



Deployable Risk-Informed Predictive Maintenance Strategy for Commercial Nuclear Power Plants

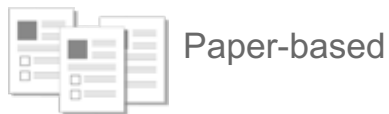
Advanced Sensors and Instrumentation
Annual Webinar

November 6, 2019

Vivek Agarwal
Idaho National Laboratory

Project Overview—Goals and Objectives

Labor-centric Preventive Maintenance



Machine Learning



Visualization



Research & Development



Risk

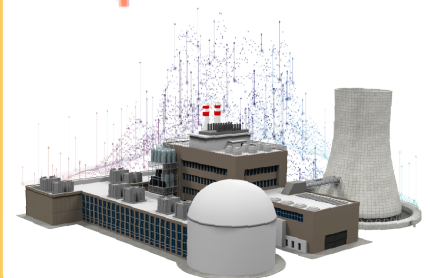


Artificial Intelligence



PKMJ Technical Services, Inc.

Technology-driven Preventive Maintenance



Project Overview—Team

- Vivek Agarwal, PhD
- Koushik A. Manjunatha
- James A. Smith, PhD
- Vaibhav Yadav, PhD

- Francis Lukaczyk
- Michael Archer
- Nicholas Goss
- Mathew Mackay

- Palas Harry

- Period of Performance: 08/1/2018 to 7/31/2020



**PKMJ Technical
Services, Inc.**

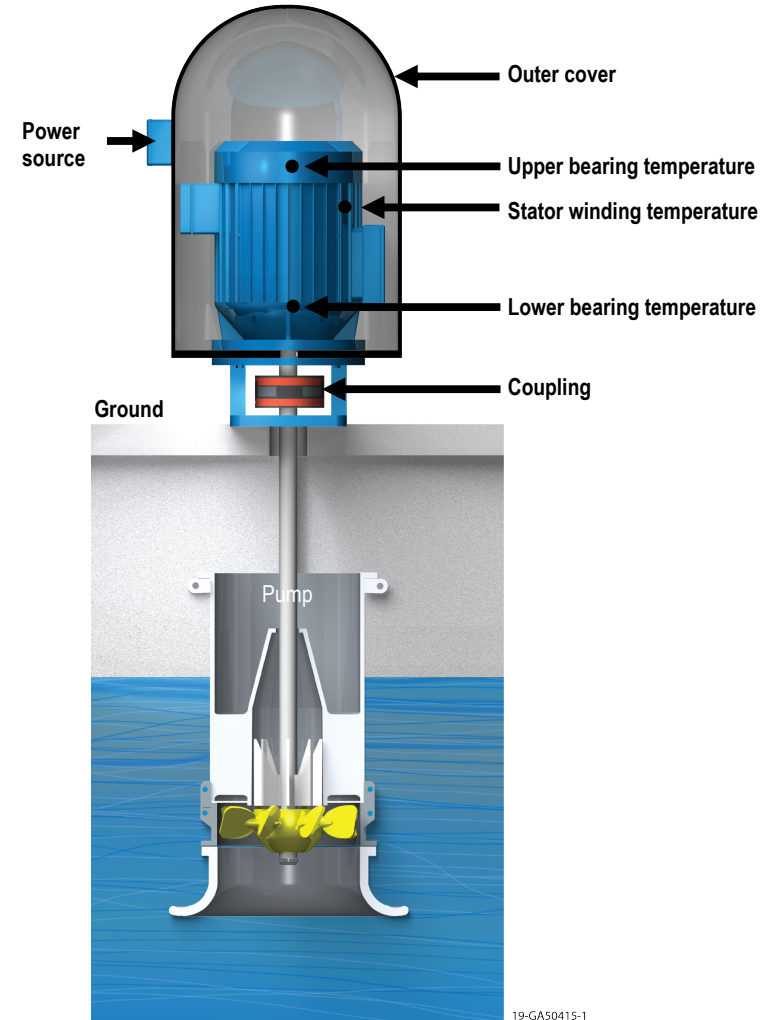


Accomplishments

