



PhasorAnalytics-Commercial tool for disturbance based model validation and calibration

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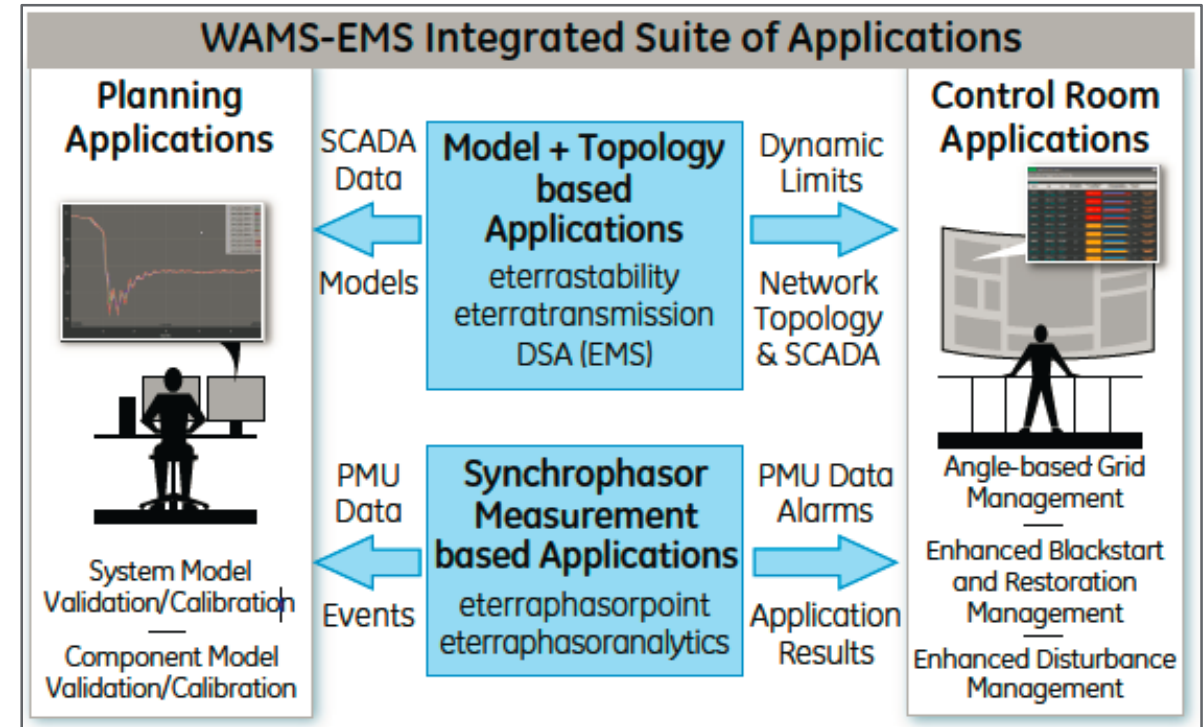
October 23, 2018



Project Overview

March, 2017 – June, 2019

- Develop and demonstrate multiple **production-grade** synchrophasor applications to enhance grid reliability and asset utilization through utilization of existing WAMS infrastructure along with EMS network applications available at control rooms
- Project includes field demonstrations at multiple utility locations
 1. **Model Validation/Calibration tool for improving models to meet emerging NERC requirements**
 2. **Angle-based grid management tool for improved transmission asset utilization applied to voltage stability limited systems**
 3. **Demonstration of Operator guidance tool for enhanced blackstart/restoration and disturbance management**



Team Chart



Carol Painter: DOE Project Officer
Phil Overholt: DOE program mgr.
Jeff Dagle: Technical advisor from PNNL



Honggang Wang: PI. PMP, reports, site visit review
Alex Santos: Contract manager
Na Jing: Financial Analyst

Developers

Utility Partners



Lead FAT and field demos, Develop model cal., AGM and operator guidance software tools; Model val./cal. platform
integration of PSLF & TSAT with WAMS product

Manu Parashar
 Director-SW engineering
Anil Jampala
 Principal Power Systems
Saugata Biswas
 AGM/EDM/EIM Design
Krish Srinivasan
 Model Cal Integration
Russ Frizzell-Carlton
 Model Cal Integration
Vijay Sukhavasi
 AGM/EIM integration



Development of model calibration techniques, angle-based grid management, factory acceptance testing

Honggang Wang
Phil hart
Mustafa Dokucu
Jovan Bebic
Chaitanya Baone
Anup Menon
Naresh Acharya
Yan Pan



Model validation/ calibration platform integration of PSLF with WAMS product

Haris Ribic
Juan Sanchez-Gasca
Brian Thomas
 Develop APIs to enable Communication between WAMS product and PSLF



Model validation/ calibration platform integration of TSAT with WAMS product, assist with AGM

George Zhang
 Develop APIs to enable Communication between WAMS product and PSLF



*Provide cost share, test data and models, assist/host applications in QA environment, **Field tests***

Keith Mitchell
 Field demo for AGM and operator guidance.



*Provide cost share, test data and models, assist/host applications in QA environment, **Field tests***

Sherman Chen
 Field demo for Model Validation/ Calibration tool.



*Provide test data and models, feedback on developed Applications; **Field tests***

Xiaochuan Luo
Frankie Zhang
 Field demo for Model Validation/ Calibration tool.



