ENERGISE Program Kickoff DOE Award #: 8005



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Robust Distributed State Estimator for Interconnected Transmission and Distribution Networks **Northeastern University**

October 11, 2017

Project Team



Name	Role	Main Responsibilities (High level tasks/sub- tasks)
Ali Abur (NEU) plus 2 GRAs	PI	Management of the overall project Coordination of tasks among NEU and PJM Mentoring/advising graduate research associates Project reporting, documentation and deliverables Development and implementation of all methods and algorithms Organization of project workshop at NEU
Jianzhong Tong (PJM)	Subcontractor	Coordination of data/information exchange between NEU and PJM Facilitating acquisition of network data and measurements from member utilities Enabling implementation and testing of project software at PJM Providing technical advice and participation in project review meetings Organization of project workshop at PJM

Develop a combined *transmission – distribution state estimator* which:

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- Can account for very large system size and model complexity (by way of distributing the computations) and large number of solar PV units connected to the distribution system on multiple feeders,
- will not only provide a robust formulation and solution to this problem but also test the solution by implementing it on a well-established large utility system.

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Innovations are proposed to address the following issues:

- Computational burden: finding a scalable solution which will remain viable as the network size increases.
- Robustness: maintain the ability to detect and remove bad data, thus provide an unbiased state estimate both for the distribution and transmission system states.
- Stitching the transmission and distribution system real-time models, by estimating the zero sequence component of the transmission system bus voltages commensurate with the estimated state of the three-phase distribution system.



Computational innovations:



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Computational innovations:

- Each area SE estimates its own state.
- Coordinator SE
 - merges the solutions, and
 - processes bad data for boundary measurements.



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Computational innovations:

✤ Define the state vector for each area *i*





Computational innovations:

Measurement vector for each area i



Computational innovations:

SE problem of each area *i*

Minimize
$$\sum_{j=1}^{m_i} \frac{1}{\sigma_j^2} (r_j^i)^2$$

Subject to $z_j^i = h_j(\hat{x}^i) + r_j^i$ $1 \le j \le m_i$
where:
 $e_j^i \propto N(0, \sigma_j^2)$
 m_i : number of measurements in z^i
 $\hat{z}_j^i = h_j(\hat{x}^i)$ estimated measurement
 $\hat{x}^i = \begin{bmatrix} \hat{x}_{i}^i \\ n_{ext}^i \\ \hat{x}_{ext}^i \end{bmatrix}$ estimated state

 Measurements received and used by the coordinator SE

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 Each area state estimates are treated as pseudo-measurements with the following distribution:

 $N(\hat{x}^i, \Lambda^i)$

where:

$$\Lambda^{i} = \begin{bmatrix} G^{i} \end{bmatrix}^{-1}$$

$$G^{i} = \begin{bmatrix} H^{i} \end{bmatrix}^{T} \begin{bmatrix} R^{i} \end{bmatrix}^{-1} \begin{bmatrix} H^{i} \end{bmatrix}$$

$$\begin{bmatrix} H^{i}_{jk} \end{bmatrix} = \frac{\partial h_{j}}{\partial x_{k}^{i}}$$

$$R^{i} = \operatorname{cov}(e^{i})$$

Computational innovations:

Coordinator SE

Minimize
$$\sum_{j=1}^{k} \frac{1}{R_{jj}} (r_j)^2$$

Subject to $z_j = h_j(\hat{x}_b) + r_j$ $1 \le j \le k$
 $k = \begin{cases} N(0, \sigma_j^2) \text{ boundary measurements} \\ N(0, \sigma_{jj}^2) \text{ PMU measurements} \\ N(0, \Lambda_{jj}) \text{ area state estimates} \end{cases}$

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Computational innovations:

Two-level SE Properties:

- ✤ <u>No boundary</u> measurements are <u>discarded</u>.
- ✤ <u>All</u> detectable / identifiable <u>bad data</u> are detected and identified.
- PMU measurements are effectively used, but not required for this scheme to work.
- Areas <u>do not share</u> network data (internal system details) or intermediate iteration results. They <u>only provide</u> boundary network model and measurements and their estimated states to the coordinator.
- Applicable to both single phase [positive seq.] and three-phase SE, areas representing either transmission control areas or distribution system feeders which may or may not be configured radially.



Robustness innovations:

WLS SE followed by the largest normalized residual (LNR) – Plan to use a recently developed technique which drastically increases the computational speed of LNR test for very large scale systems.

Innovative stitching of T&D real-time solutions:

Use of D system sequence current injections and T system pseudoinjections to solve for the zero sequence voltages in the T system. Also provide real-time monitoring capability of reverse flows at the seams.

Main Project Tasks/Subtasks

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Task 1: Multi-area Transmission State Estimation (MAT SE)

- 1.1. Formulation and software design
- 1.2. Prototype code development
- 1.3. Testing and validation

Task 2: Multiple Distribution Feeder State Estimation (MDF SE)

- 2.1. Formulation and software design
- 2.2. Prototype code development
- 2.3. Testing and validation

Task 3: T&D Network Data and Measurement Acquisition

- 3.1. Identifying data sources and gathering data
- 3.2. Verifying data consistency and sufficiency

Main Project Tasks/Subtasks

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Task 4: Technology-Market Transition Plan Preparation

- Task 5: BD Processing by MAT SE
 - 5.1. LNR test for individual areas
 - 5.2. LNR test by coordinator
 - 5.3. Testing and validation

Task 6: PV Incorporation and BD Processing by MDF SE

6.1. LNR tests on individual feeders

6.2. Incorporating large number of solar PV units

Task 7: Network Data and Measurement Configuration

7.1. Acquire data and measurement configuration for both T&D

7.2. Test data and synthesized measurements using MAT and MDF estimators.

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Task 8: Engagement of PE community / Workshop at NEU

- Task 9: Combining MAT and MDF SE
 - 9.1. Code development for pos. seq. combined SE
 - 9.2. Implementing unbalanced estimator
 - 9.3. Testing and validation

Task 10: Testing with Large System Data and Measurements

10.1. Create large scale measurements using save cases

10.2. Test MAT and MDF estimators, then the combined SE

Task 11: Dissemination of Results / Workshop at PJM

Task 12: Documentation

12.1. Final project report

12.2. User's manual for the developed software

Project Milestones/Deliverables



- ✤ M:1.0 Validation of MAT SE code [12 mo.]
- ✤ M:2.0 Validation of MDF SE code [12 mo.]
- ✤ M:3.0 Test data for both transmission and distribution systems [12 mo.]
- ✤ M:5.0 Validation of robustness (MAT SE) [24 mo.]
- ✤ M:6.1 Validation of robustness and PV incorporation (MDF) [24 mo.]
- ✤ M:7.0 Testing w/ actual data, synthesized measurements [24 mo.]
- ✤ M:8.1 Workshop at NEU [24 mo.]
- ✤ M:9.0 Validation of combined T&D SE code [33 mo.]
- ✤ M:10 Testing with utility data and measurements [36 mo.]
- ✤ M:11 Workshop at PJM [36 mo.]
- D:1 Combined T&D SE program [36 mo.]
- ✤ D:2 Final report and acceptance tests [36 mo.]

Project Architecture

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High Risks & Mitigation

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- 1. Premature termination of graduate research associate contracts due to students failing QE, unsatisfactory performance, etc.
 - Engage multiple students via project group meetings to keep them familiar with the project tasks, developed software and methods.
- 2. Difficulty to acquire large scale distribution system network data and measurement configurations. This task will be facilitated by project subcontractor PJM.
 - Contact multiple distribution companies to increase chances of acquiring typical data / measurements from at least one.