### **DOE/OE Transmission Reliability Program**

#### **Mode Meter Development**

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Washington, DC





#### **Work Team**

- PNNL Team
  - Ning Zhou
  - Frank Tuffner
- The work under this project closely aligns and collaborates with the research under the TRP project "Measurement Based Stability Assessment" being conducted by:

Dan Trudnowski, Montana Tech

John Pierre, University of Wyoming

Louis Scharf, Colorado State University (Retired)

Many graduate students





#### **Mode Identification**

- Problem formulation:
  - Lightly damped mode => growing oscillations => system breakup => large scale outage
  - Low confidence in oscillatory modes => conservativeoperation => lower asset utilization

#### Objective:

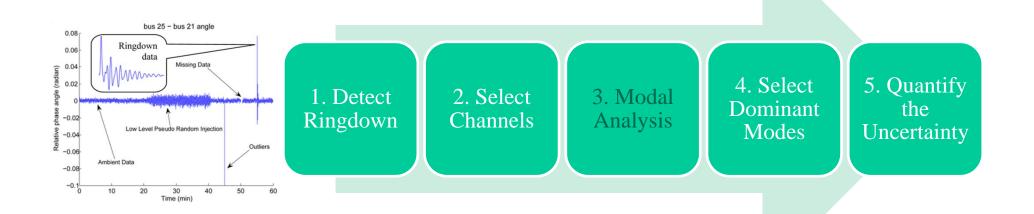
 Enhance the power system reliability by estimating oscillatory modes using PMU data.





# **Technical Approaches**

- Modal Analysis from ringdown data:
  - Applicable after significant transient
  - Quickly detect lightly damped modes

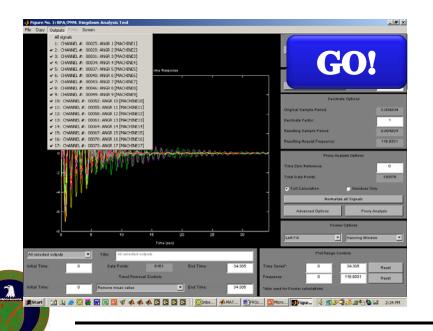


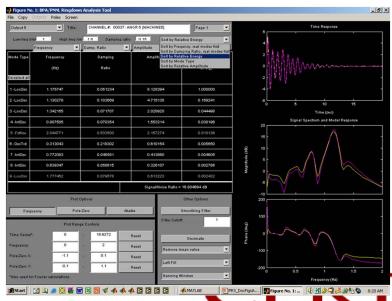




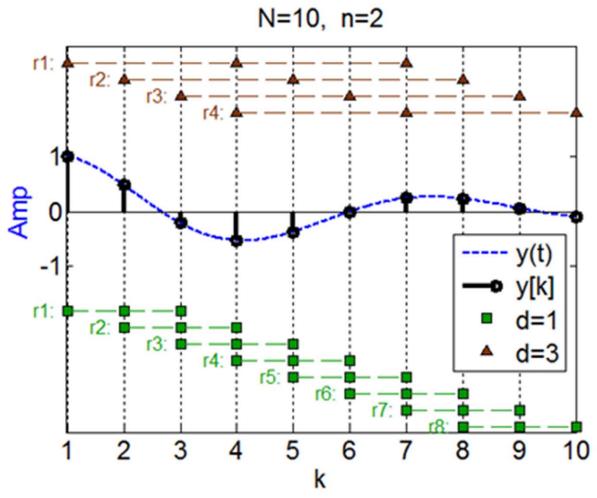
# **Challenges**

- Many user choices
  - Data (*N*, *ch*)
  - Decimation factors (d)
  - Model orders (*n*)
  - Solvers of prediction equations (LS, TLS, PE)
  - Dominant modes and trivial modes





#### **The Decimation Method**



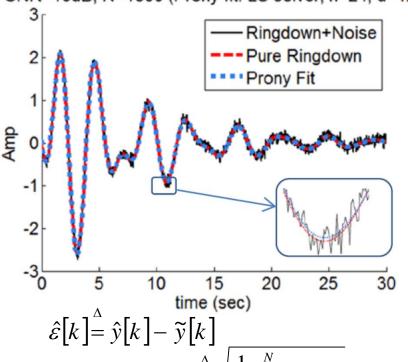




# **Metrics for Evaluating Performance**

$$\hat{y}(t) = 2e^{-0.1102t} \cos(1.5708t + 1.5\pi) + 2e^{-0.1596t} \cos(2.4504t + 0.5\pi) + \varepsilon(t)$$

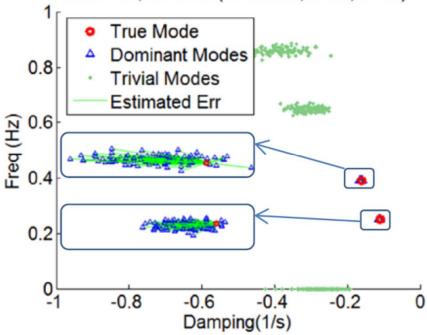
SNR=10dB, N=1800 (Prony fit: LS solver, n=24, d=12)



average fit noise =  $\sqrt{\frac{1}{N} \sum_{k=1}^{N} (\hat{\varepsilon}[k])^2}$ 

