



U.S. DEPARTMENT OF
ENERGY

Nuclear Energy

Office Of Nuclear Energy Sensors and Instrumentation Annual Review Meeting

Robust Online Monitoring Technology for Recalibration Assessment of Transmitters and Instrumentation

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Project Overview

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- **Goal: Develop and evaluate a standardized framework for next-generation online monitoring applicable to current and future nuclear systems**

 - **Participants:**
 - PNNL (Pradeep Ramuhalli, Susan Crawford)
 - University of Tennessee (Jamie Coble)
 - AMS (Brent Shumaker)

 - **Research directly supports primary goals of**
 - LWRS, ART, NGNP, MPACT

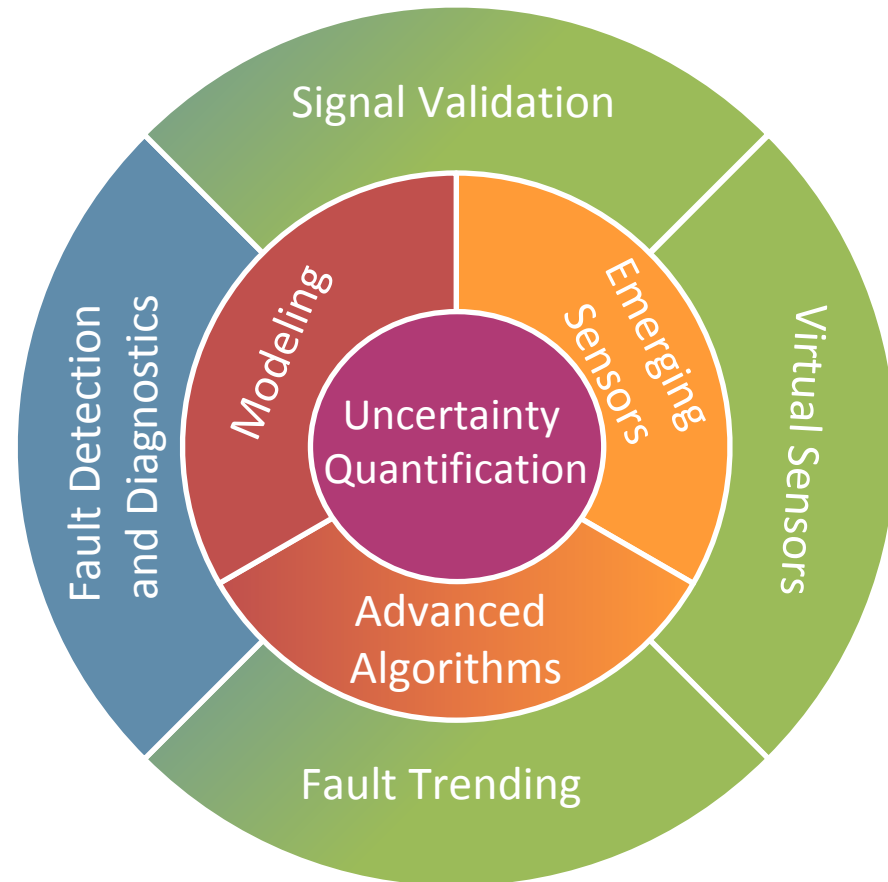
 - **Supports secondary goals of**
 - AF and UNFD



Objectives

■ Develop next-generation online monitoring applicable to current and future nuclear systems

- Apply data-driven UQ to develop methods for real-time calibration assessment and signal validation
- Robust virtual sensors to augment available plant information
- Technologies for sensor response-time characterization
- Considerations for emerging I&C technologies





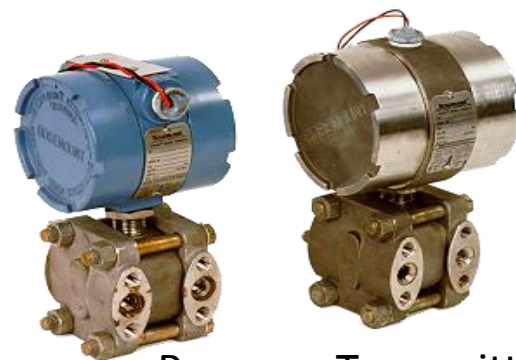
Project Background

■ Measurement reliability key to safe, economic and secure operation of nuclear systems

