

PJM Use Case of Synchrophasors – Automated Generator Model Validation (AGMV)

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Introduction

Motivation

EPG's Tool – GMV

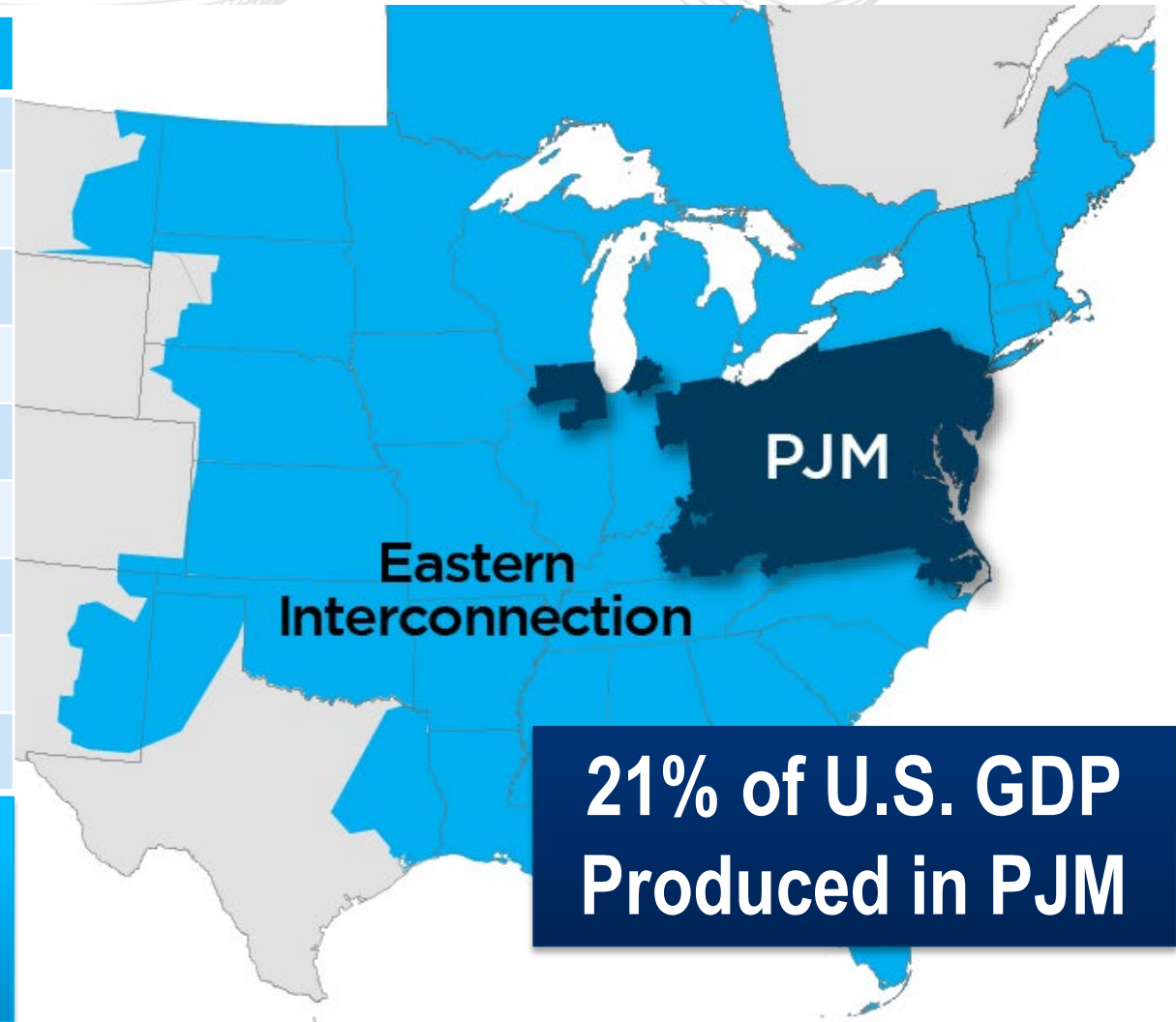
PJM Deployment – AGMV

Conclusion

Key Statistics

Member companies	1,110+
Millions of people served	65+
Peak load in megawatts	165,563
Megawatts of generating capacity	183,254
Miles of transmission lines	88,115
Gigawatt hours of annual energy	795
Generation sources	1,419
Square miles of territory	368,906
States served	13 + DC

- 26% of generation in Eastern Interconnection
- 25% of load in Eastern Interconnection
- 20% of transmission assets in Eastern Interconnection



**21% of U.S. GDP
Produced in PJM**

As of 2/2023

1,000 

Total PMUs
including external
companies



of PMU data
storage daily

(real time – 4 TB for 90 days)