Provide feedback on developed Applications

Hongming Zhang
Alex Ning
 Technical advisor

Task 1: Disturbance based Model Validation & Calibration

Motivation

- Generic tool for generator owner to be compliant with NERC Requirement (MOD-026/033)

Objective

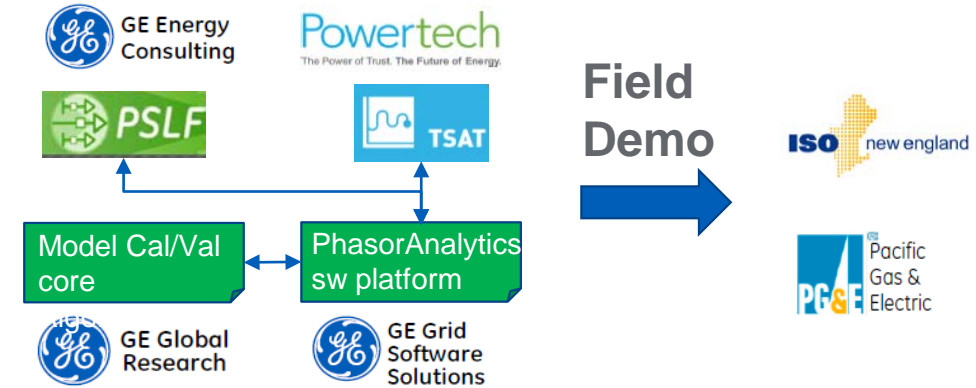
- Production-grade software solution which can work across multiple commercial dynamic simulation engines

Accomplishment

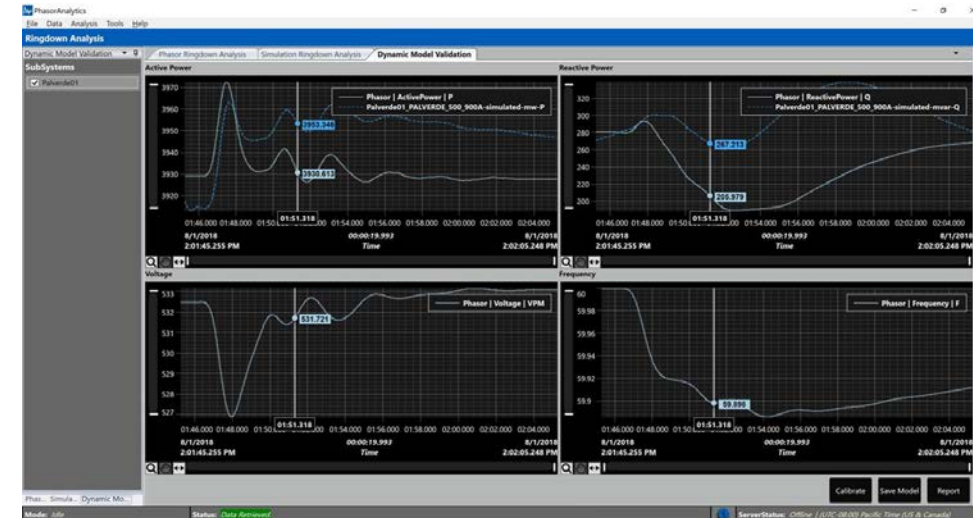
- Functional specification completed.
- Algorithm developed and tested with simulated data.
- Software platform integration with simulation tool PSLF completed.
- Paper titled “Synchrophasor Based Dynamic Model Validation Leveraging Multiple Events” presented at the 2018 IEEE Innovative Smart Grid Technologies (ISGT) Conference.
- Paper titled “Towards a Commercial-grade Tool for Disturbance-based Model Validation and Calibration” at 2018 IEEE PES



General Meeting.



Multi-team Collaboration



Task 2: Angle-based Grid Management for Voltage Stability Assessment

Motivation

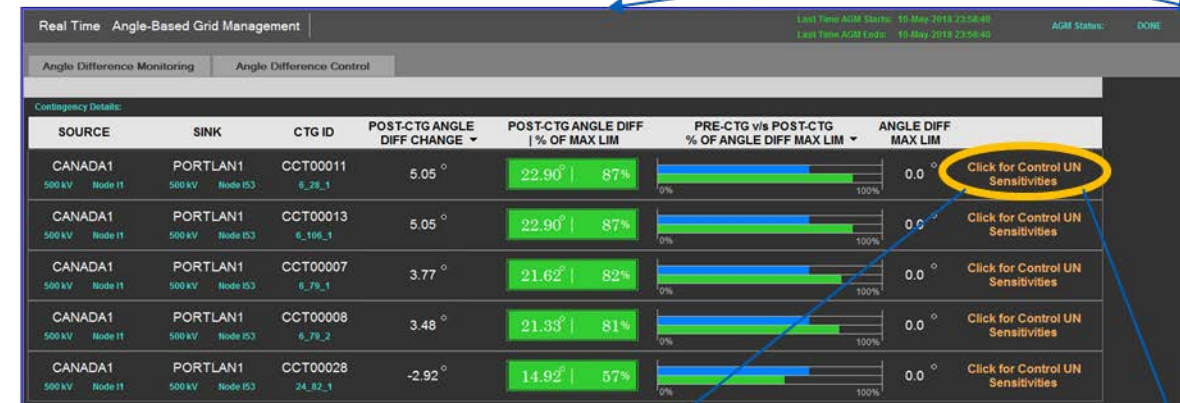
- To enhance the real time visibility and grid asset utilization

Objective

- Production-grade software solution for Fast Voltage Stability Assessment (FVSA) based on Voltage Angle-based information

Accomplishment

- Fast Voltage Stability Assessment (FVSA) functional specification completed.
- FVSA algorithm developed and tested with simulated data.
- FVSA software platform integration completed.
- FVSA software application factory acceptance testing completed.
- Presented “PMU Measurement-Model Based Voltage Security Monitoring Application” at the April 2018 NASPI



Task 3: Operator Guidance Tool

- Augment existing synchrophasor applications with detailed root cause assessment, what-if capabilities, and recommendations during islanding and other disturbance conditions.
- Demonstrate Enhanced Island Monitoring and Enhanced Disturbance Management at MISO.
 - Enhanced Island Monitoring (EIM) provides the exact cause and location of the islanding event, island size, island composition, information about circuit breaker(s) that can be closed by the operators to resynchronize the formed island from the main grid.
 - Enhanced Disturbance Management (EDM) provides time of occurrence of a disturbance event, event spread (wide area or local), event type and MW change during the event.

