



# PMU-based Linear State Estimator for bad data detection and correction

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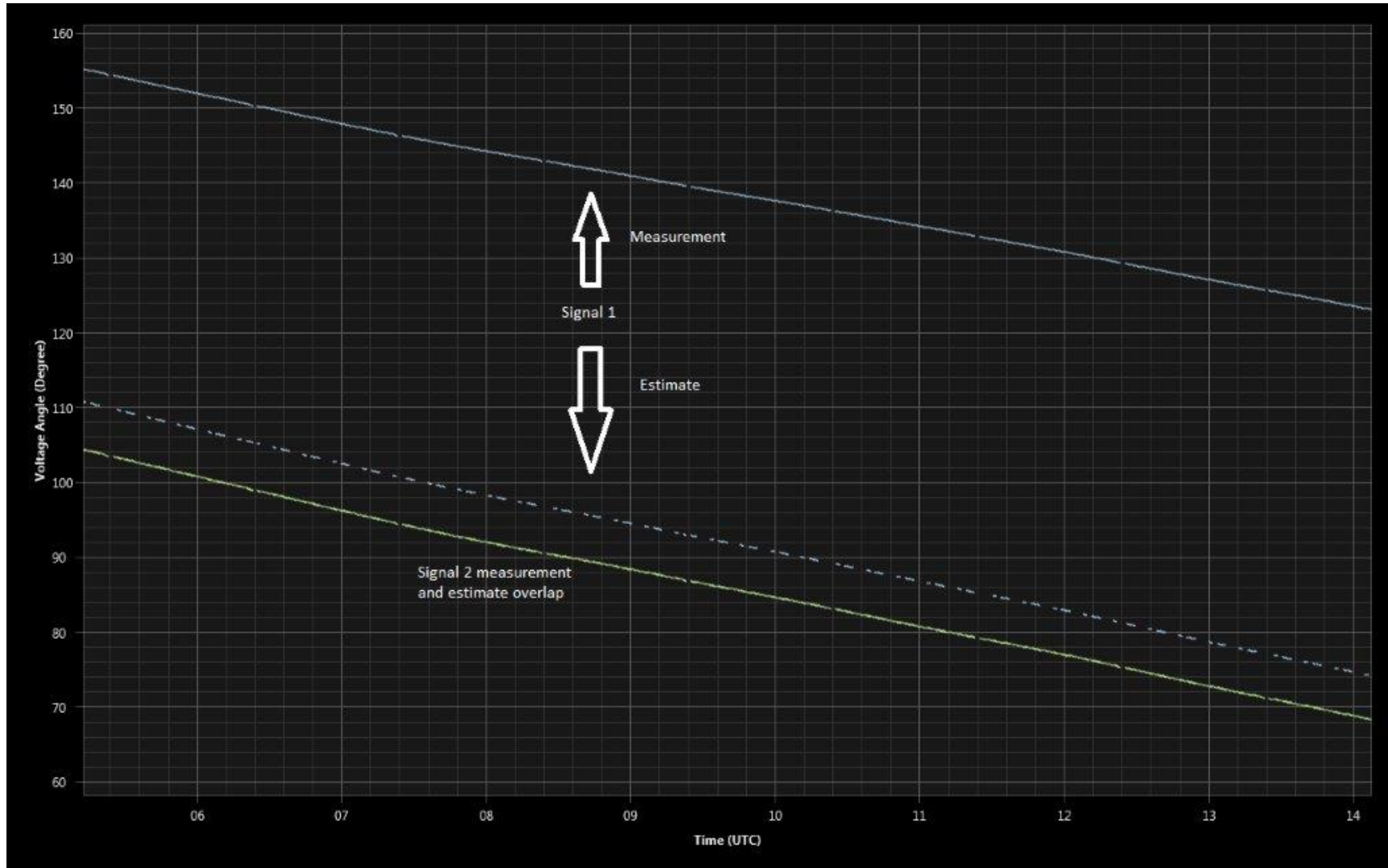
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**Imagination at work.**

# Example Business Use Case



Catch errors in PMU measurements

- LSE corrected the Signal 1 Angle Measurement
- Angle Difference between Signals 1 and 2 is 8 degrees (matches SE angle)

# Good PMU data is important

**WAMS increases the stability limits of existing assets, while keeping the security of the grid**

**WAMS provides actions to damp oscillations**

**WAMS improves state estimator robustness and accuracy**

**WAMS combined with EMS provides look-ahead capability for corrective action**



# Our story points

**ISO-NE has WAMS infrastructure in place**

**Study LSE using historical WAMS data from various events in ISO-NE on a large system**

**Gain operational insights**



# Previous PMU Data Validation at ISO-NE

Comprehensive data validation process is a must

- Initial data validation: 6 minutes of data captured using the PMU Connection Tester
- Detailed analysis of several snapshots of data taken at different times under different system conditions
- Online Data Quality Monitoring System – PMU vs. SCADA and SE solution,