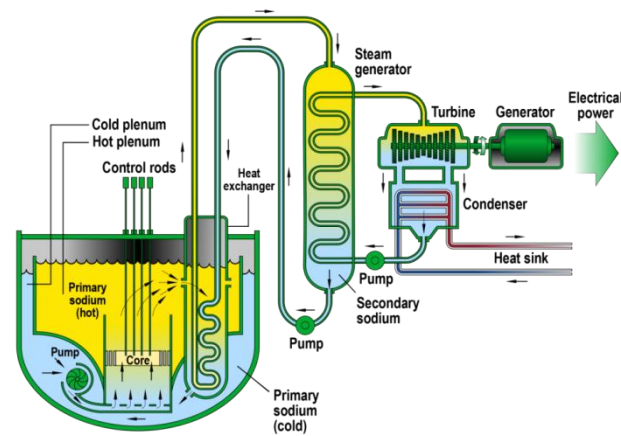
- Interval-based recalibration used to assure reliability

■ Current practices have several drawbacks

- Time consuming and expensive
- Sensor calibration assessed infrequently
- Contributes to ALARA
- Unnecessary maintenance may damage healthy sensors
- Potential for limited opportunities for maintenance in future nuclear systems
- Different failure mechanisms for next-generation sensors and I&C



Pressure Transmitters



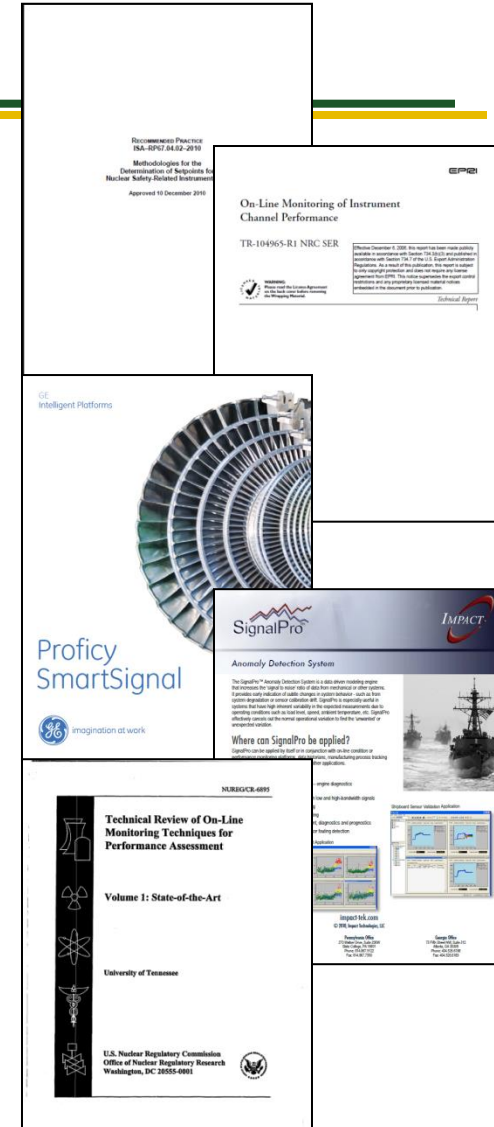


Sensor Performance Monitoring can Improve Reliability of Sensing

■ Online monitoring (OLM) supports condition-based calibration of key instrumentation

■ OLM technologies can

- Temporarily accommodate limited sensor failure
- Provide indications for measurements that cannot be made (virtual sensors)
- Ensure reliability of next-generation sensors and instrumentation through formal methods for uncertainty quantification
- Support extended sensor calibration cycles and reduce or eliminate TS-required periodic recalibration