Accomplishment

- Enhanced Island Management and Enhanced Disturbance Management tested with simulated data.
- Operator guidance field test plan document for deployment at MISO completed.

EIM Display for Monitoring

1 ISLAND	REFERENCE BUS Station kV Number	NO. OF BUSES	NO. OF BRANCHES	NO. OF GENERATORS	NO. OF LOADS	FREQUENCY (Hz)	2 CAUSE OF ISLAND FORMATION EQUIP CHANGE EQUIP ID FROM ST TO ST	3 TIME OF ISLAND FORMATION
1	HOLDEN 68 96	61	70	7	43	59.99	BS SPLIT CB:8586 RICHVIEW RICHVIEW	18-May-2017 00:47:28
2	DOUGLAS 4 10	29	29	5	14	59.81	BS SPLIT CB:8586 RICHVIEW RICHVIEW	18-May-2017 00:47:28

EIM Display for Restoration / Resynchronization

1 ISLAND	REFERENCE BUS Station kV Number	NO. OF BUSES	NO. OF BRANCHES	TOTAL MW GENERATION	TOTAL MW LOAD	FREQUENCY (Hz)	2 CAUSE OF ISLAND RESYNCHRONIZATION EQUIP CHANGE EQUIP ID FROM ST TO ST	3 TIME OF ISLAND RESYNC
1	HOLDEN 68 96	61	70	1905.42	2422.02	59.99	BS SPLIT CB:8586 RICHVIEW RICHVIEW	
2	DOUGLAS 4 10	29	29	1275.31	696.39	59.81	BS SPLIT CB:8586 RICHVIEW RICHVIEW	



Upcoming Milestone & Field Tests

2018 Q4

Milestone	Milestone Description	Due	Category
M10A	Dynamic model calibration algorithm tested with realistic data in target platform with PSLF	12/19/2018	Development
M22	Model Validation & calibration FAT using PSLF	12/19/2018	FAT/Field Demo
M30	Operator Guidance FAT	12/19/2018	FAT/Field Demo

2019 Q1

Milestone	Milestone Description	Revised	Category
M6B	Model calibration software platform with TSAT	3/19/2019	Development
M10B	Dynamic model calibration algorithm tested with realistic data in target platform with TSAT	3/19/2019	Development
M24	Model Validation & calibration FAT using TSAT	3/19/2019	FAT/Field Demo
M23	Model Validation field tests	3/19/2019	FAT/Field Demo
M28	AGM field test	3/19/2019	FAT/Field Demo
M31	Operator Guidance field test	3/19/2019	FAT/Field Demo

2019 Q2

Milestone	Milestone Description	Revised	Category
M25	Model Calibration field tests	6/19/2019	FAT/Field Demo



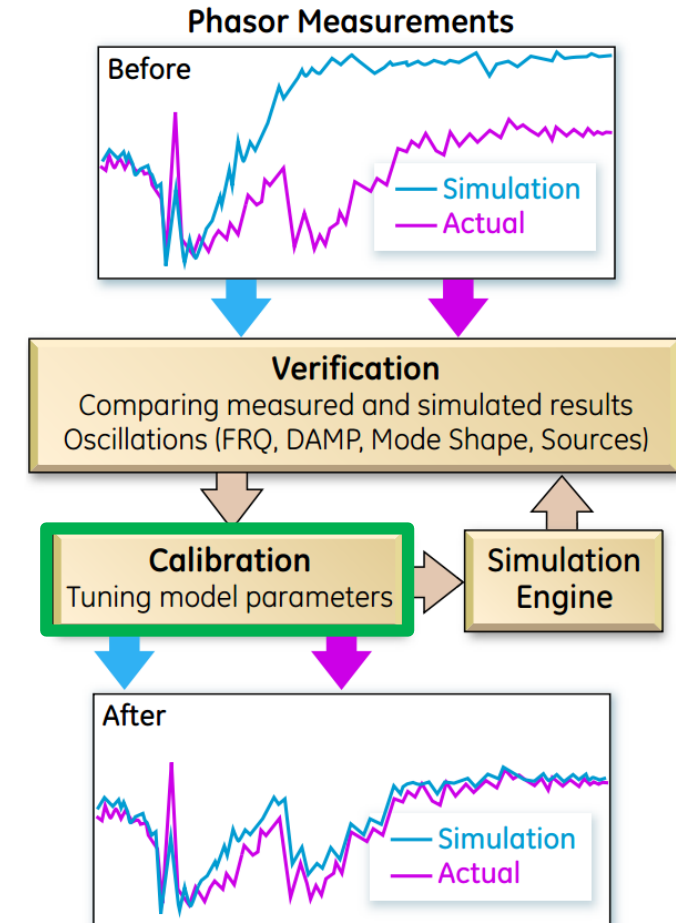
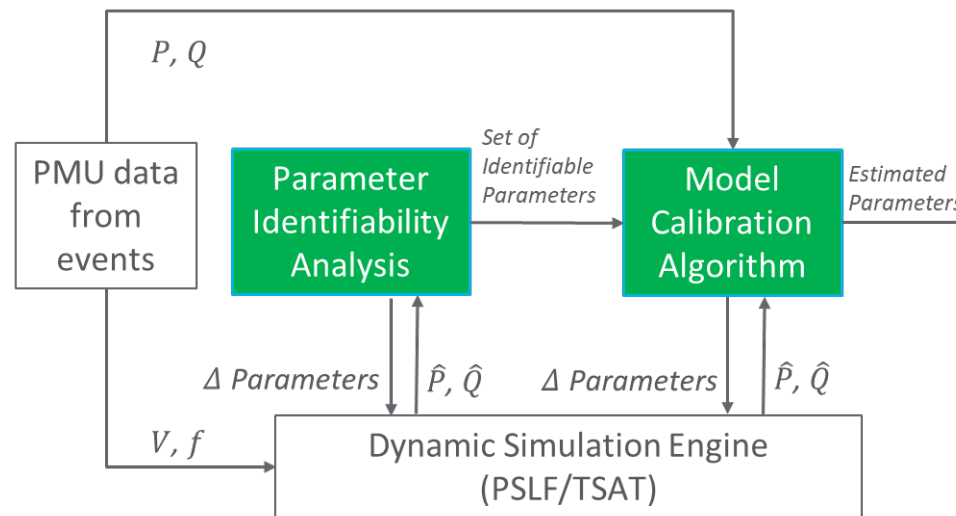
PhasorAnalytics Model Calibration Algorithm Development