----- Calculated Values -----

Real time: 7 TB for 90 days

3-Year Archive: 80 TB

750 

PMUs installed
within PJM

 30x

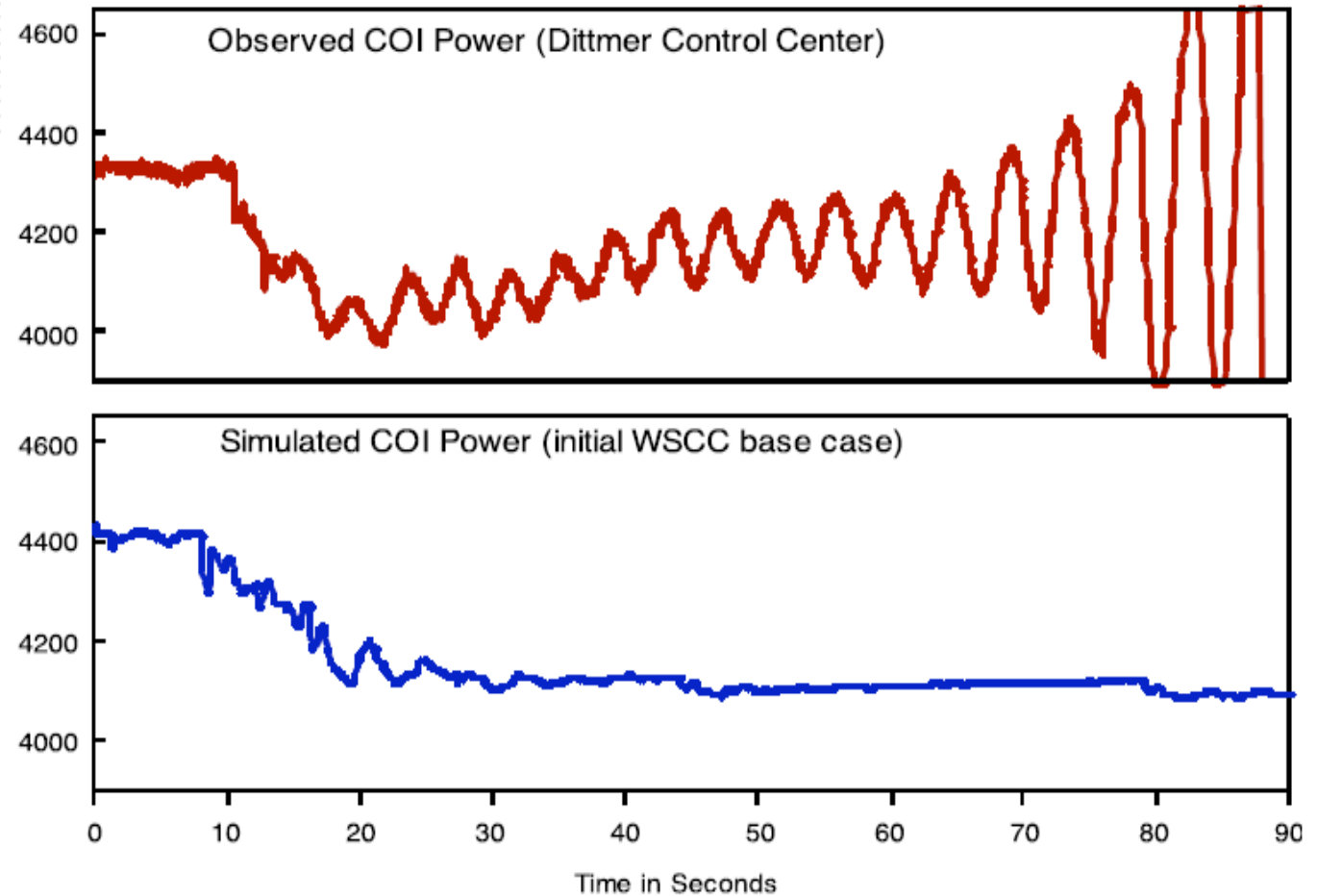
per second
sampling rate

245 

Substations
with PMUs installed

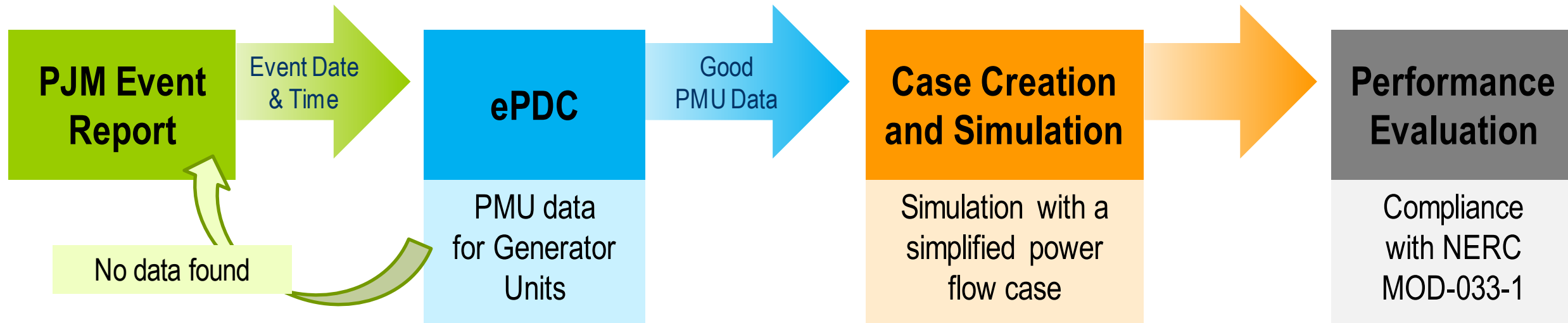
Need for Model Validation

- Dynamic models are used to represent transient behavior during grid disturbances.
- Inaccurate models can lead to incorrect assessment of system responses



Source: NERC Reliability Guideline, Power Plant Dynamic Model Verification using PMUs, September 2016