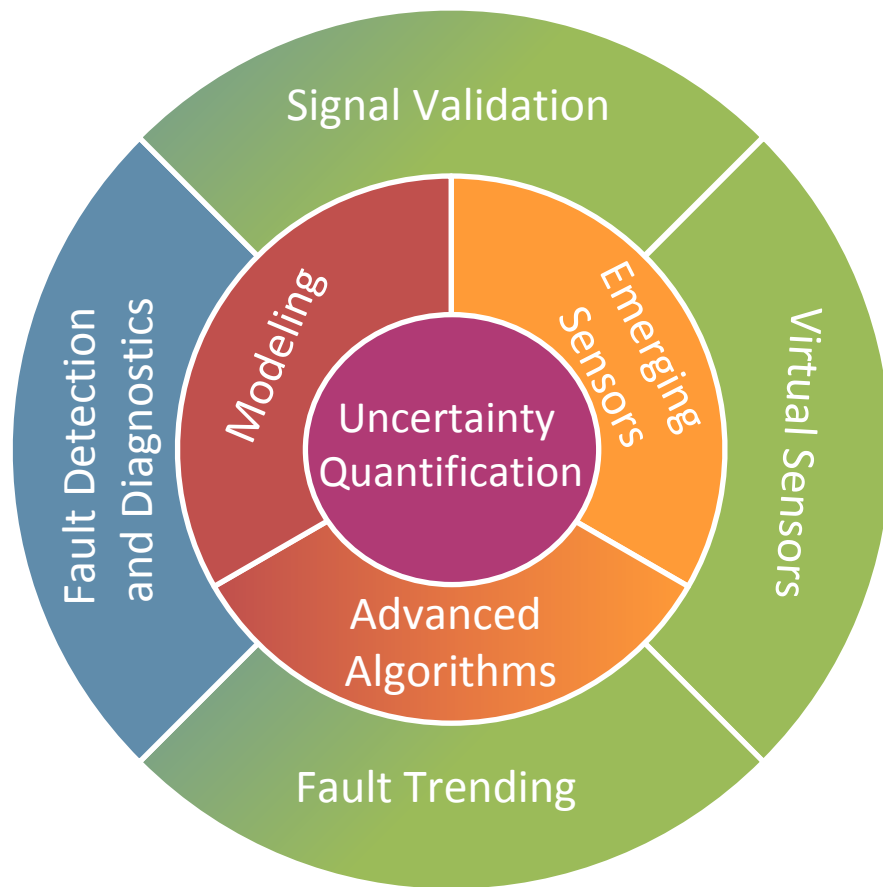


Technology Impact

■ Standardized framework for next generation OLM that enables

- Recalibration needs assessment for dynamic and steady-state operation
- Ability to derive plant information that currently cannot be measured
- Predictive (over short-term) assessment of sensor failure
- OLM framework for emerging I&C technologies

■ Applicability to current and future nuclear power systems





Research Plan (FY2015-FY2017)

■ Signal validation and virtual sensors

- Evaluate how uncertainty drives minimum detection limits and acceptance criteria
- Estimate expected measurement values (and associated uncertainties) for replacing faulted sensors
- Evaluate the effect of using virtual sensors on OLM and OLM uncertainty
- Develop guidelines for condition-based sensor recalibration

■ Assess impacts of next generation sensors and instrumentation

- Requirements definition for OLM in next generation I&C
- Gaps assessment: Map algorithms (from other tasks) to requirements

■ Response time OLM

- Acceptance criteria development
- Adapt research in signal validation for response time OLM

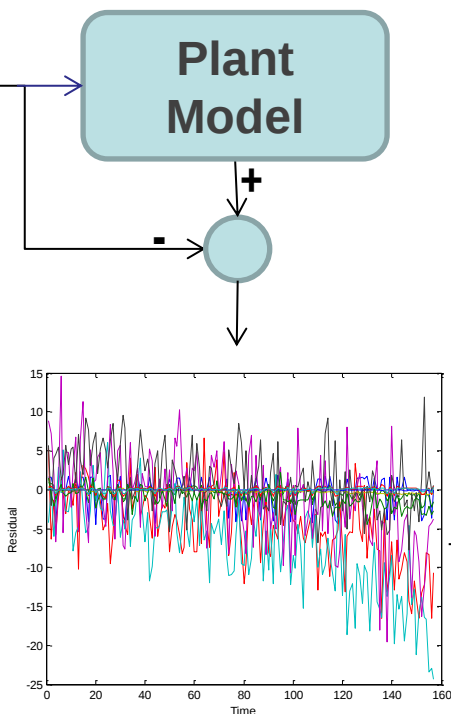
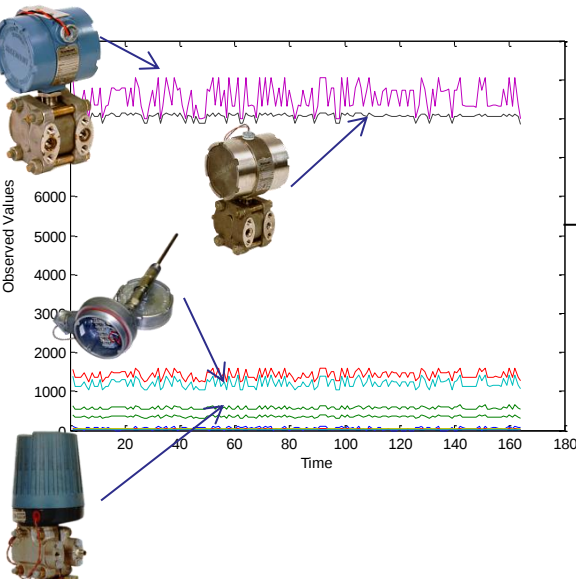
■ Verification and validation in a suitable test-bed or operating plant