Two Stage Approach for Model Calibration

1. Design Considerations

- **Production-grade** software tool
- **Generic** for wide variety of models (PSLF, TSAT and PTI PSS/E)
- **Minimal data flow change** on existing tools
- Account for **non-linearity** in models
- Quality of solution with **reasonable speed**
- Account for **multiple different events**
- Avoid tuning parameters that may already be at their true values



Stage I-Parameter Identifiability

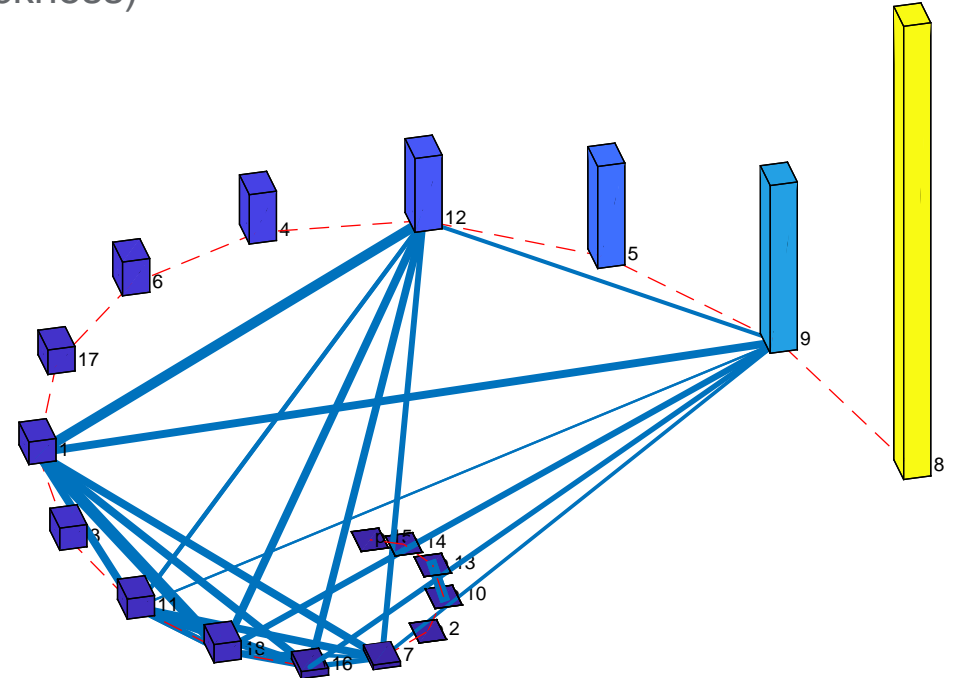
- Jacobian matrix, $A =$

		Parameters			
Time series	$\partial P(t_1)$	$\frac{\partial P(t_1)}{\partial \theta_1}$	$\frac{\partial P(t_1)}{\partial \theta_2}$	\dots	$\frac{\partial P(t_1)}{\partial \theta_k}$
	$\partial P(t_2)$	$\frac{\partial P(t_2)}{\partial \theta_1}$	$\frac{\partial P(t_2)}{\partial \theta_2}$	\dots	$\frac{\partial P(t_2)}{\partial \theta_k}$
	\vdots				
	$\partial P(t_N)$	$\frac{\partial P(t_N)}{\partial \theta_1}$	$\frac{\partial P(t_N)}{\partial \theta_2}$	\dots	$\frac{\partial P(t_N)}{\partial \theta_k}$
	$\partial Q(t_1)$	$\frac{\partial Q(t_1)}{\partial \theta_1}$	$\frac{\partial Q(t_1)}{\partial \theta_2}$	\dots	$\frac{\partial Q(t_1)}{\partial \theta_k}$
	$\partial Q(t_2)$	$\frac{\partial Q(t_2)}{\partial \theta_1}$	$\frac{\partial Q(t_2)}{\partial \theta_2}$	\dots	$\frac{\partial Q(t_2)}{\partial \theta_k}$
	\vdots				
	$\partial Q(t_N)$	$\frac{\partial Q(t_N)}{\partial \theta_1}$	$\frac{\partial Q(t_N)}{\partial \theta_2}$	\dots	$\frac{\partial Q(t_N)}{\partial \theta_k}$