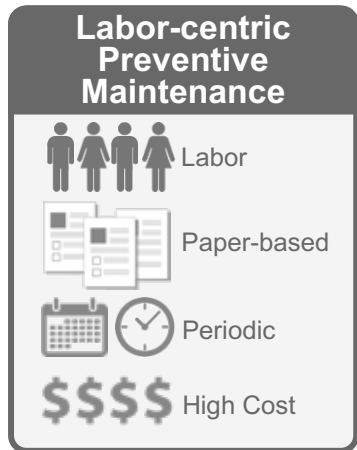
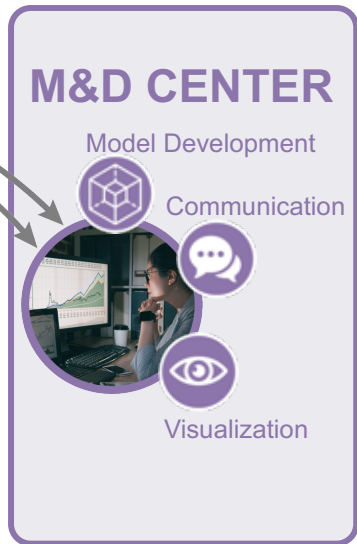
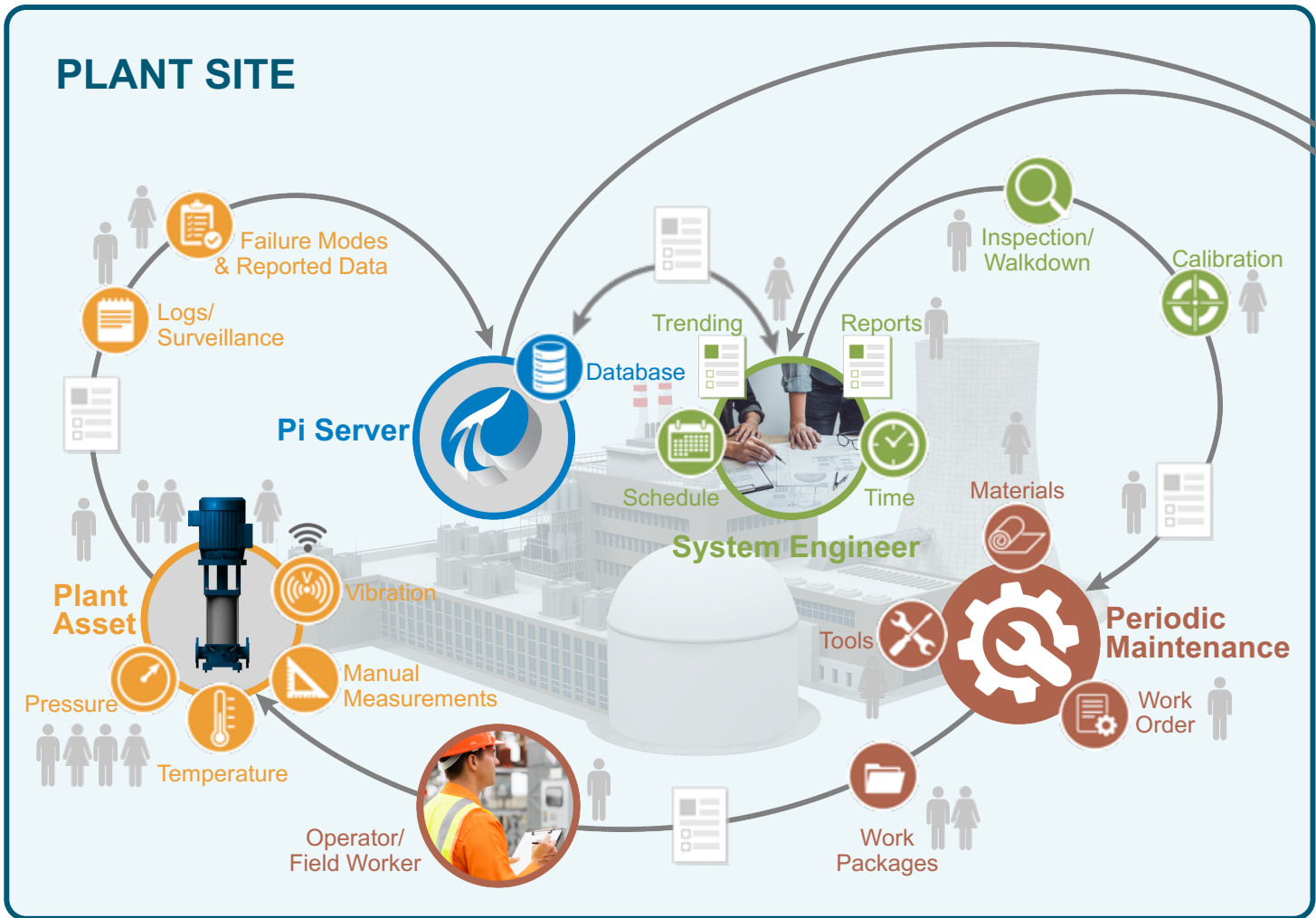
- Evaluated the current preventive maintenance strategy associated with a target plant asset
 - Vertical motor-driven pumps
- Developed a research and development framework to enable the transition to risk-informed predictive maintenance strategy
- Performed data completeness evaluation of historical data on target plant assets
- Enhance online monitoring on target plant asset
 - Installed sixty wireless vibration sensors
- Describe a framework to scale-up the predictive maintenance
 - Across different plant assets at the site level
 - Across different plant sites for the same plant asset across the fleets
- In collaboration with plant owners, developed a deployable risk-informed predictive maintenance strategy to
 - Eliminate labor-intensive time-based preventive maintenance strategy