Non-model based



# GE WAMS Product Portfolio

**e-terraphasorpoint** - Synchrophasor Applications for Real-Time Operations

**GSA** - Hybrid WAMS/EMS Solution for the Control Room

**e-terравision** – Unified UI for WAMS/EMS

**e-terraphasoranalytics** - Synchrophasors for Offline Engineering Analysis

**e-terraphasorcontroller** - Synchrophasors for Wide Area Control



# e-terraphasorpoint applications

Future Applications

Line Parameter Estimation

Oscillation Source Location

Very Low Frequency Monitoring

Dynamic Dispatch Training System

CIM Integration e-terrasource

Automated Reports

Advanced Applications

Oscillatory Stability Monitoring

System Disturbance Monitoring

Short Circuit Capacity

Asynchronous Systems

Sub Synchronous Oscillation Monitoring

Fault Location

Standard Applications

Islanding, Resynchronization & Blackstart

Voltage Magnitude & Angle

Dynamic Angle Reference

System Frequency & df/dt

Active & Reactive Power

Symmetrical Components

Interfaces

MyViews

System Condition Monitoring

Rate of Change

User Defined Calculations

Replay

Composite Events

IEC 60870-5-104  
DNP3  
MODBUS

COMTRADE/CSV  
Import/Export Export

SQL JDBC/OBDC

External Databases

e-terravision

e-terra  
phasoranalytics



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Roadmap

TSOs Implementations Worldwide





# e-terraphasoranalytics



# Event Selection - Example

Find the event using event filter and date/type.

The screenshot shows the 'Event Selection' step of the 'Phasor Data Import Wizard'. A blue callout 'Event Filter' points to the filter input field containing 'alarm'. A blue callout 'Event List' points to a table of event entries. A blue callout 'Event Description' points to the 'Event Detail Panel' showing details for event ID 276162. A blue callout 'Set Pre-event and Post-event Minutes' points to the time range settings at the bottom.

**Event List**

Date	Severity	Type	Message	Description
12/7/2015 5:51:39 PM	Alarm	Magnitude	Active power exceeded upper alarm limit	
12/7/2015 5:51:39 PM	Alarm	Magnitude	Angle difference exceeded upper alarm limit	
12/7/2015 5:51:39 PM	Alarm	Magnitude	Angle difference exceeded upper alarm limit	
12/7/2015 5:51:39 PM	Alarm	Magnitude	Active power exceeded upper alarm limit	
12/7/2015 5:51:39 PM	Alarm	Magnitude	Active power exceeded upper alarm limit	
12/7/2015 5:51:39 PM	Alarm	Magnitude	Reactive power exceeded upper alarm limit	
12/7/2015 5:51:39 PM	Alarm	Magnitude	Active power fell below lower alarm limit	
12/7/2015 5:54:39 PM	Alarm	PDXValidity	PDX1-3 detected line down	

**Event Detail Panel:**

Event ID: 276162  
Classification: Alarm  
TimeStamp: 12/7/2015 5:51:39 PM  
Is Data Available: True  
AlarmOff: 3  
AlarmOn: 3  
AlertOff: 3  
AlertOn: 2

Pre-event 3 minutes + Post-event 3 minutes = 6 minutes | (12/7/2015 5:48:39 PM to 12/7/2015 5:54:39 PM)



# ISO-NE System

7 TOs continuously stream PMU data

**EMS** network model data:

<b>Substations</b>	<b>1219</b>
<b>Transmission Segments</b>	<b>2262</b>
<b>Transformers</b>	<b>1603</b>
<b>Buses</b>	<b>2909</b>

**Phasor** data: Historical PMU data were exported from the archive in COMTRADE 2014 format.

**SCADA** data: Historical SCADA breaker status data from the archive were extracted and were made available to LSE.



# ISO-NE System - Scenarios of interest

## Power System Related:

- Internal events –an event occurring in the part of the network observable by LSE.
- External events

## Phasor Measurement Unit (PMU) Data Related:

- Change in redundancy and change in observability
- PMU data is not valid or PMU has sync errors. This does affect redundancy; it may or may not affect observability.

PMU data with noise: Scenario where the noise is abnormal (beyond normal white noise)

Wrong mapping (between PMU signal and the network model.)



# ISO-NE System - Scenarios of interest (Contd)

ISO-NE provided recent historical data for three events:

1. **External event:** an event in the neighbor's EHV system caused ISO-NE to export energy to its neighbor (instead of usual import).
2. **Internal event:** On one of the parallel lines at 345-kV, which have PMUs at both ends, had a breaker open from one side only.
3. **Leap second change:** On 30<sup>th</sup> June 2015, the time was adjusted to account for the leap second.



# LSE – Observability Analysis

- Based on available PMU signals and network topology, LSE **automatically** identifies observability and builds LSE model for observable islands for **every** PMU data frame.
- A total of **115 buses** were observable.
- At the 345-kV level
  - There is **one large observable island** consisting of 74 buses.
  - An additional 9 buses are in two observable islands which are not connected to the big island with current phasor measurements.
- Below the 345-kV level there are **five** observable islands, consisting of 32 buses.