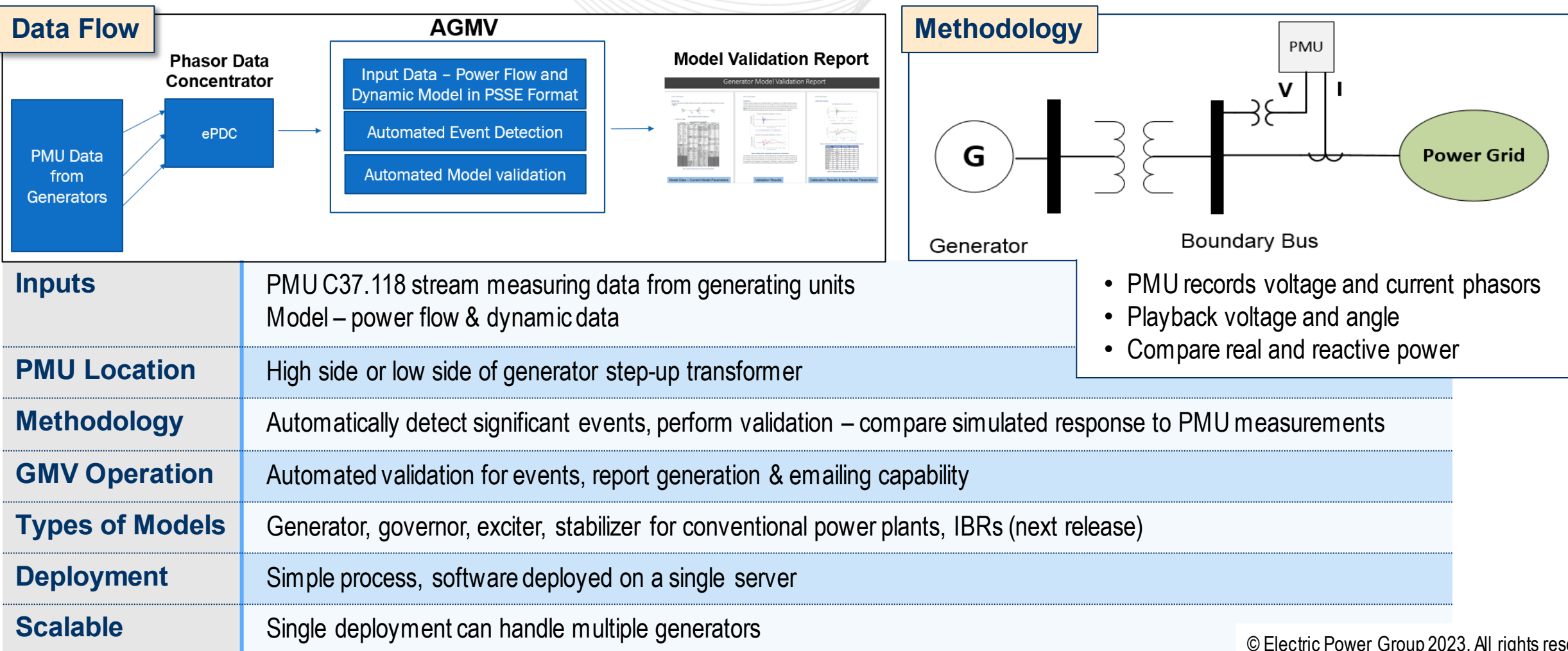
Prior to AGMV: PJM Manual Process for GMV



W. Qiu, T. He, B. Choi and Y. Mao, "PJM Static and Dynamic Model Validation Efforts and Experiences for MOD-033," IEEE PES General Meeting, 2017.

EPG's Generator Model Validation (GMV)

Use of PMU Data for Automated Validation of Generator Models



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Automated Generator Model Validation (AGMV) – Real-Time

- Run continuously as a service, automatically triggered after significant events
- Validate multiple events and multiple generators simultaneously
- Quantify mismatch and identify good vs. questionable (programmatic not visual)¹
- Automated email report generation for NERC compliance

Offline Generator Model Validation and Calibration

- Perform detailed analysis offline
- Sensitivity analysis to identify key parameters
- Calibration and tuning to correct the generator model
- Generate automated report for NERC compliance

¹W. Ju, N. Nayak et al., “Indices for Automated Identification of Questionable Generator Models Using Synchrophasors,” *2020 IEEE Power & Energy Society General Meeting (PESGM)*, Montreal, QC, Canada, 2020, pp. 1–5

Example Report

Generator Validation for Event 1

Event Information

Event File Name: Load Trip Event 08-21-2023 02:45-11:412 PM.csv

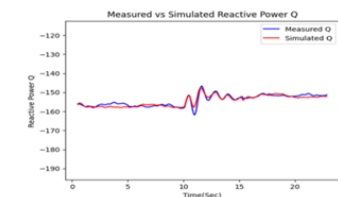
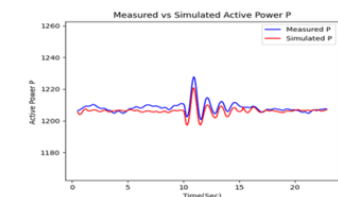
Table I: Summary of Validation Results

Variable	Value
Number of generator models validated	1
Number of good generator models	1
Number of questionable generator models	0

