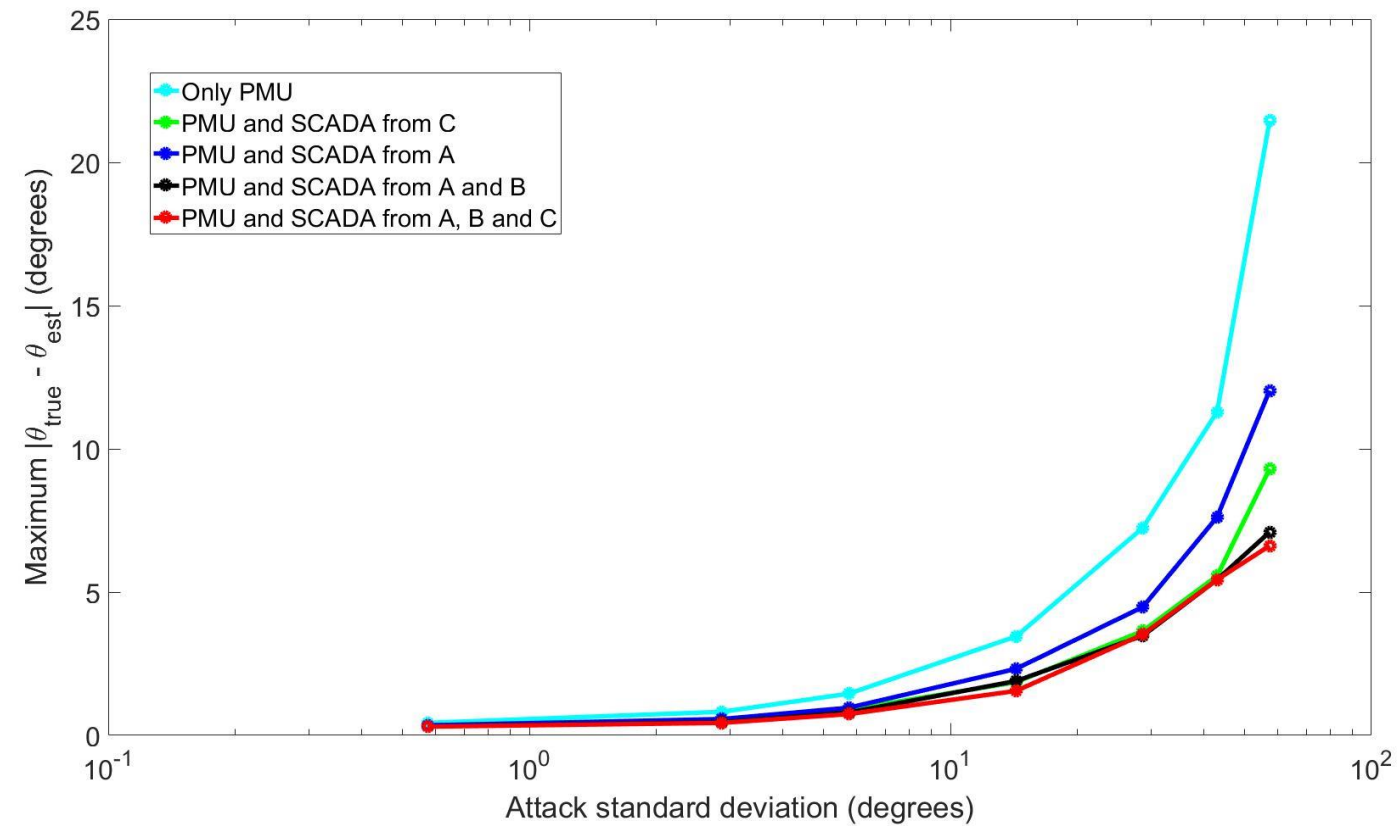


# Simulation Setting





# Simulation Results





## Future Steps

- Validate protection settings
- Integrated framework



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# Questions