## LSE – Observability Analysis (Contd)

- The LSE solves **all** the observable islands.
- This analysis helped identify the gaps in PMU locations to make the 345-kV network **fully** observable.
- This analysis also helped in identifying areas where more PMU measurements would **increase** the redundancy helping to improve LSE robustness.

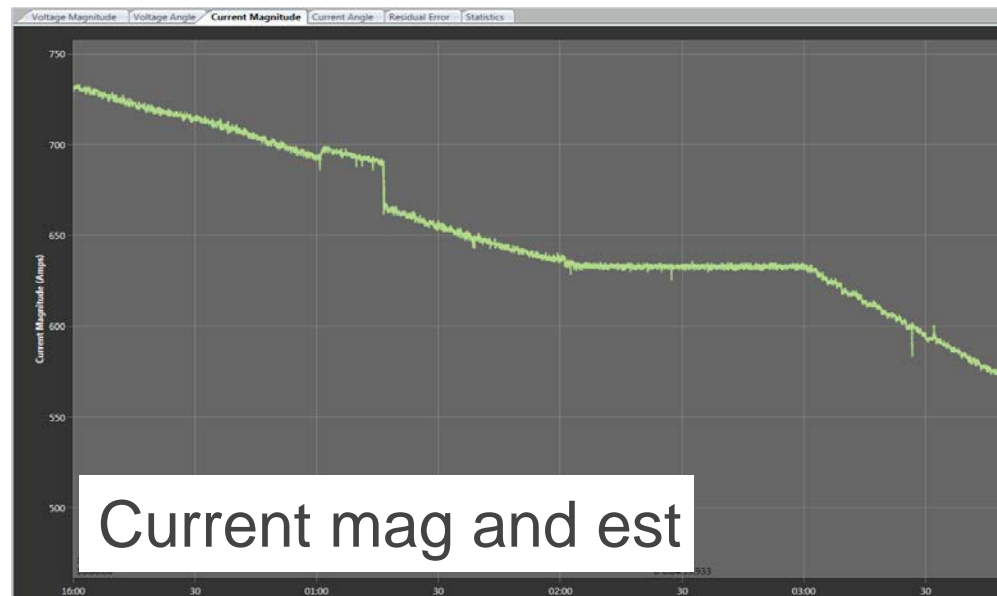


# External Event

In this event, 1400 MW **import** loss had eventually resulted in a 830 MW power **export** over a short period of time.

The figures show only a part of event but the decreasing current trend can be observed clearly from Figure 2.

Both voltage and current angle estimates **match** the corresponding measurements and is very difficult to distinguish between the measurements and their estimates.





# Internal Event

When state estimators do **not** have correct topology, the estimates would not match measurements.

Many synchrophasor installations only provide phasor values (sequence and phase quantities) and the **absence** of breaker status information may result in erroneous results of Linear State Estimator, much like the conventional state estimator.

In such cases, one option is to use the breaker statuses from SCADA which will not be time-aligned and will have certain time-delays.