- Rank deficiency of A can result from:
 - very small entries in columns of A
 - columns of A being nearly linearly dependent

Causing failure to identify parameters uniquely

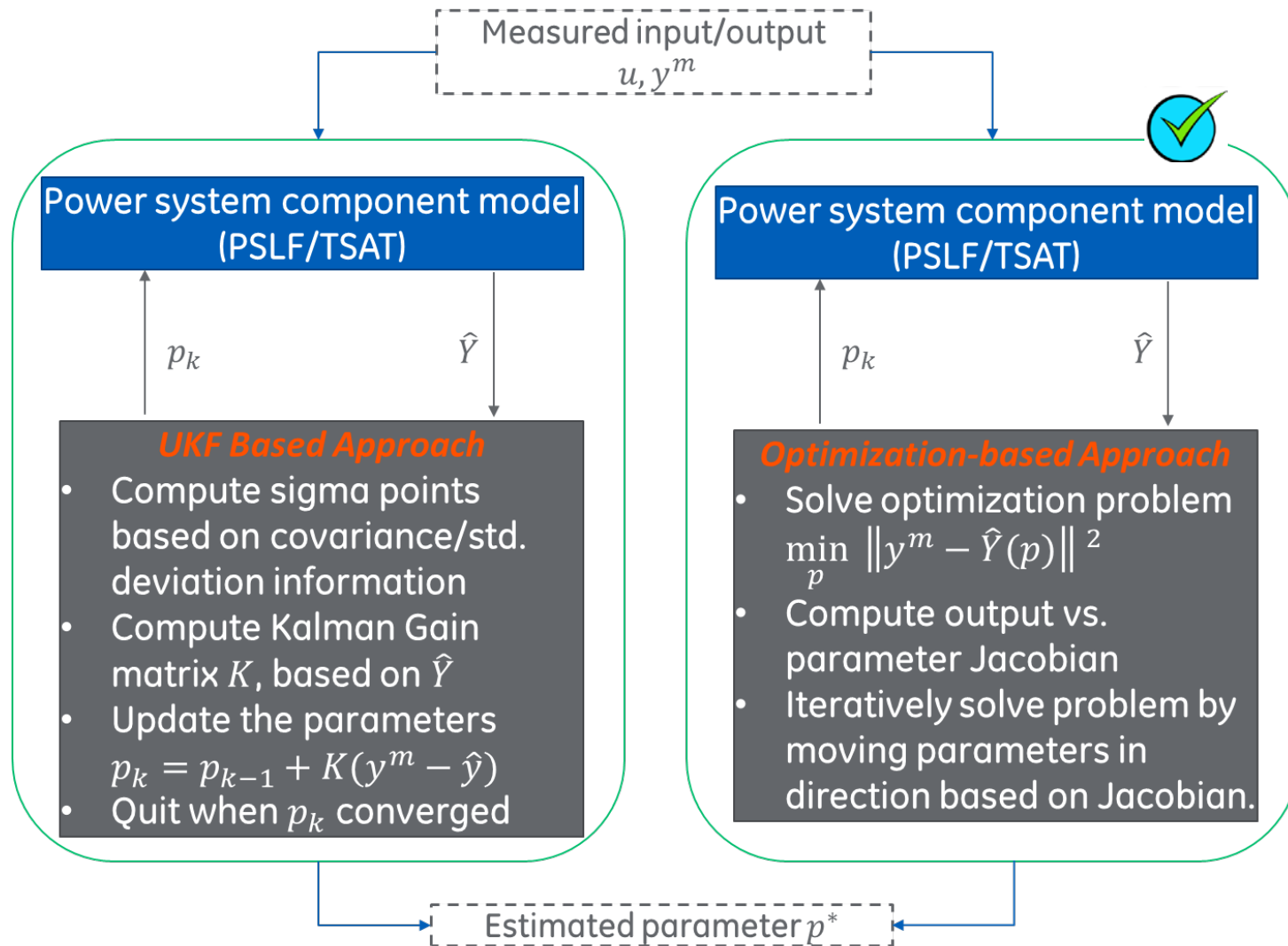
- Sensitivity **magnitude**: reduces in counter-clockwise direction
- Sensitivity **dependency**: represented by connecting lines (thickness)



$$A = USV^T \quad \mathbf{M}_{sen} = \sum_{i=1}^{N_p} \sigma_i^2 \mathbf{v}_i^2$$

Identifiability provides data-driven sensitivity insight for user.

Stage II-Parameter Estimation



NLS Optimization approach is selected:

- Flexibility for customization
- Handling non-gaussian noise

Algorithm Improvement:

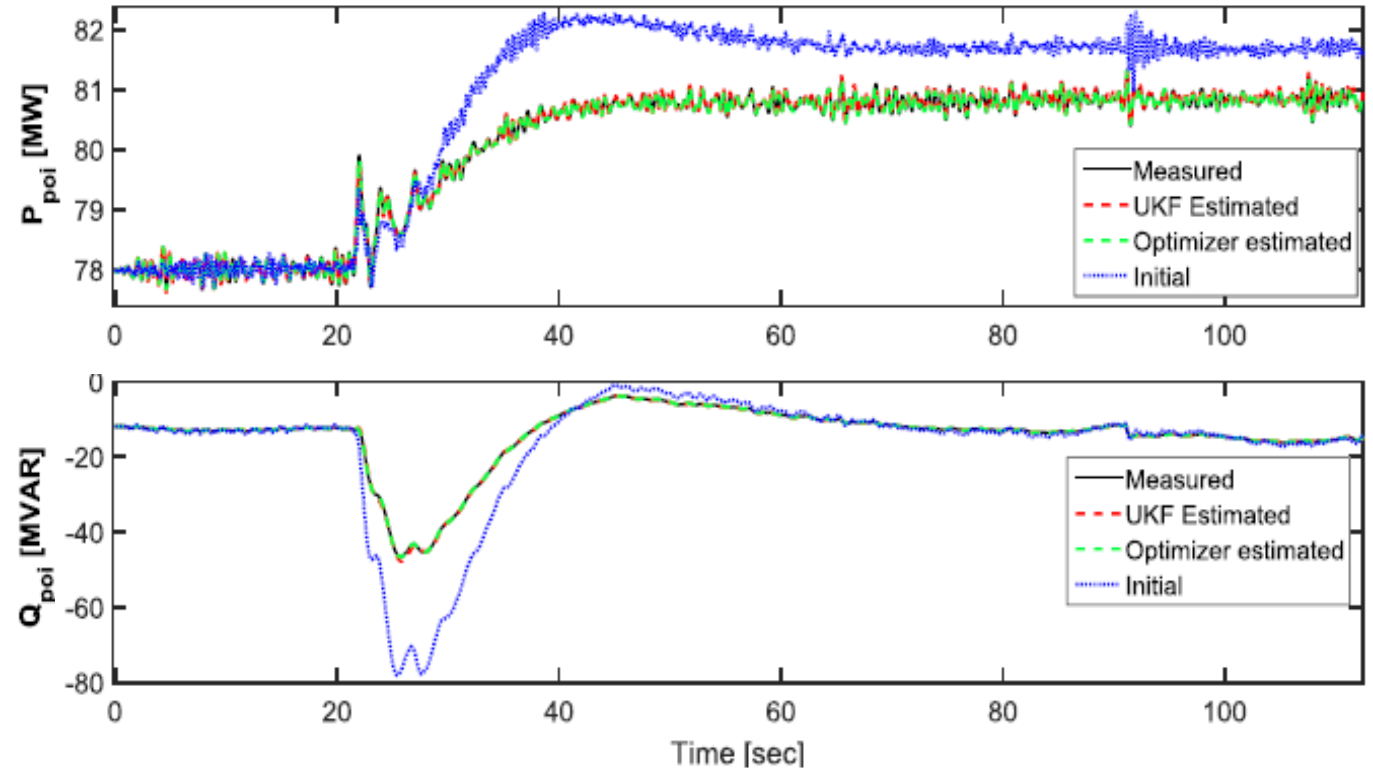
- Faster execution.
- Robustness during abnormality.
- Sequential parameter estimation for real-world sequential events.

Example Result: Hydro Power Plant Model Calibration

PMU data based dynamic model calibration for a Hydro power plant using NERC data set and GE PSLF simulation engine

Parameter name	True	UKF	Optimization	Corrupt
'tpdo'	5.5	6.34	5.78	4.30
'h'	5.5	5.07	5.28	4.00
'lpd'	0.25	0.22	0.26	0.25
'tc'	0.9	0.50	0.94	2.10
'tb'	3.85	2.35	3.70	2.50
'ka'	125	103.13	124.05	50.00
'rperm'	0.065	0.06	0.07	0.05
'tr'	2.4	2.42	2.40	1.20
'tr'	0.012	0.01	0.01	0.01
'ks'	20	20.36	20.01	35.00
RMS ERROR:				
Perror	0	0.0037	0.0009	0.8108
Qerror	0	0.0413	0.0001	64.4184

Legend
Within $\pm 5\%$ of true value
Within $\pm 20\%$ of true value
Within $\pm 50\%$ of true value
Beyond $\pm 50\%$ of true value