Table II: Summary of Validation Results for Individual Generators

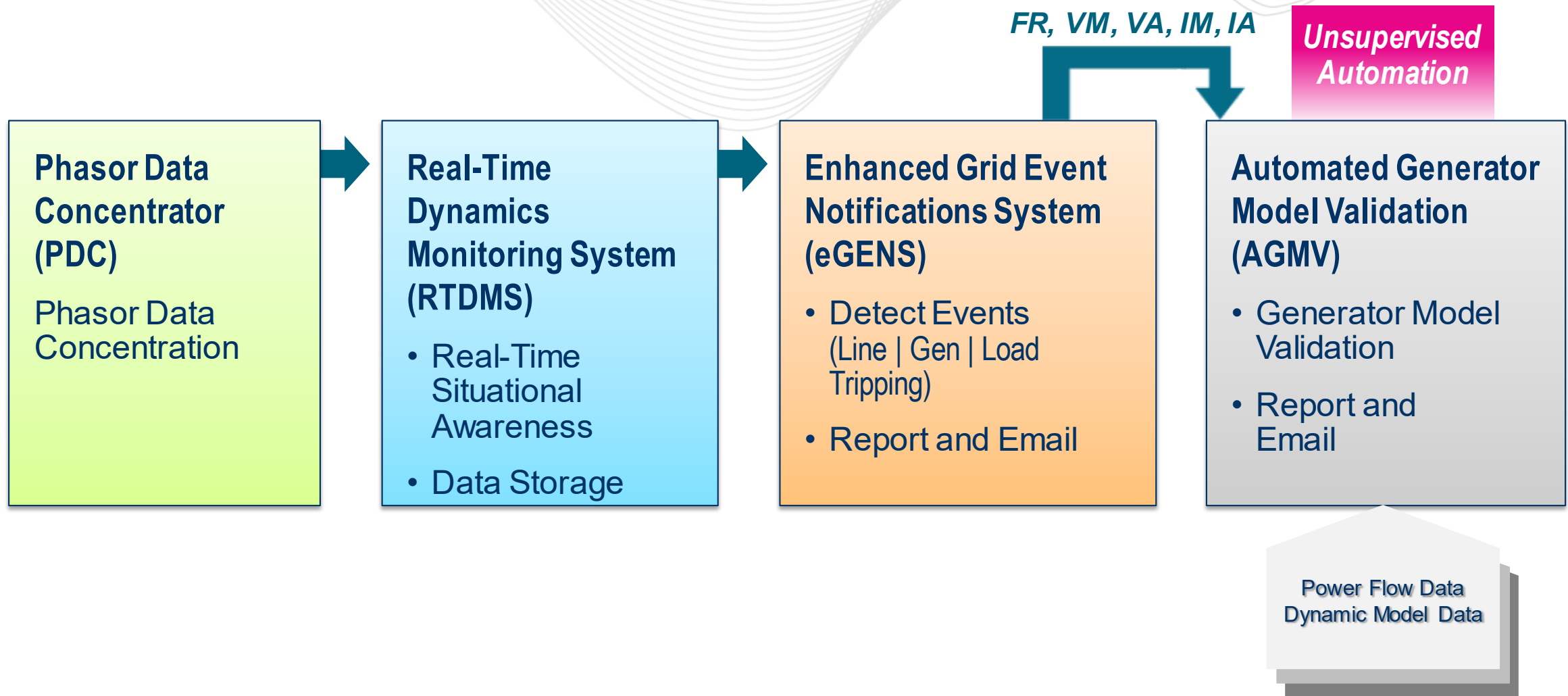
Generator ID	Validity
GENERATOR 1	Good

Validation plots for Generator1



Validation Criteria for Generator1

Variable	P	Q	Criteria
RMSD	0.002375	0.006282	<0.2
Comprehensive Similarity	0.794	0.861	>0.5



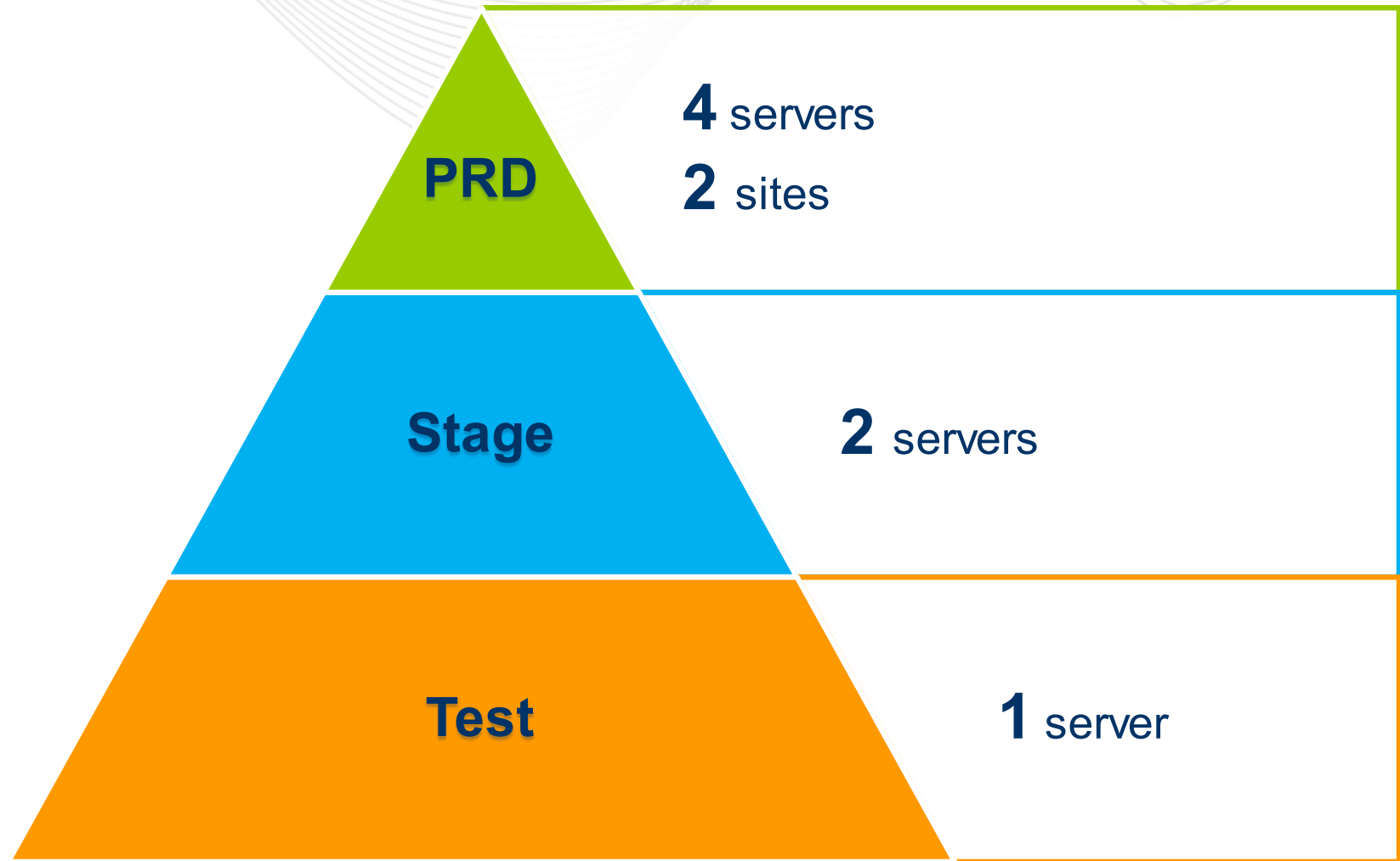
THEN

NOW

COMPARISONS

Months	Weeks
Manual (No PMUs)	Manual (PMUs Without Automation)
Establish system conditions	Identify events
Manually draft NERC MOD-033 report	
Once every two years for NERC compliance	

Minutes
AGMV
Unsupervised automation
Automated report for NERC MOD-033
Automated for each system event