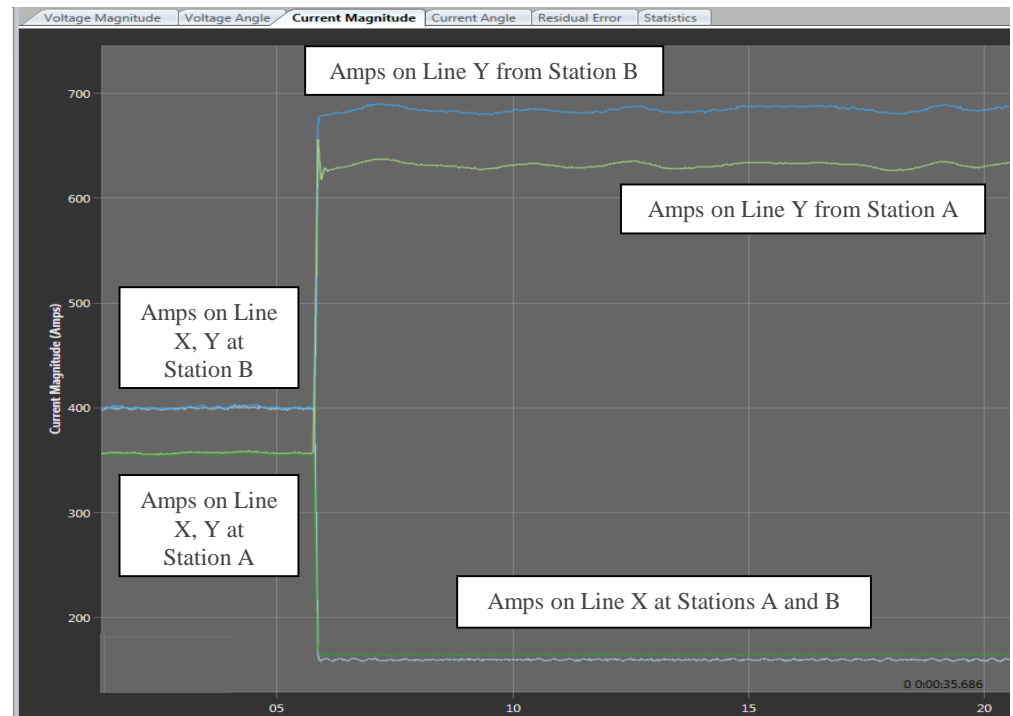
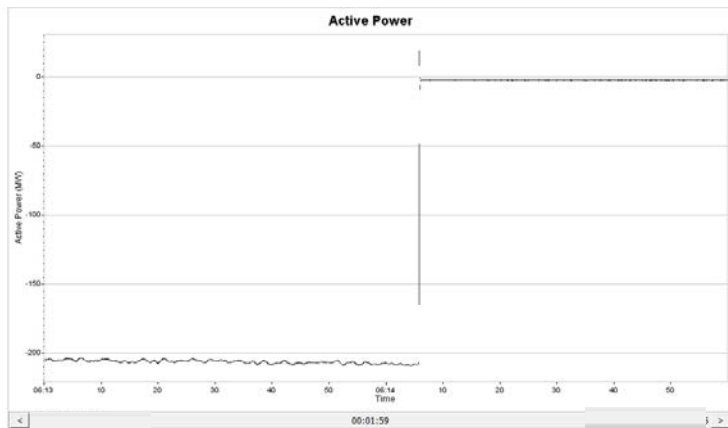
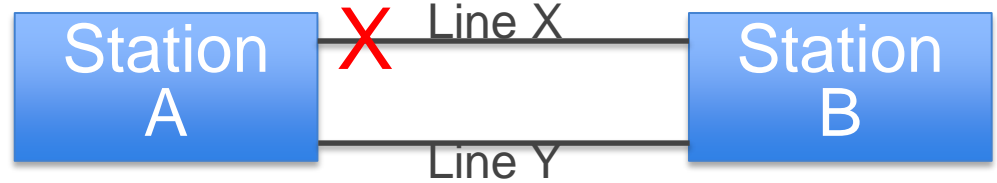
Data collected from an event that occurred in the NE grid was used to study the impact.



# Internal Event (Contd)

PMUs are installed on both sides of both the lines X and Y.

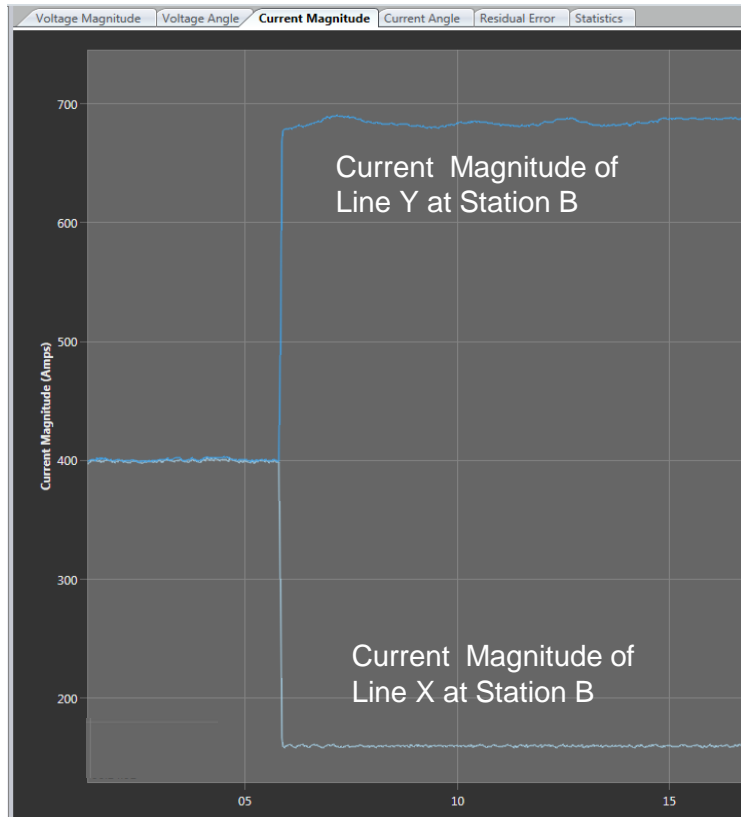
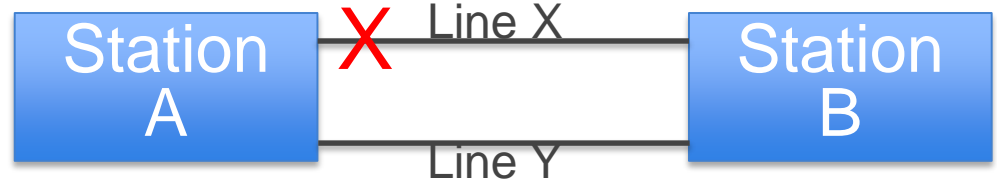
Line X at Station A is open-ended by a breaker operation at 06:14:05. The change in line flow on X is shown below:



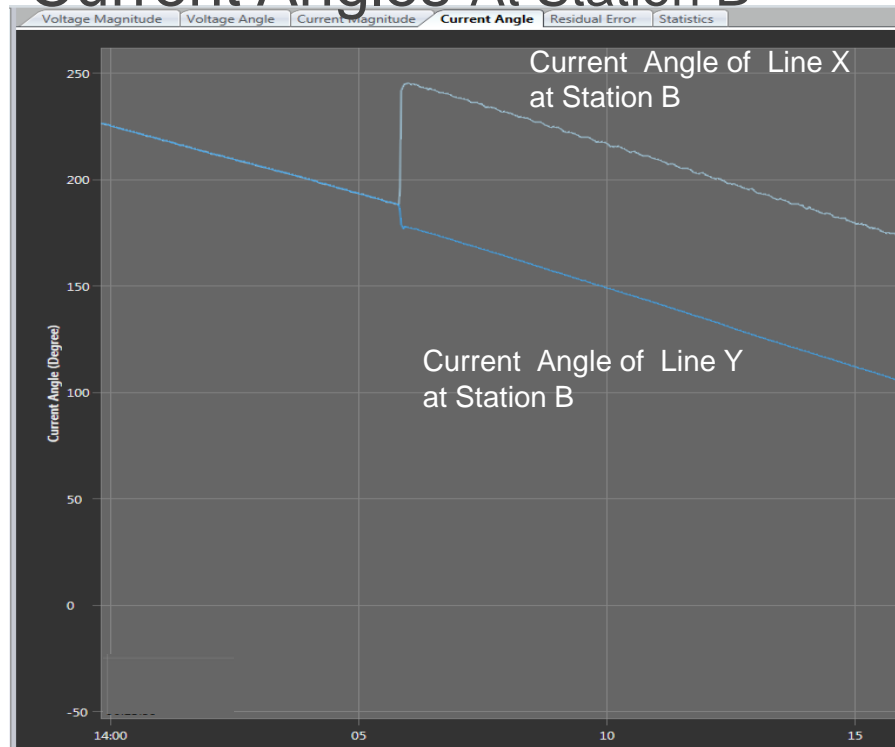
Pre and post-event current flows magnitudes on Lines X and Y from both ends are as shown above.

# Internal Event (Contd)

## Current Magnitudes At Station B

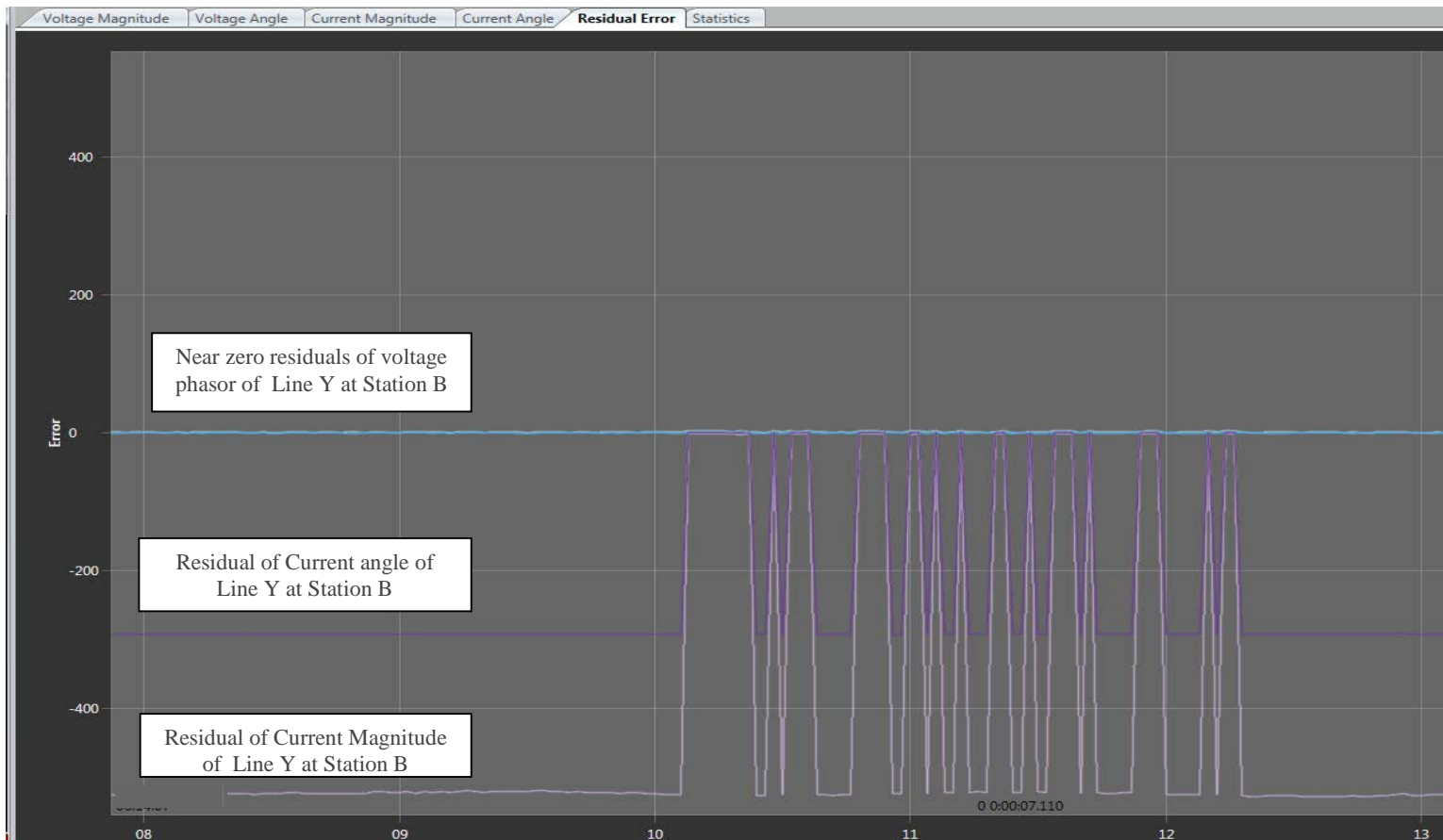
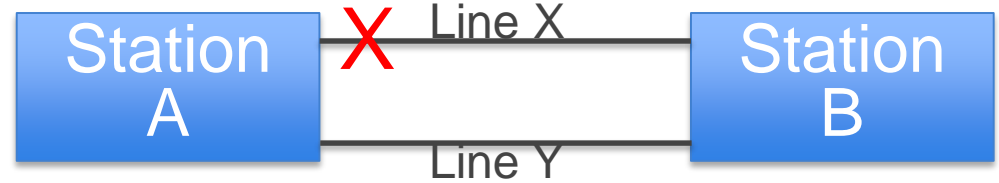