■ Budget

- Planned \$1M over three years (FY2015-FY2017)



Technical Approach: Online Monitoring Overview

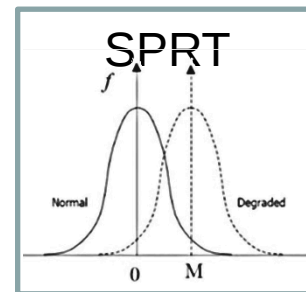


■ Non-intrusive

- Plant data collected during operation

■ Anomalies due to sensor fault vs. process change

■ Acceptance criteria define normal performance bounds



Process Fault?
Sensor Fault?



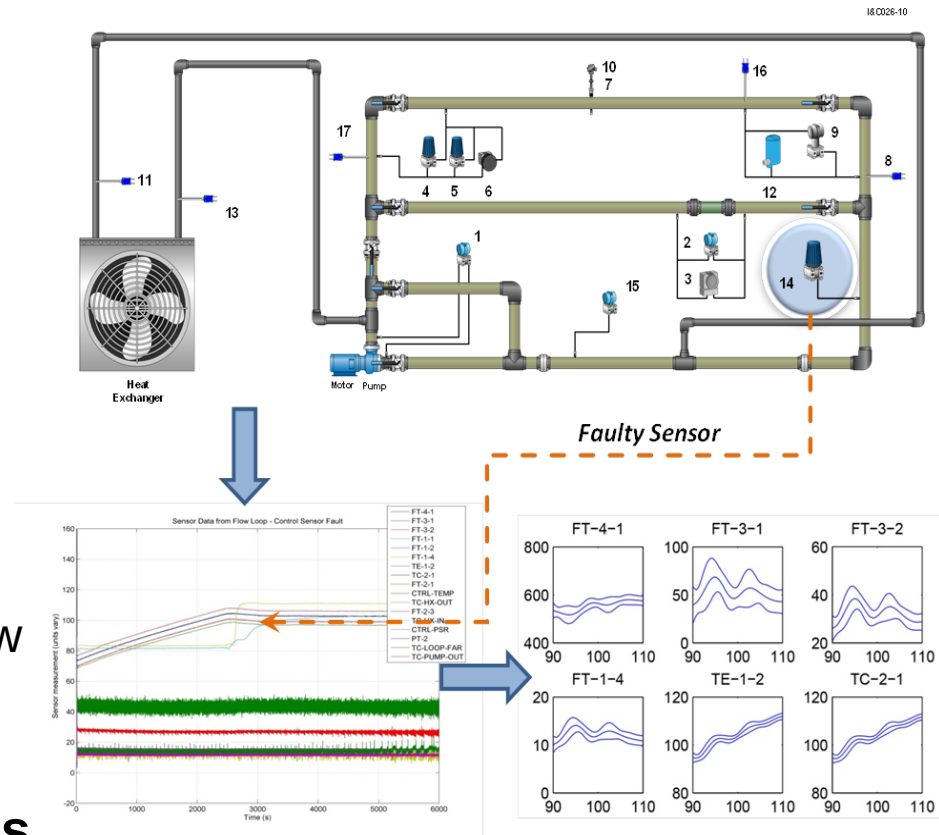
Accurate Uncertainty Quantification is Important to Online Monitoring