PRD:
Production

		Generator	Event
Example	1	Unit 1	A – Line Tripping
	2	Unit 1	B – Line Tripping
	3	Unit 2	C – Line Tripping
	4	Unit 2	D – Load Tripping

Example 1: Unit 1 With Line Tripping Event A

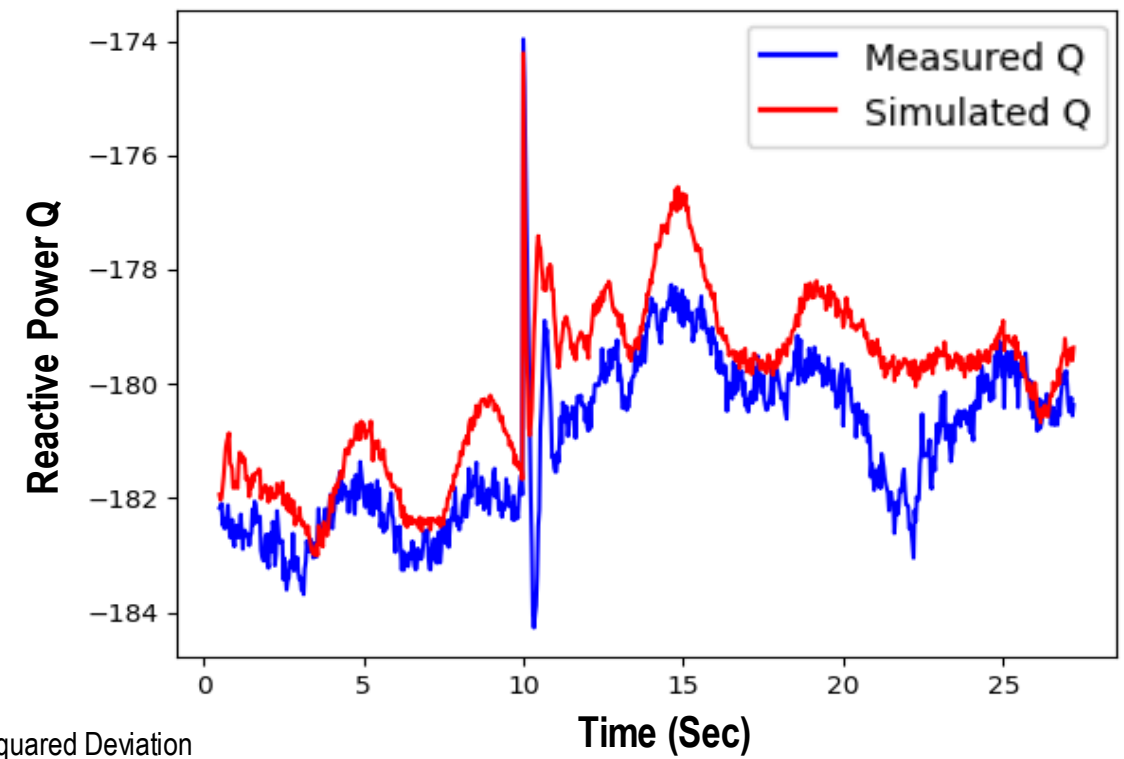
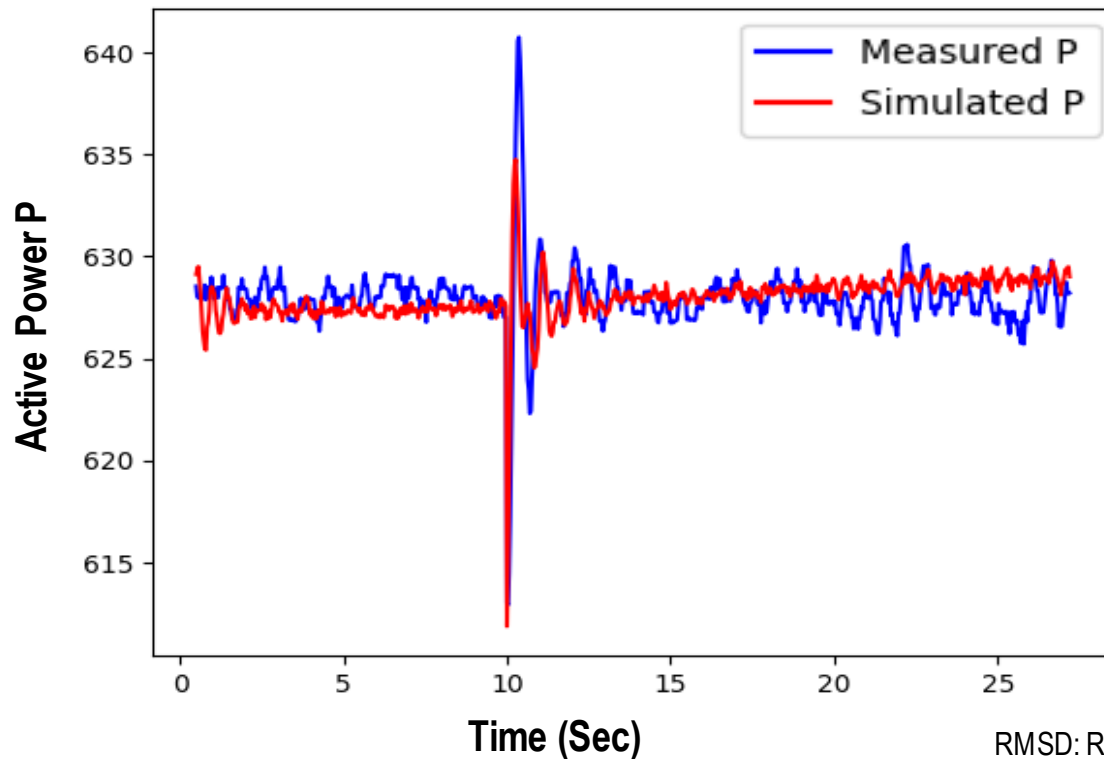
Summary of Validation Results

Generator ID	Validity
Unit 1	Questionable

Validation Criteria

Variable	P	Q	Criteria
RMSD	0.002398	0.00738	<0.09
Comprehensive Similarity	0.596	0.671	>0.85