## Current Angles At Station B



# Internal Event (Contd)

Residuals of Current and Voltage Phasors At Station B



# Internal Event - Conclusion

When the line X was tripped from one side, change in the status of corresponding breaker was not updated **immediately** in the LSE model. As expected, LSE estimates are erroneous (due to topology errors) and mainly current phasor estimates are substantially different from the measurements.

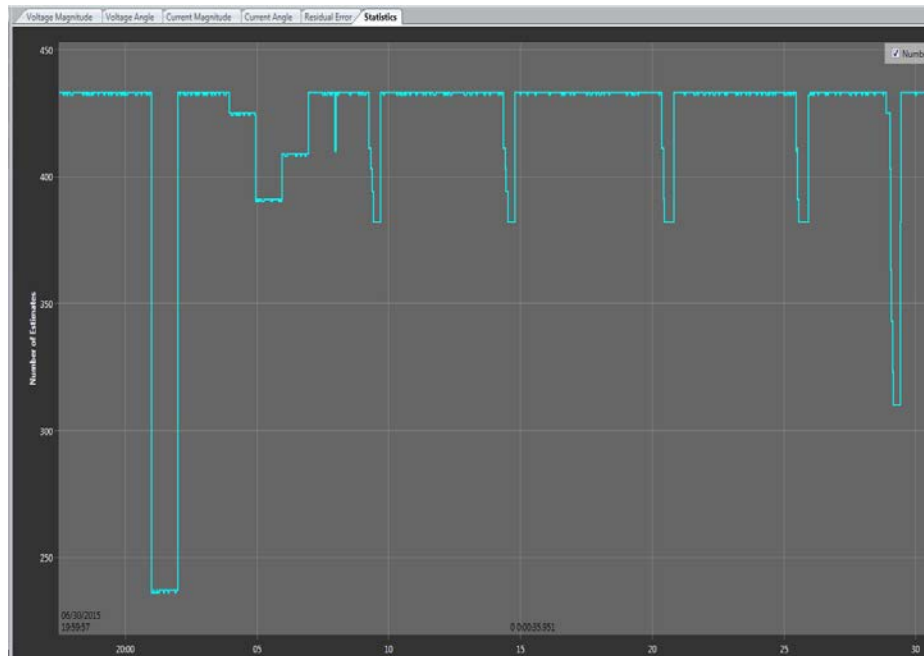
The same study was reran with changes reflecting the **correct moment** of breaker change status. Estimates matched the measurements very closely in this study.