- **Uncertainty is inherent in any measurement process**
 - Process noise, sensor bias, electronic and measurement noise, etc.
- **OLM introduces new uncertainties**
 - Modeling uncertainty and bias
- **Current approach to evaluating measurement uncertainty may be overly conservative**
 - Uses manufacturer estimates of sensor noise
 - Conservative assumptions about sensor performance over the operating period
- **OLM uncertainty not independent of measurement uncertainty**
 - Both need to be considered together



Prior Work: Uncertainty Quantification (UQ)

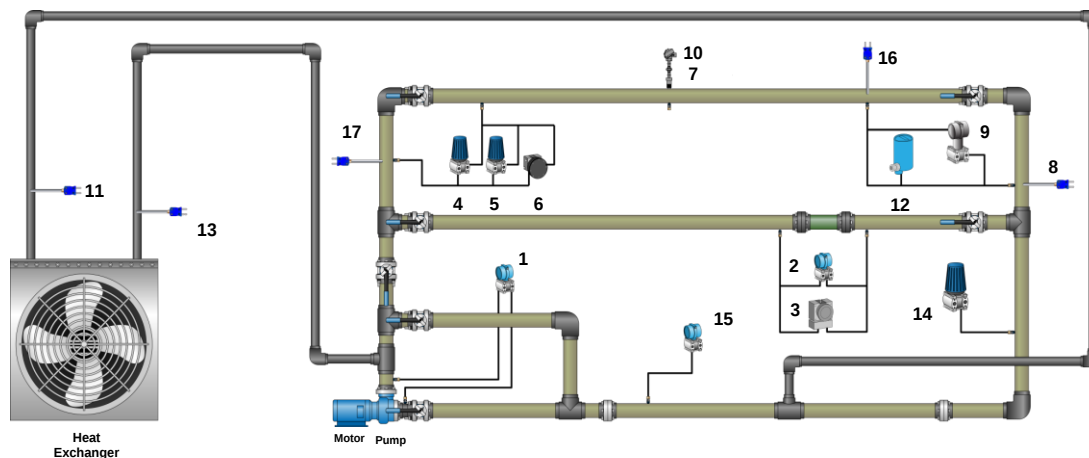
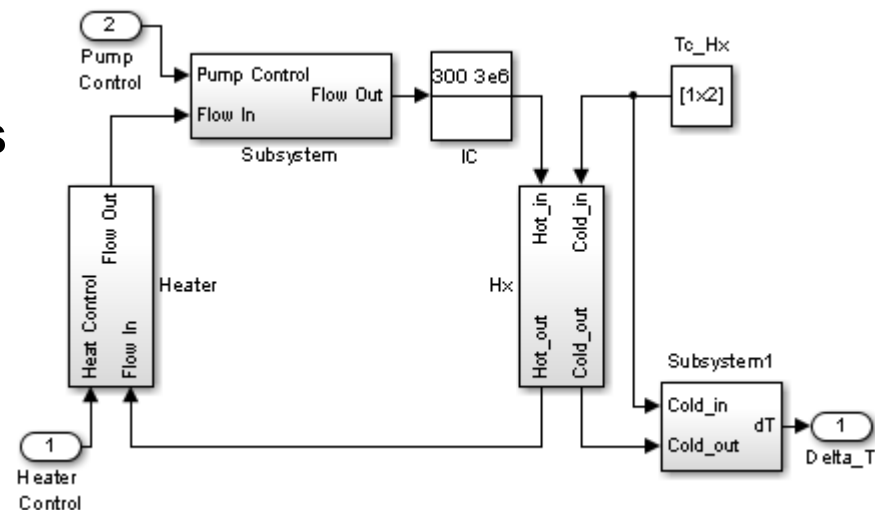
- **Use Bayesian statistics to quantify uncertainty**
 - Combine what we already know (Prior) and the model discrepancy with the data (Likelihood).
- **Model represents relation between inputs (independent variables) and outputs (sensor outputs)**
 - Update the model in the light of new observations
- **Likelihood information using multi-output Gaussian processes that explicitly treat correlations between distinct output variables as well as space and/or time.**