Accomplishments – Vertical Motor-Driven Pump

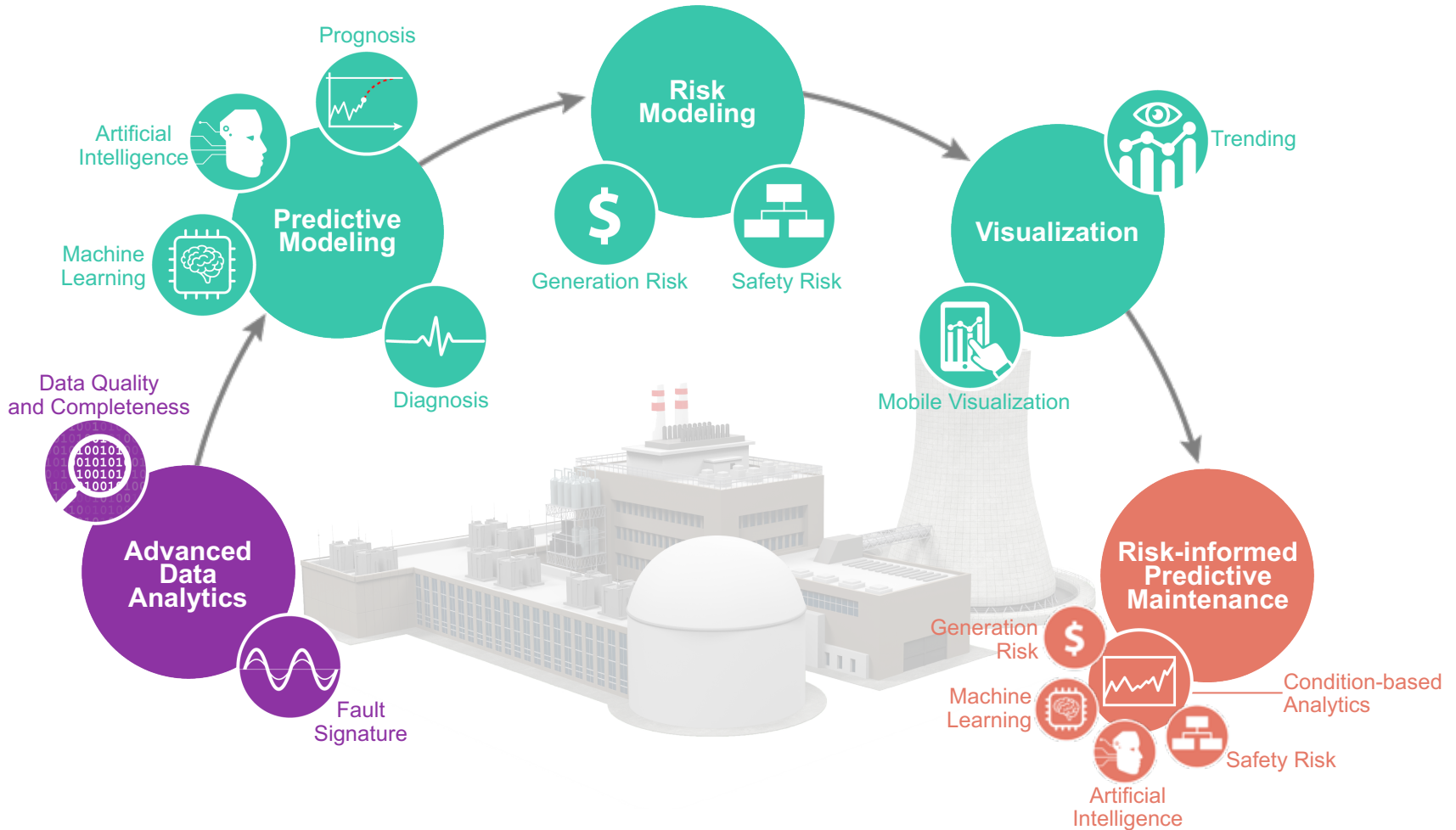
- Access plant process computer data on the vertical motor-driven pump
 - Motor stator winding temperature
 - Motor inboard bearing temperature
 - Motor outboard bearing temperature
 - Motor current data
 - Motor status data
 - Inlet Pressure
- Periodic vibration data
- Access to historical maintenance logs and notification logs