# Leap Second Transition

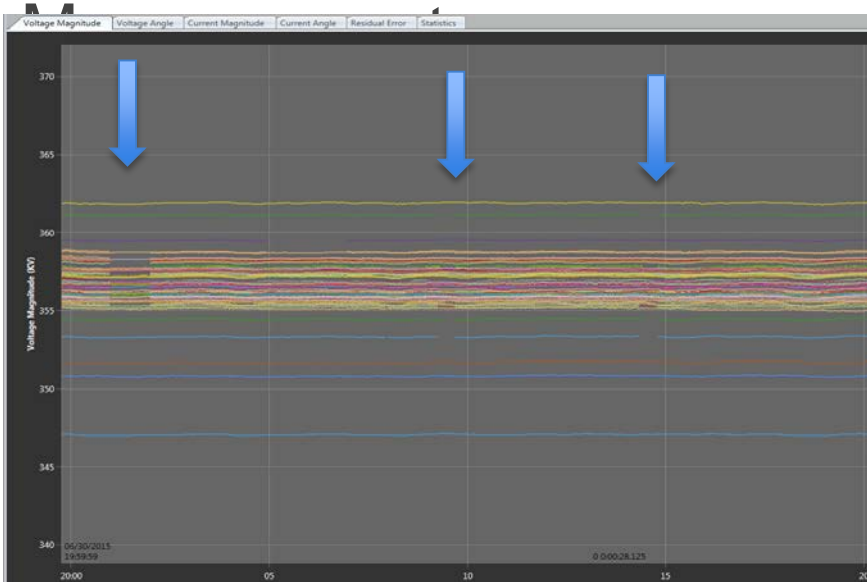
On June 30, 2015, at 20:00:00 EDT (24:00:00 UTC), leap second adjustment to UTC occurred and UTC time was incremented by 1 second.

Measurement availability changed significantly in the first 30 seconds as shown.