Data from Simulations and Testbeds to Evaluate UQ Methodology

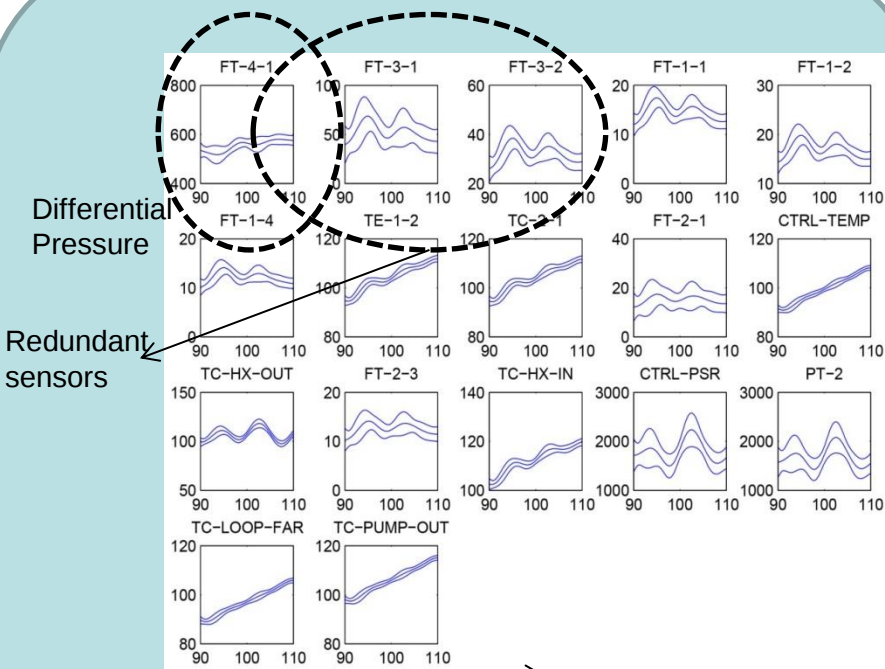
- Simple heat exchanger loop
- Sensor and instrumentation models coupled to loop model
- Prescribed uncertainty levels to directly study effects on sensed values and OLM results
 - Normal and anomalous conditions



ITEM	ID	SENSOR TYPE	MANUFACTURER
1	FT-4-1	DIFFERENTIAL PRESSURE	ROSEMOUNT
2	FT-3-1	DIFFERENTIAL PRESSURE (SMART)	ROSEMOUNT
3	FT-3-2	DIFFERENTIAL PRESSURE	BARTON
4	FT-1-1	DIFFERENTIAL PRESSURE	FOXBORO
5	FT-1-2	DIFFERENTIAL PRESSURE	FOXBORO
6	FT-1-4	DIFFERENTIAL PRESSURE (SMART)	BARTON
7	TE-1-2	RTD (SMART)	ROSEMOUNT
8	TC-2-1	THERMOCOUPLE TYPE-J (SMART)	ROSEMOUNT
9	FT-2-1	DIFFERENTIAL PRESSURE	SCHLUMBERGER
10	CTRL-TEMP	RTD (SMART)	ROSEMOUNT
11	TC-HX-OUT	THERMOCOUPLE TYPE-J	OMEGA
12	FT-2-3	DIFFERENTIAL PRESSURE	HONEYWELL
13	TC-HX-IN	THERMOCOUPLE TYPE-J	OMEGA
14	CTRL-PSR	GAUGE PRESSURE	FOXBORO
15	PT-2	GAUGE PRESSURE	ROSEMOUNT
16	TC-LOOP-FAR	THERMOCOUPLE TYPE-E	OMEGA
17	TC-PUMP-OUT	THERMOCOUPLE TYPE-K	OMEGA