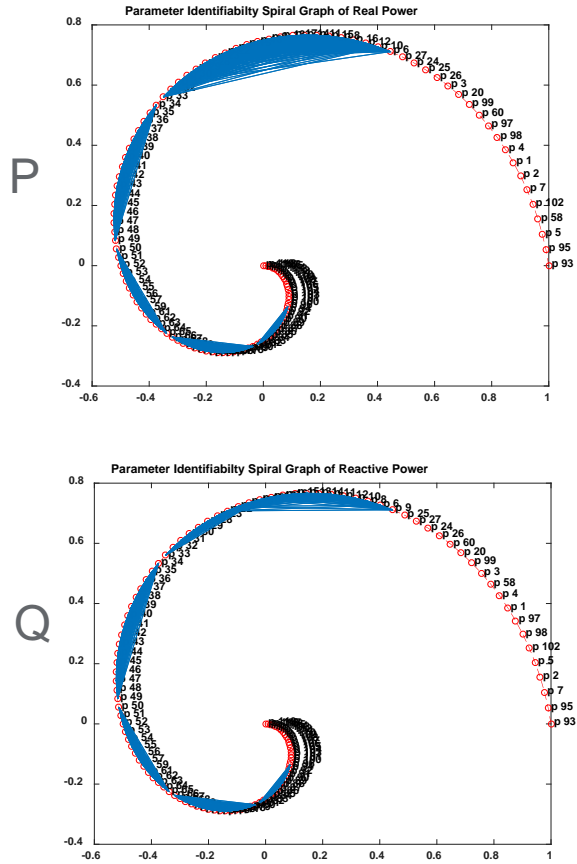


Software Application Steps

Raw Parameters

Parameter	Value
gen100	1.0
gen101	0.5
gen102	1.0
gen103	0.5
gen104	0.5
gen105	0.5
gen106	0.5
gen107	0.5
gen108	0.5
gen109	0.5
gen110	0.5
gen111	0.5
gen112	0.5
gen113	0.5
gen114	0.5
gen115	0.5
gen116	0.5
gen117	0.5
gen118	0.5
gen119	0.5
gen120	0.5
gen121	0.5
gen122	0.5
gen123	0.5
gen124	0.5
gen125	0.5
gen126	0.5
gen127	0.5
gen128	0.5
gen129	0.5
gen130	0.5
gen131	0.5
gen132	0.5
gen133	0.5
gen134	0.5
gen135	0.5
gen136	0.5
gen137	0.5
gen138	0.5
gen139	0.5
gen140	0.5
gen141	0.5
gen142	0.5
gen143	0.5
gen144	0.5
gen145	0.5
gen146	0.5
gen147	0.5
gen148	0.5
gen149	0.5
gen150	0.5
gen151	0.5
gen152	0.5
gen153	0.5
gen154	0.5
gen155	0.5
gen156	0.5
gen157	0.5
gen158	0.5
gen159	0.5
gen160	0.5
gen161	0.5
gen162	0.5
gen163	0.5
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gen165	0.5
gen166	0.5
gen167	0.5
gen168	0.5
gen169	0.5
gen170	0.5
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gen172	0.5
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gen174	0.5
gen175	0.5
gen176	0.5
gen177	0.5
gen178	0.5
gen179	0.5
gen180	0.5
gen181	0.5
gen182	0.5
gen183	0.5
gen184	0.5
gen185	0.5
gen186	0.5
gen187	0.5
gen188	0.5
gen189	0.5
gen190	0.5
gen191	0.5
gen192	0.5
gen193	0.5
gen194	0.5
gen195	0.5
gen196	0.5
gen197	0.5
gen198	0.5
gen199	0.5
gen200	0.5

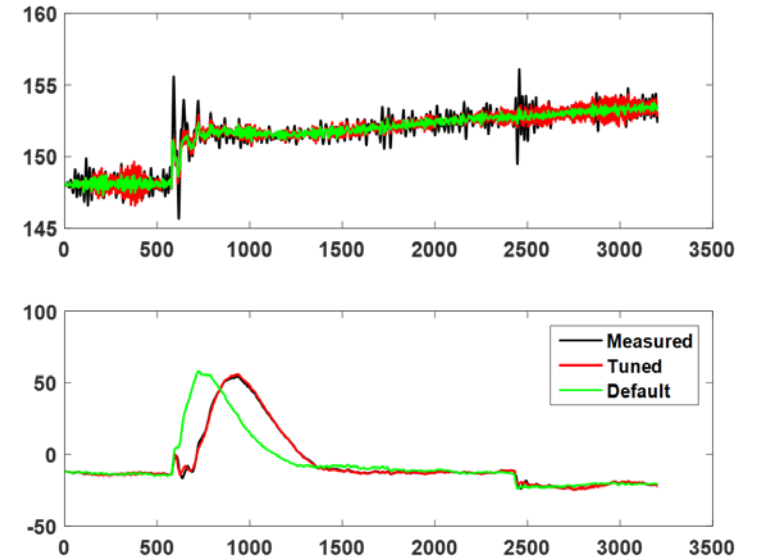
Step I: Identifiability



Down select parameters

Parameter	Value
gen100	1.0
gen101	0.5
gen102	1.0
gen103	0.5
gen104	0.5
gen105	0.5
gen106	0.5
gen107	0.5
gen108	0.5
gen109	0.5
gen110	0.5
gen111	0.5
gen112	0.5
gen113	0.5
gen114	0.5
gen115	0.5
gen116	0.5
gen117	0.5
gen118	0.5
gen119	0.5
gen120	0.5
gen121	0.5
gen122	0.5
gen123	0.5
gen124	0.5
gen125	0.5
gen126	0.5
gen127	0.5
gen128	0.5
gen129	0.5
gen130	0.5
gen131	0.5
gen132	0.5
gen133	0.5
gen134	0.5
gen135	0.5
gen136	0.5
gen137	0.5
gen138	0.5
gen139	0.5
gen140	0.5
gen141	0.5
gen142	0.5
gen143	0.5
gen144	0.5
gen145	0.5
gen146	0.5
gen147	0.5
gen148	0.5
gen149	0.5
gen150	0.5
gen151	0.5
gen152	0.5
gen153	0.5
gen154	0.5
gen155	0.5
gen156	0.5
gen157	0.5
gen158	0.5
gen159	0.5
gen160	0.5
gen161	0.5
gen162	0.5
gen163	0.5
gen164	0.5
gen165	0.5
gen166	0.5
gen167	0.5
gen168	0.5
gen169	0.5
gen170	0.5
gen171	0.5
gen172	0.5
gen173	0.5
gen174	0.5
gen175	0.5
gen176	0.5
gen177	0.5
gen178	0.5
gen179	0.5
gen180	0.5
gen181	0.5
gen182	0.5
gen183	0.5
gen184	0.5
gen185	0.5
gen186	0.5
gen187	0.5
gen188	0.5
gen189	0.5
gen190	0.5
gen191	0.5
gen192	0.5
gen193	0.5
gen194	0.5
gen195	0.5
gen196	0.5
gen197	0.5
gen198	0.5
gen199	0.5
gen200	0.5