Measured VS. Simulated:



RMSD: Root Mean Squared Deviation

Example 2: Unit 1 With Line Tripping Event B

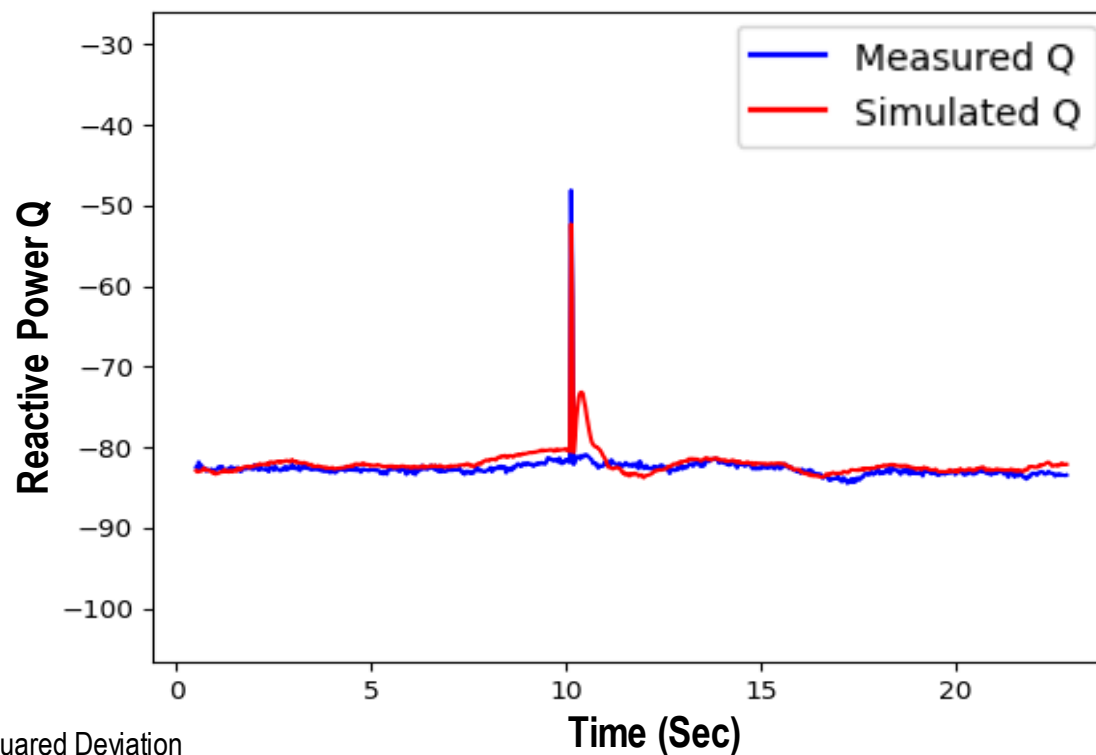
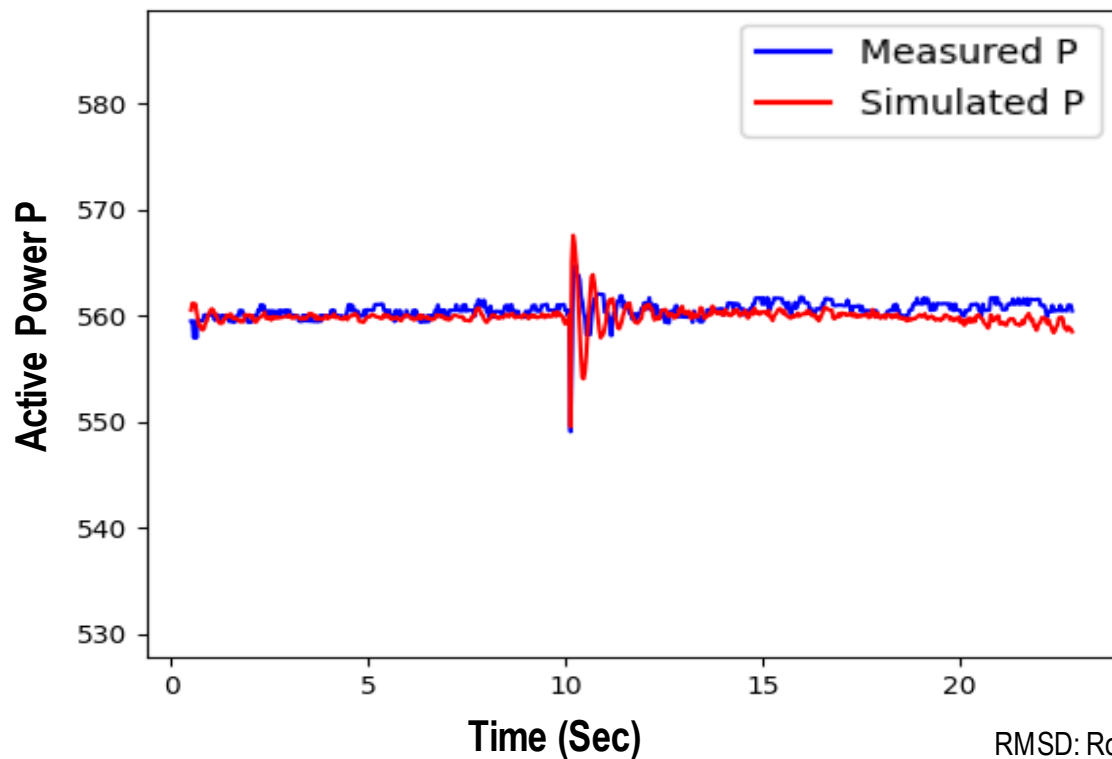
Summary of Validation Results

Generator ID	Validity
Unit 1	Good

Validation Criteria

Variable	P	Q	Criteria
RMSD	0.002322	0.01503	<0.1
Comprehensive Similarity	0.47	0.761	>0.4

Measured VS. Simulated:



RMSD: Root Mean Squared Deviation

Example 3: Unit 2 With Line Tripping Event C

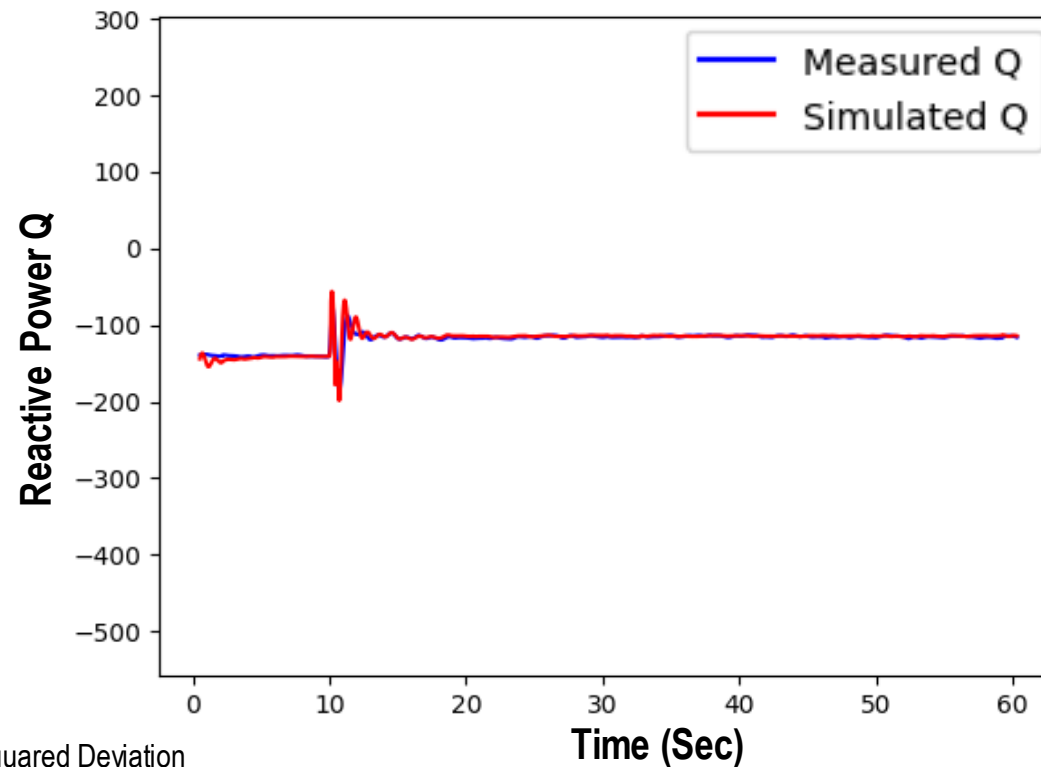
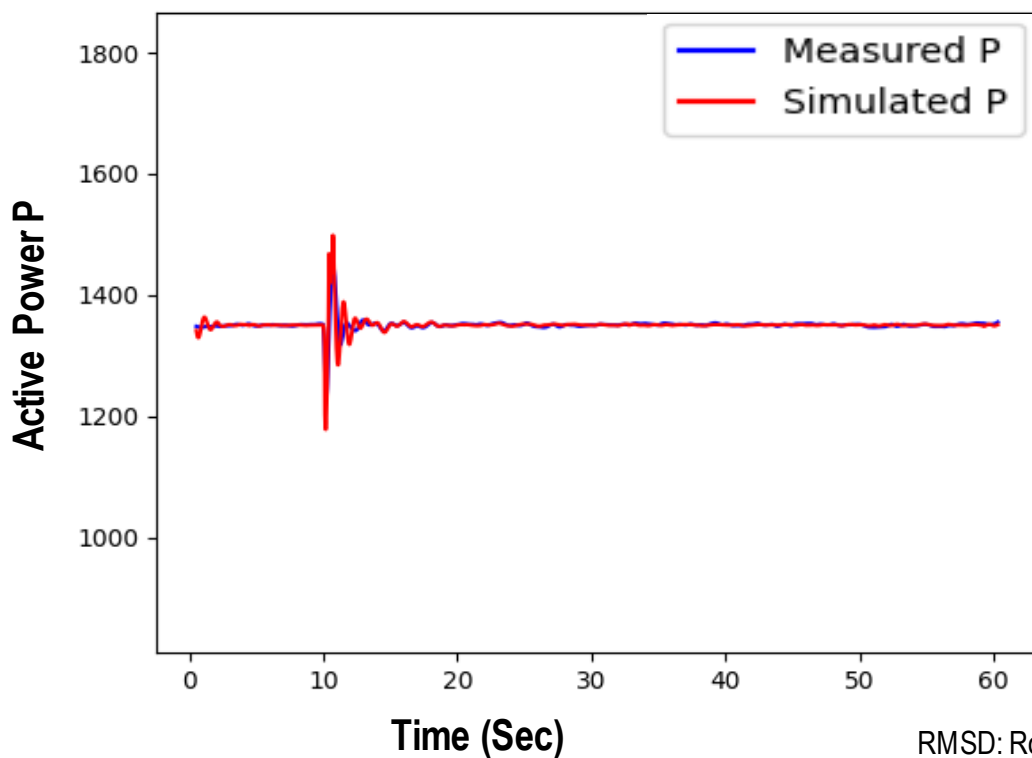
Summary of Validation Results

Generator ID	Validity
Unit 2	Good

Validation Criteria

Variable	P	Q	Criteria
RMSD	0.006398	0.035034	<0.2
Comprehensive Similarity	0.775	0.819	>0.5

Measured VS. Simulated:



RMSD: Root Mean Squared Deviation

Example 4: Unit 2 With Load Tripping Event D

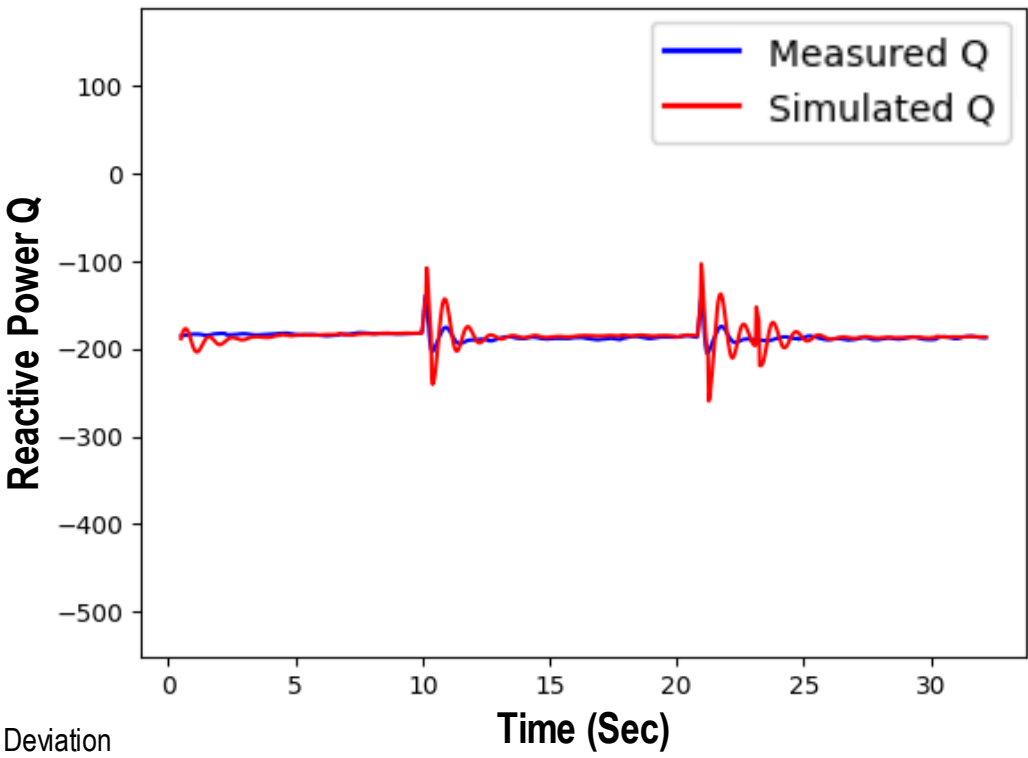
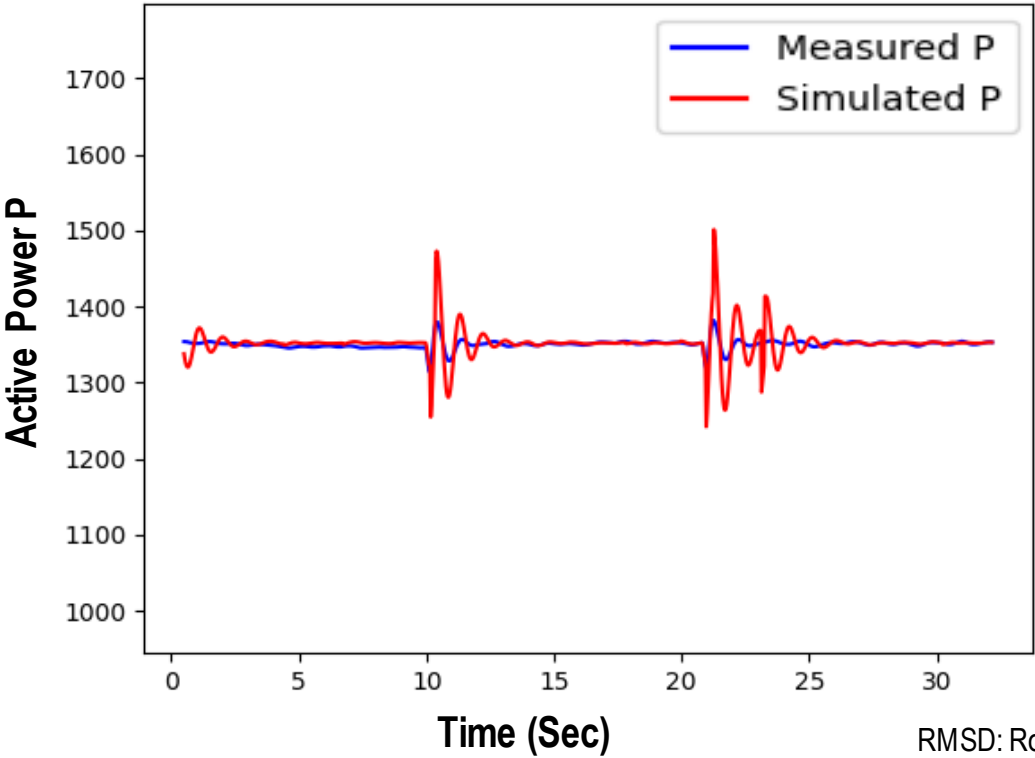
Summary of Validation Results

Generator ID	Validity
Unit 2	Good

Validation Criteria

Variable	P	Q	Criteria
RMSD	0.012649	0.049485	<0.2
Comprehensive Similarity	0.633	0.682	>0.5

Measured VS. Simulated:



RMSD: Root Mean Squared Deviation

Criteria

	Generator	Event	Validation Result	Criteria	
				RMSD	Comprehensive Similarity
1	Unit 1	A – Line Tripping	Questionable	< 0.09	> 0.85
2	Unit 1	B – Line Tripping	Good	< 0.1	> 0.4
3	Unit 2	C – Line Tripping	Good	< 0.2	> 0.5
4	Unit 2	D – Load Tripping	Good	< 0.2	> 0.5

BENEFITS TO PJM

Greatly
Reduce
Workload

Unsupervised
Automation

No Engineering
Judgement
Needed for
Criteria Setting

One Event
to Validate
Multi-Gens

Re-run
Capability

Statistical Analysis for Better Criteria Threshold Setup

Use reports from all previous events.

Model Validation for IBRs

Playback alone with PMU data may not be enough.

Other model parameters (like voltage control reference) might also be needed.