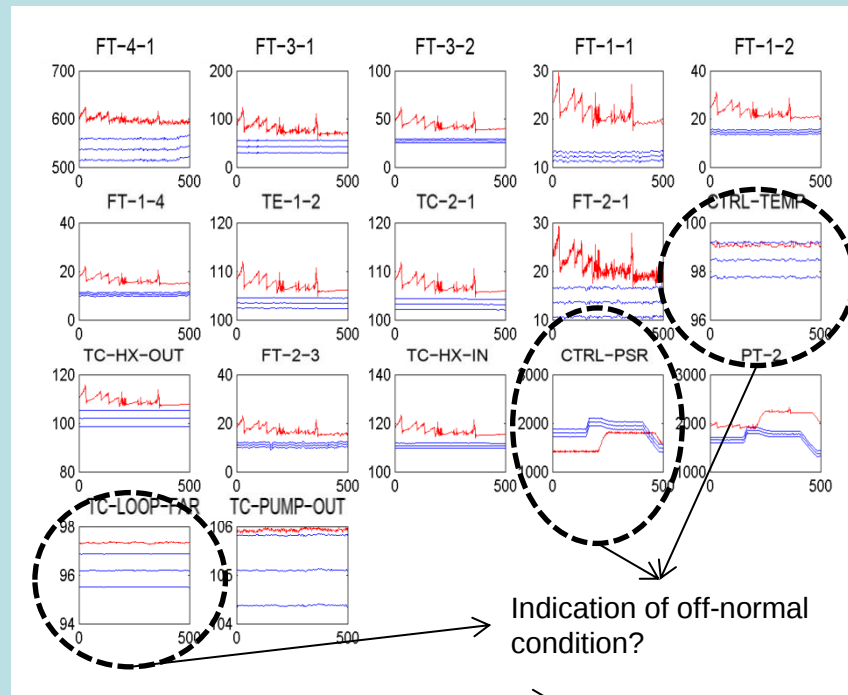
Results from UQ



Control Temperature (°F)

Data from Normal Operations

Snapshot in time (uncertainty bounds
change with time)



Time (samples)

Data from Control Pressure Sensor Fault

Snapshot over time window, using
models in predictive mode



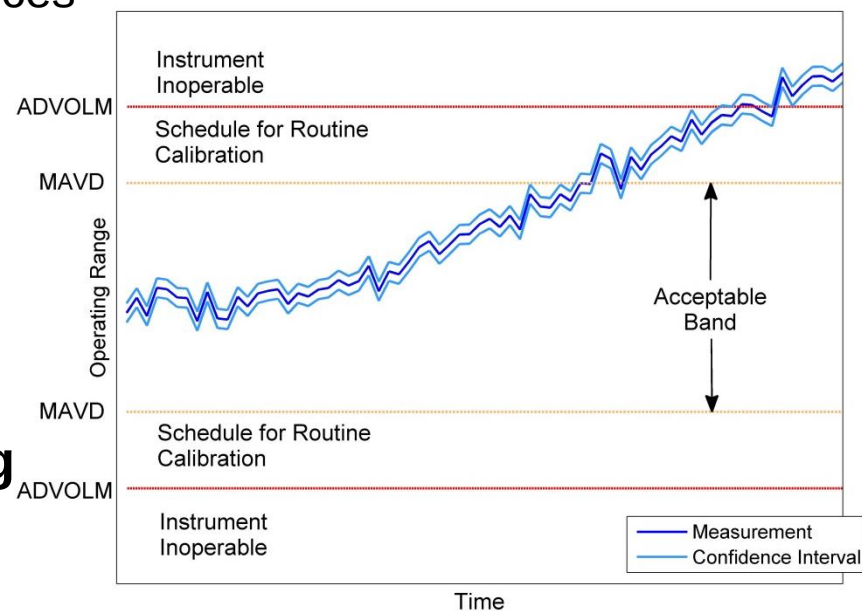
Accomplishments

- Reviewed state of the art in OLM for sensor calibration assessment and identified technical gaps (PNNL-21687)
- Development of framework for data-driven uncertainty quantification (PNNL-22847.R1)
- Journal/Conference papers and presentations
 - “Extending Sensor Calibration Intervals in Nuclear Power Plants,” *Transactions of the ANS* 107:327-328, 2012.
 - “Recalibration methodology for transmitters and instrumentation,” 2012 ANS NPIC/HMIT
 - “Calibration Monitoring for Sensor Calibration Interval Extension: Identifying Technical Gaps,” 2012 Future of Instrumentation International Workshop
 - “Online Sensor Calibration Assessment in Nuclear Power Systems,” *Invited paper, IEEE I&M Magazine* 16(3):32-37, 2013. doi: 10.1109/MIM.2013.6521132
 - “Advanced algorithms for online calibration monitoring of transmitters and instrumentation,” Presented at *ANS Utility Working Conference* (August 2013)
 - “Approaches to quantify uncertainty in online sensor calibration monitoring,” 2013 ANS Winter Meeting.