#### 60 samples/s

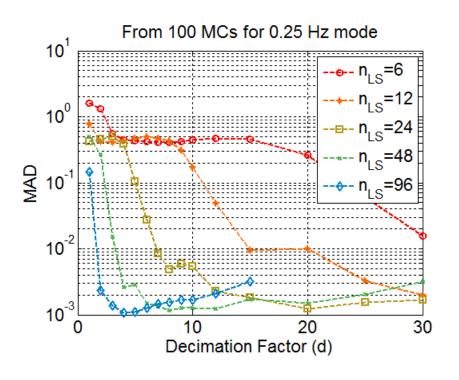
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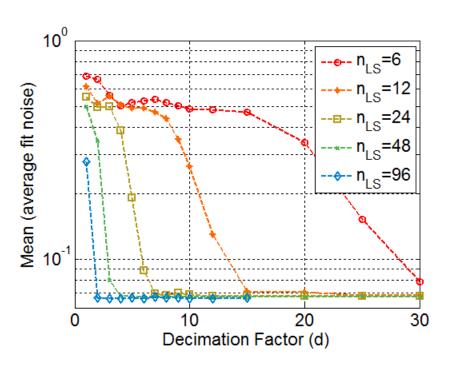


$$MAD(\hat{\lambda}_{i})^{\Delta} = \underset{mc \in \{1, 2, \dots, 100\}}{median} \left( \left| \hat{\lambda}_{i}(mc) - \lambda_{i, true} \right| \right)$$



# **Decimation (d) and Model Order (n)**





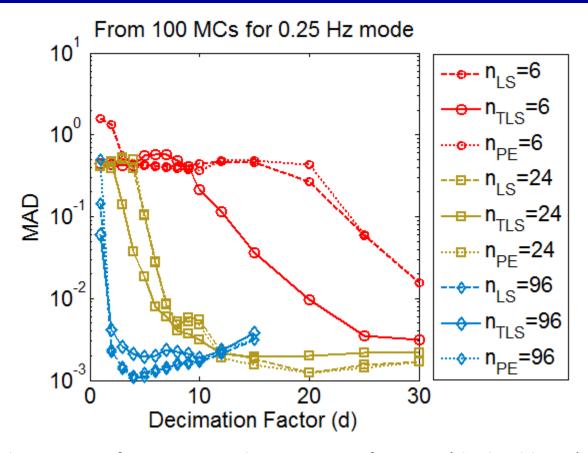
The MADs of 0.25 Hz mode estimates for different decimation factors (d) using the LS solver

The mean value of average fit noise for different decimation factors (d) using the LS solver.





# Solvers (LS, TLS, PE)

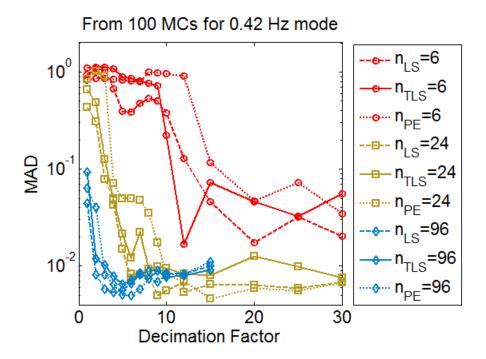


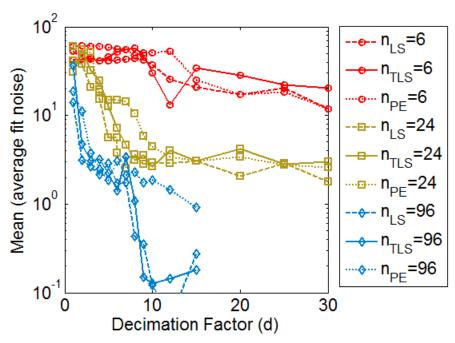
The MADs of 0.25 Hz mode estimates from **LS** (dashed lines), **TLS** (solid lines), and **PE** (dotted lines) solvers for the simple model.





#### Results from a 17-machine Model





The MADs of 0.42 Hz mode from LS (dashed lines), TLS (solid lines), and PE (dotted line) solvers for the 17-machine model

The mean value of average fit noise using LS, TLS, and PE solvers.





## Summary

- d and n shall be increased until the fit noise cannot be significantly reduced;
- The lower bound of d shall be determined by the bandwidth of ringdown responses;
- For high SNR, the difference between the LS, TLS and PE solvers is insignificant.





# **Major Technical Accomplishment**

- Supported the Montana Tech and Univers 5. Field demonstration in deploying MM at WECC as part of the WIST i
- 1 paper accepted by IEEE PES GM 2013 as one of the Best
  Papers on Network Analysis and Dynamic Performance
  - Ning Zhou, John Pierre, and Daniel Trudnowski, "Some Considerations in Using Prony Analysis to Estimate Electromechanical Modes,"
- 1 paper accepted by the Electric Power Components and Systems
  - Peng Zhang, Ning Zhou, Ali Abdollahi "A Gene 3. Prototype CYCLE:
    Least Mean Square Method for High-Resolution."
    System Oscillation Mode Estimation,"



# Deliverables and Schedules Under FY 13 Funding

- Obtain and collect some representative forced oscillation data (06/30/2013, 90%)
- In a proof-of-concept, develop and implement algorithms to detect forced oscillations and analyze system oscillation modes (09/30/2013, 10%)
- Evaluate the performance of the algorithms. (12/30/2013, 0%)
- Report the study results, and plan for future study. (03/31/2014, 20%)
  - WECC JSIS meeting, in WECC, Salt Lake City, 06/11-06/13/2013
  - 2 accepted papers





## **Risk Factors & Mitigation Approaches**

- Major risks: Algorithm assumptions may NOT always hold well.
  - Design algorithms that are more robust
  - Make reasonable assumptions
  - Verify assumptions through residual analysis





#### Follow on work for FY14

- A hybrid approaches for modal analysis (Combine the information from models and data)
  - Improve estimation accuracy
  - Enable control strategies
  - Enable event diagnosis





# **Questions or Comments?**

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