Accomplishments – Current Preventive Maintenance Strategy

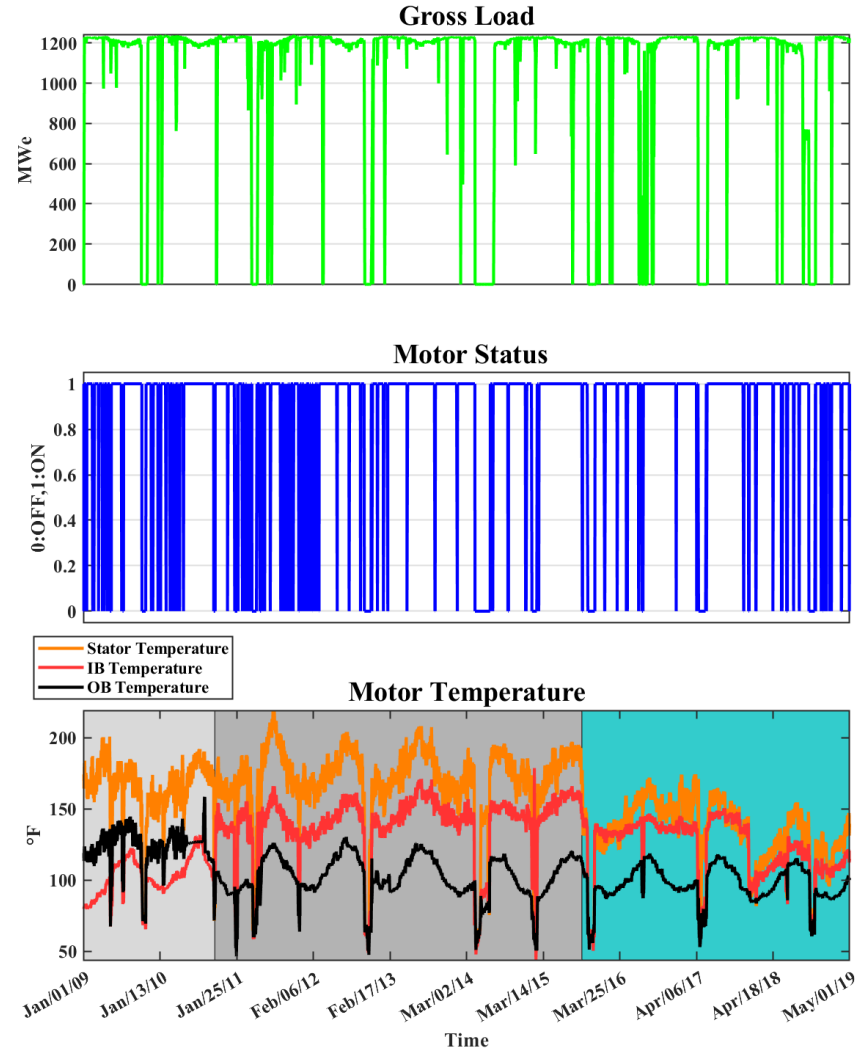


Accomplishments – Research and Development Framework

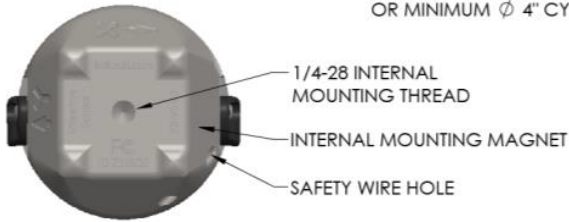
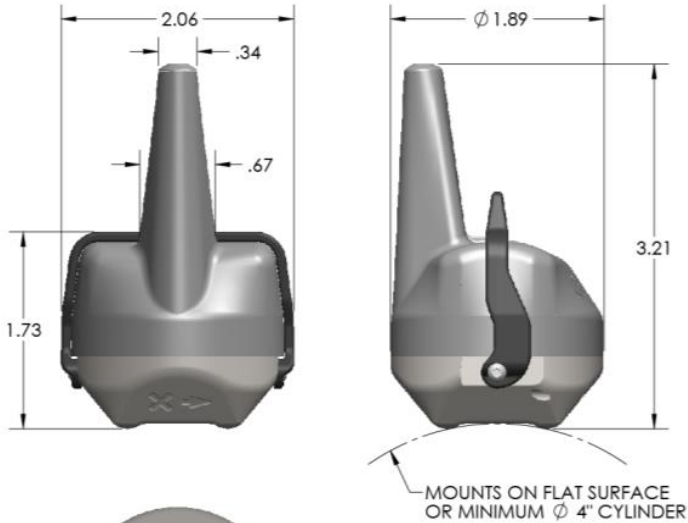


Accomplishments – Data Completeness and Recommendation

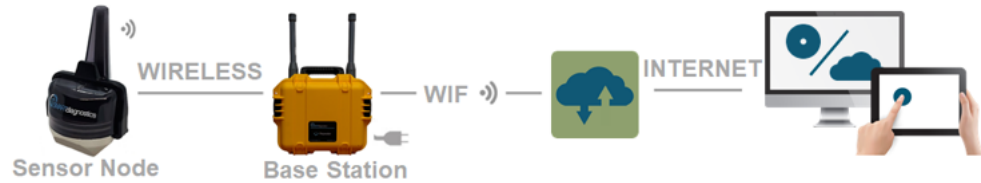