Path Forward: Signal Validation & Emerging I&C

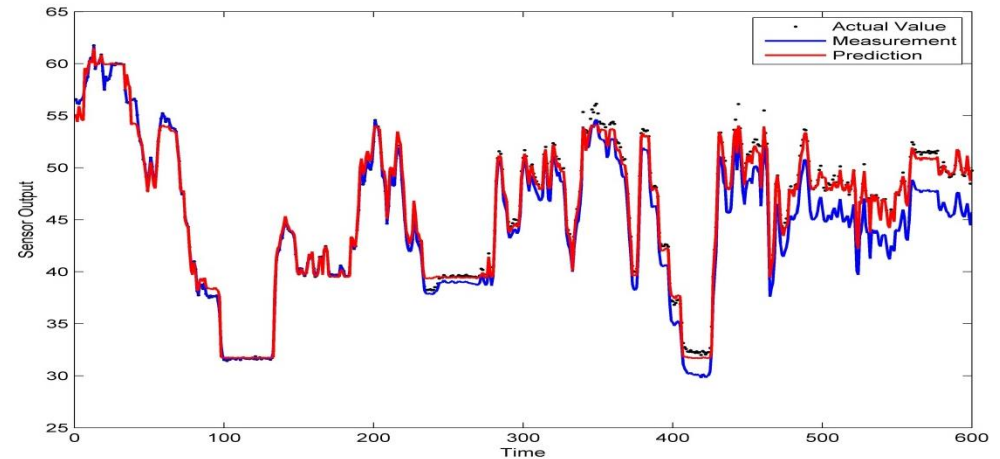
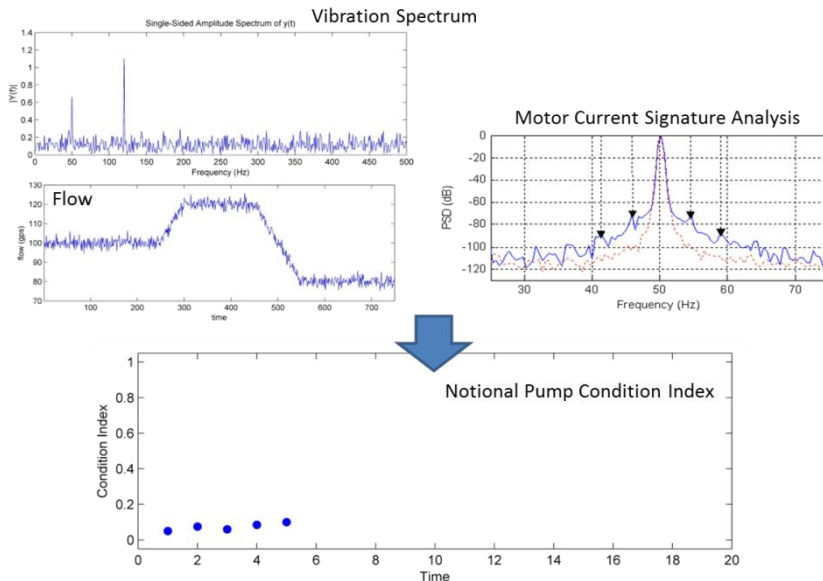
- Proposed OLM programs require periodic recalibration of a limited set of sensors
- Signal validation could potentially alleviate that requirement with high-confidence assessment of sensor status
 - Accurate uncertainty quantification
 - Combining disparate information sources
- Signal validation approaches can also be used as a preprocessing step before advanced monitoring and control algorithms to ensure decisions are based on quality data
- OLM requirements using emerging I&C technologies unknown





Path Forward: Virtual Sensors

- OLM estimates can replace faulty sensor measurements
 - Uncertainty must account for spillover of faulty reading into estimate



- Measurements can be combined to provide additional signatures that aren't currently measureable



Conclusion

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- **Research focused on addressing high-impact technical gaps to developing a standardized framework for robust next-generation online monitoring**
 - **Outcomes enable**
 - Extended calibration intervals and relief of even limited periodic assessment requirements
 - Assessment of sensor measurement accuracy with high confidence
 - Derived values for desired parameters that cannot be directly measured
 - **Outcomes support**
 - Improved reliability and economics for current and future nuclear systems
 - Deployment of advanced sensors (ultrasonic, fiber optic, etc.) and instrumentation (digital I&C, wireless, etc.)