

## Synchrophasor Data Analytics

# Linear State Estimation Using Phasor Measurement Unit Data

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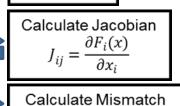
- What is a Linear State Estimator (LSE)?
- Observability
- Leveraging Redundancy: PJM's Observable and Measureable Substations
- PJM's Implementation of the Linear State Estimator Algorithm
- Lessons Learned & Engaging with our Transmission Owners
- Plans for the Future



### What is a Linear State Estimator?

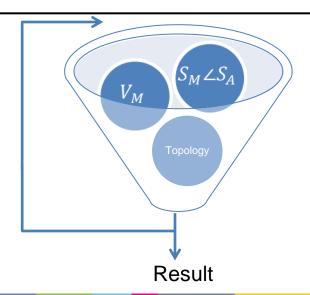
### Non-Linear State Estimation

Calculate  $x_n$ 



Calculate Mismatch  $f(x_{n+1}) = f(x_n) + J\Delta x$ 

mismatch > tolerance



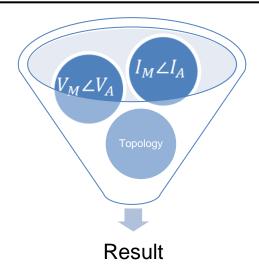
#### **Linear State Estimation**



**Z=Measurement Matrix** 

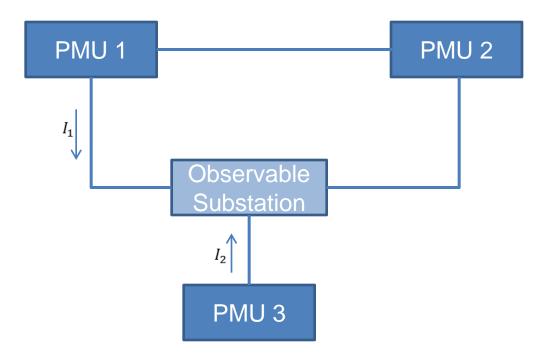
H=System transfer function

$$[x]=\bigl[\bigl(B^TB\bigr)^{-1}B^T\bigr][z]=\bigl[H\bigr][z]$$



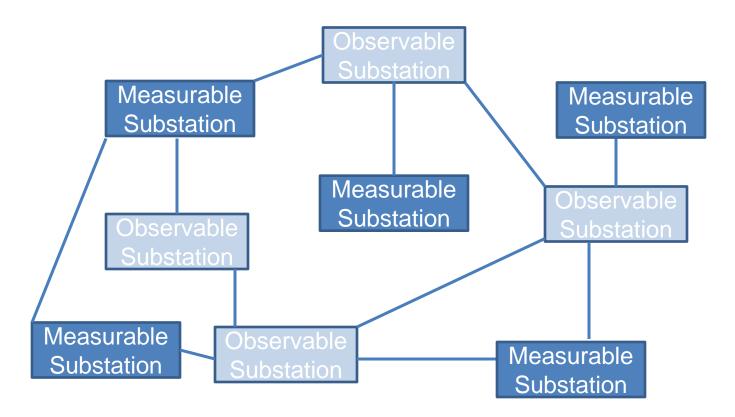


 A Linear State Estimator can be used to infer PMU equivalents, where substations without PMU measurements can still be monitored



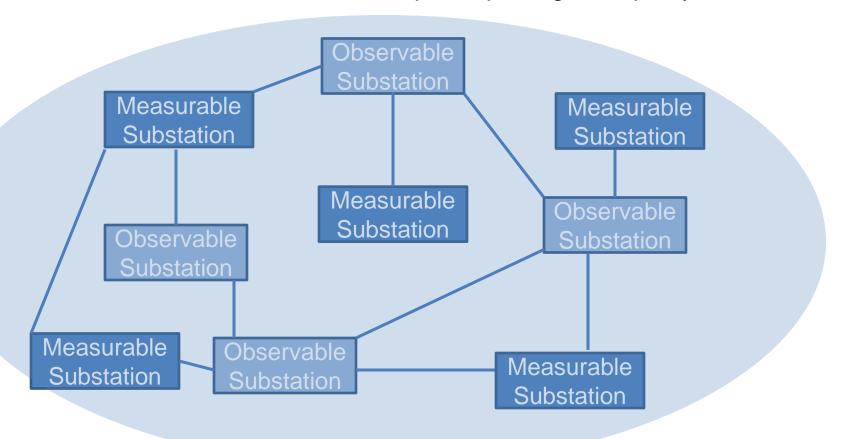


- A Linear State Estimator fills-in the picture of our grid.
- A Linear State Estimator is the first step to improving data quality.