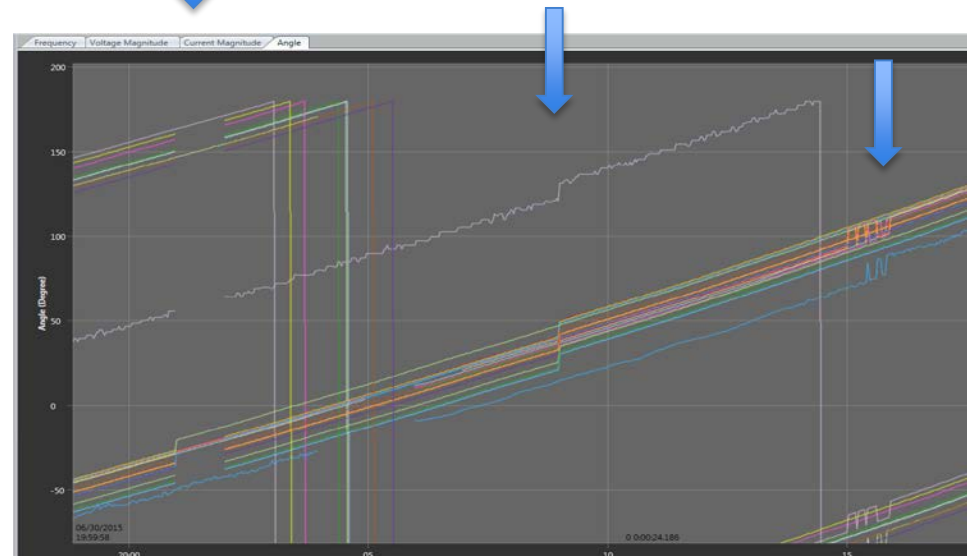


# Leap Second Transition (Contd)

## Voltage Magnitude

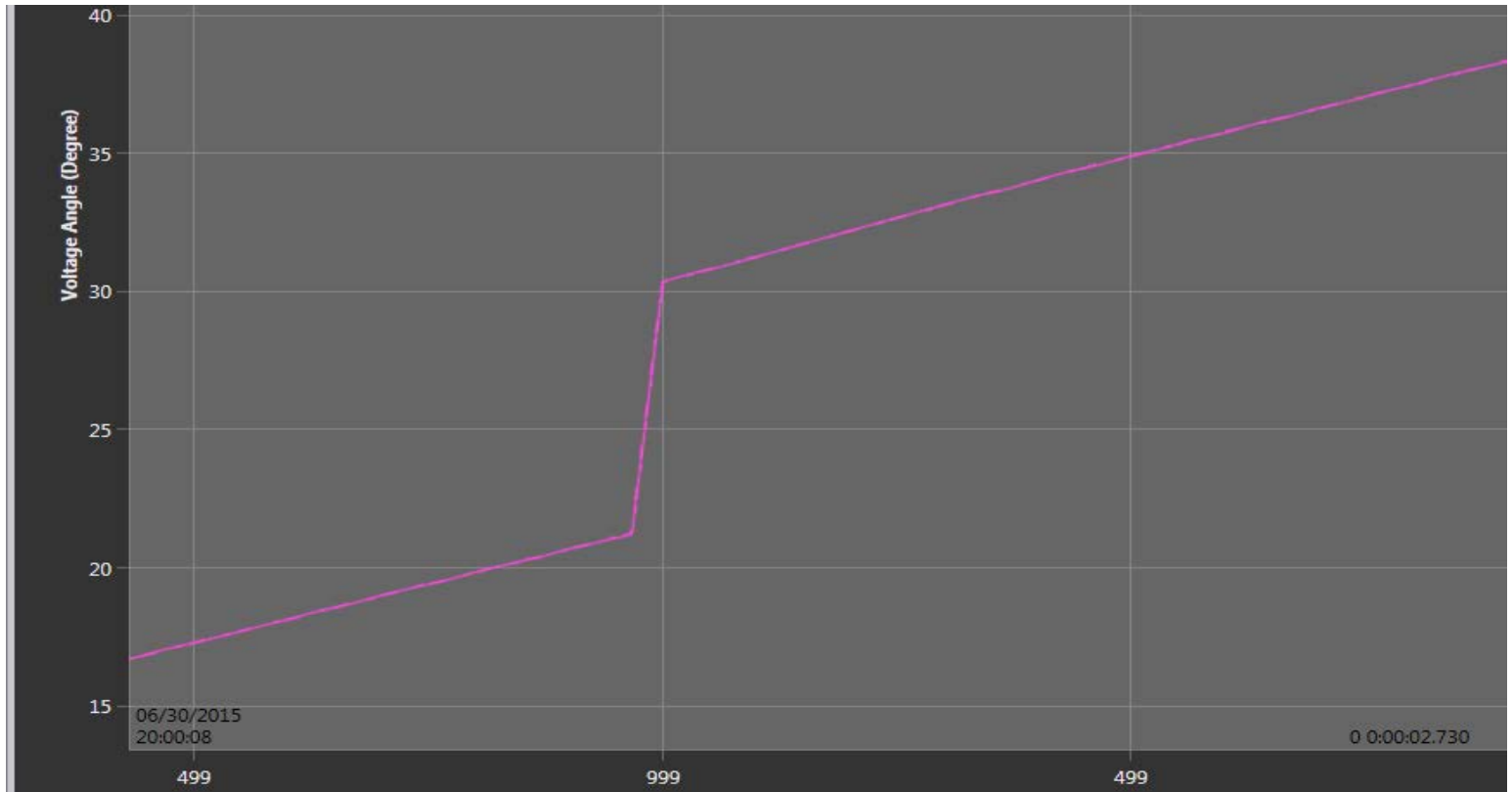


## Voltage Angle Measurements.



# Leap Second Transition (Contd)

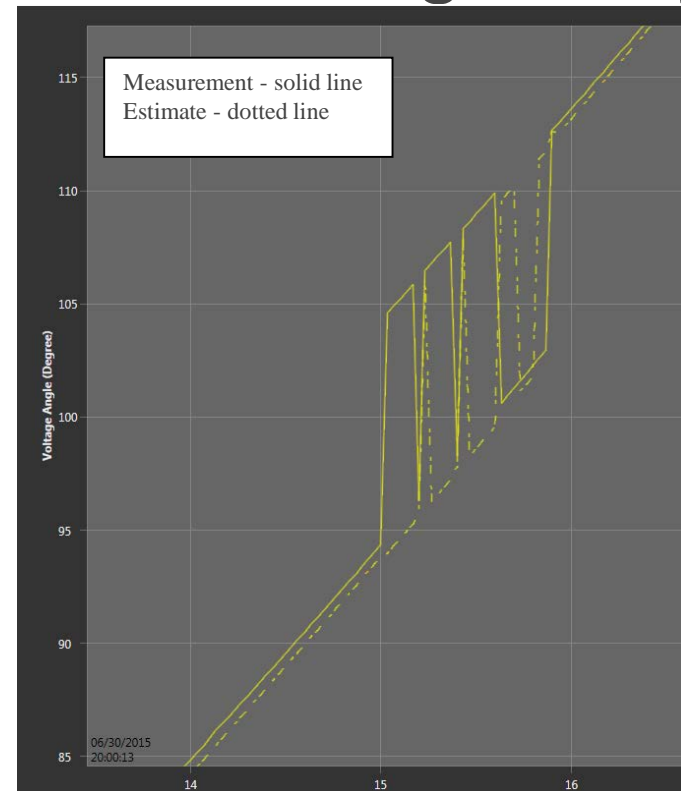
Some PMUs transitioned quickly and for these, the angle measurements and estimates matched as shown in Fig (relative angles are used):





# Leap Second Transition (Contd)

For some PMUs, the voltage angle measurements and estimates varied in the transition as shown in Fig. (relative angle are used); outside of transition time range, they matched closely.



# LSE Extensions

- Capability to change measurement **weights**
- Exporting LSE results into CSV format
- Using Common Information Model (CIM) of EMS database.



# Summary

**Validated** LSE for a variety of conditions using historical data on a relatively **large** model.

This study has been valuable in understanding the applicability and limitations of the LSE on a large scale model.

It underscored the need for **time-aligned breaker status** information or in its absence, handling of topological errors more elegantly.

Potential capability of using estimated results as more accurate comparing to original PMU measurements needs further investigation and particularly in small size PMU observable islands.

There is also a need for installing **additional** PMUs that would improve the observability and redundancy.



ANY  
QUESTIONS?