Step II: Parameter Estimation



Red -> corrupt

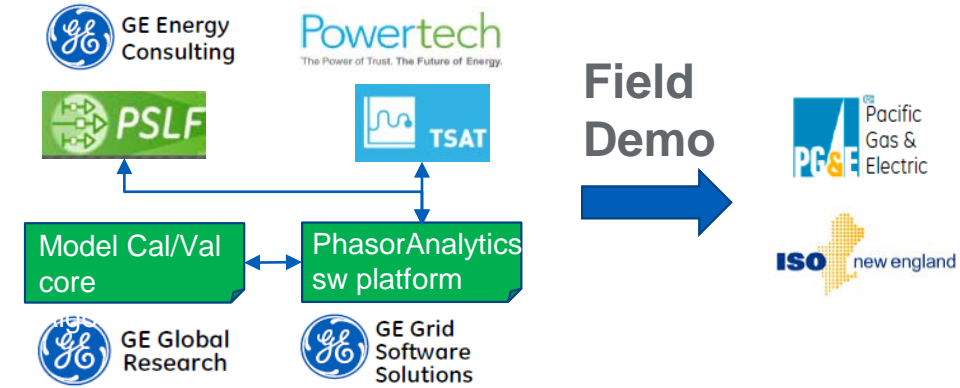
Dark Grey -> to be identified



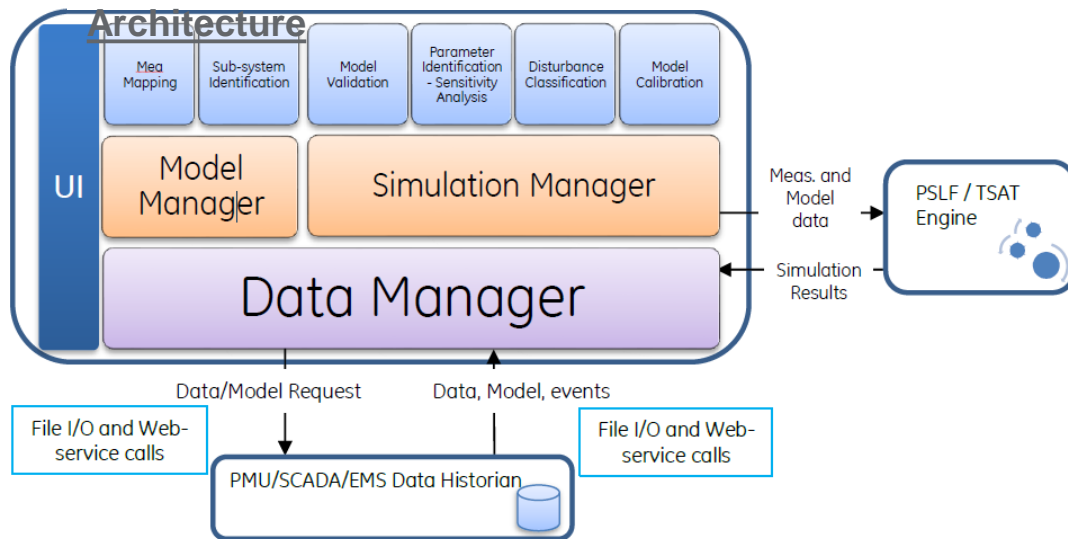
Product Integration (PhasorAnalytics)

Lesson Learned

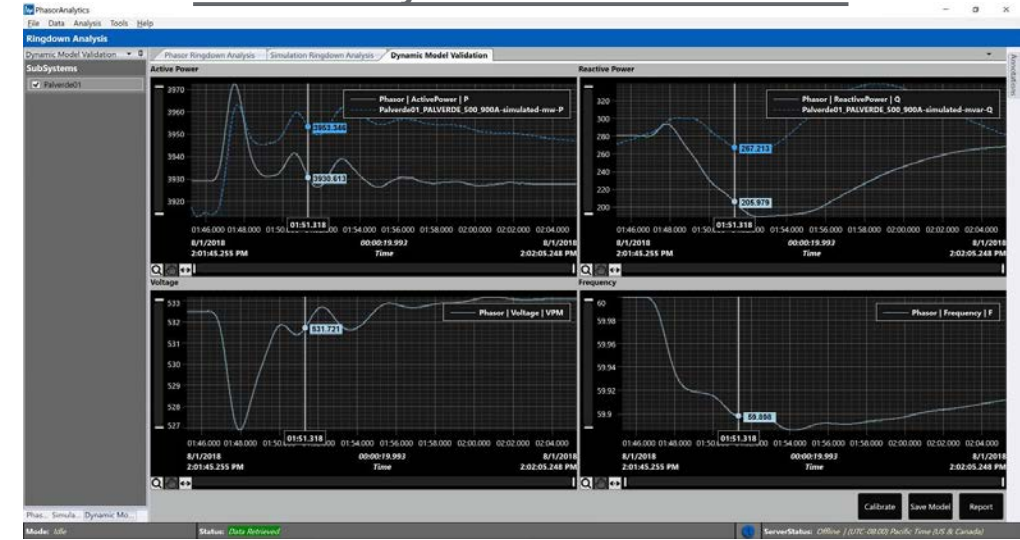
- Compatibility: Matlab (prototype) vs. C# (application)
- Performance: multi-platform handshake time longer than expected
- Robustness: exception handling & measurement noise
- Customer voice: fast iteration with utility partners



GE PhasorAnalytics SW



PhasorAnalytics: Model Validation UI



GRC works closely with Biz team and utility partners for product integration & tests

Live Demo