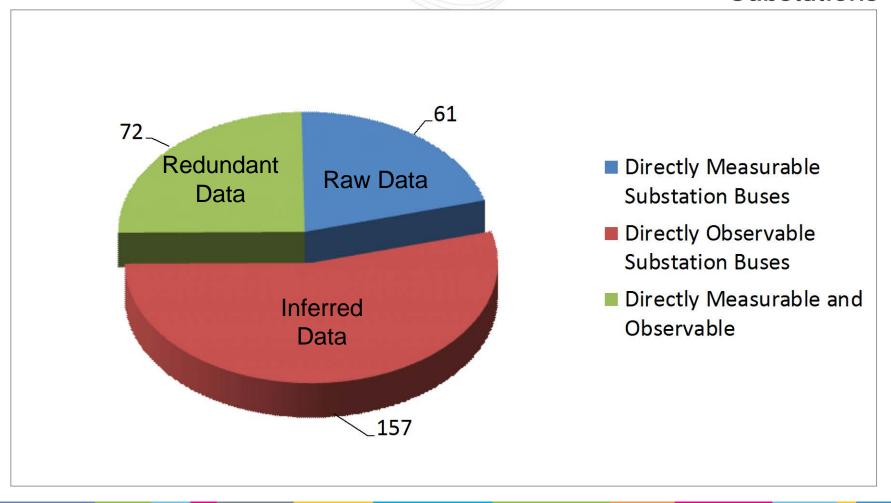


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# Leveraging Redundancy: PJM's Observable and Measureable Substations



# PJM's Implementation of the Linear State Estimator Algorithm

### **Plausibility** Checks



Run LSE Algorithm



Compare raw PMU data with LSE results

- PMU data retrieved from RTDMS via SQL Query
- Source code written in Statistical Analytic Software (SAS)
- Scheduled job executed every 15 minutes for 30 consecutive data frames.
- Results outputted to PI Historian



### **Plausibility** Checks



Run LSE Algorithm



Compare raw PMU data with LSE results

- C37 Status Word
- Voltage Magnitude between 0.7 and 1.3 Per Unit
- Average bus voltage between 0.7 and 1.3 Per Unit
- Current Magnitude less than 50 Per Unit
- Other Special Errors

# PJM's Implementation of the Linear State Estimator Algorithm





Run LSE Algorithm



Compare raw PMU data with LSE results

#### Inputs:

- PMU data passing the Plausibility Checks
- **Breaker Statuses**
- Impedance Data

#### Output:

System state of all observable substations

$$[x] = [(B^T B)^{-1} B^T][z] = [H][z]$$

### **Plausibility** Check



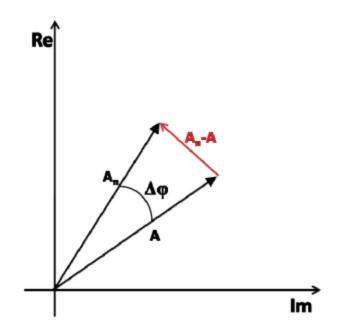
Run LSE Algorithm



Compare raw PMU data with LSE results

- Compute all measurement signals based on the result of the LSE algorithm.
- 2. Compute Total Vector Error using raw PMU data and the computed measurement value.

$$TVE = \sqrt{\frac{(A_r(n) - A_r)^2 + (A_i(n) - A_i)^2}{A_r^2 + A_i^2}}$$





## Lessons Learned & Engaging with Our Transmission Owners

- Individual configuration errors identified and corrected.
- Signal dropouts identified more quickly.
- Handling of outages to PMU signals.
- Plausibility Check performance can be trended and shared with our Transmission Owners.
- Eventually, we will share TVE Calculations based on results from the Linear State Estimator.

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# Plans for the Future: Moving Forward with the Linear State Estimator

### Short-Term Issues

- Intermittent Signal Drop-outs
- Alignment of LSE results with SE phase angles

### **Opportunities**

- Improvement to Data Quality Additional Reporting to our Transmission Owners
- New insights to the electric grid

## Longer-Term Issues

- Sustained Signal Drop-outs
- Permanent corrections to PMU data stream issues
- Management of calculated data







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