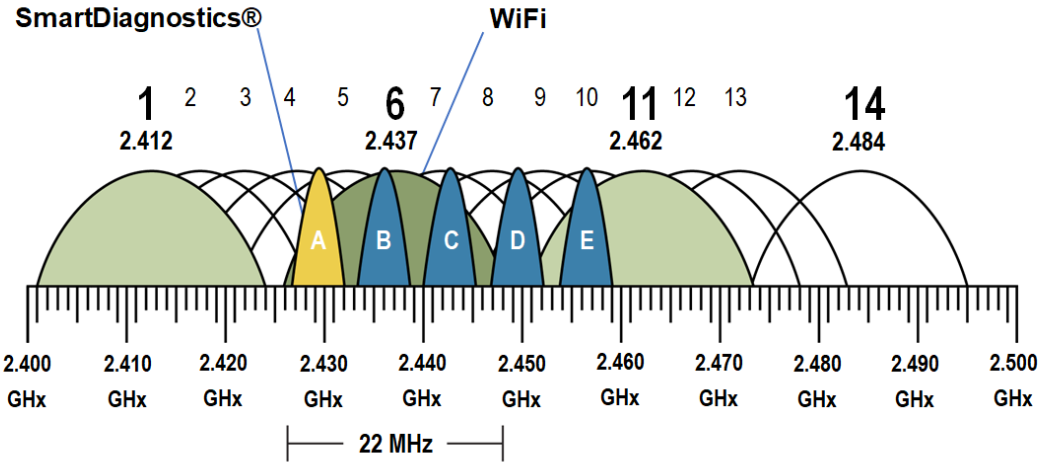
- Data quality assessment
 - Data cleaning
 - Missing values
- Performed data analysis on run hours of vertical motor-driven pump over several years
- Identified and marked shifts in the data due to different activities and its impact on gross load



Accomplishments – Wireless Vibration Sensors

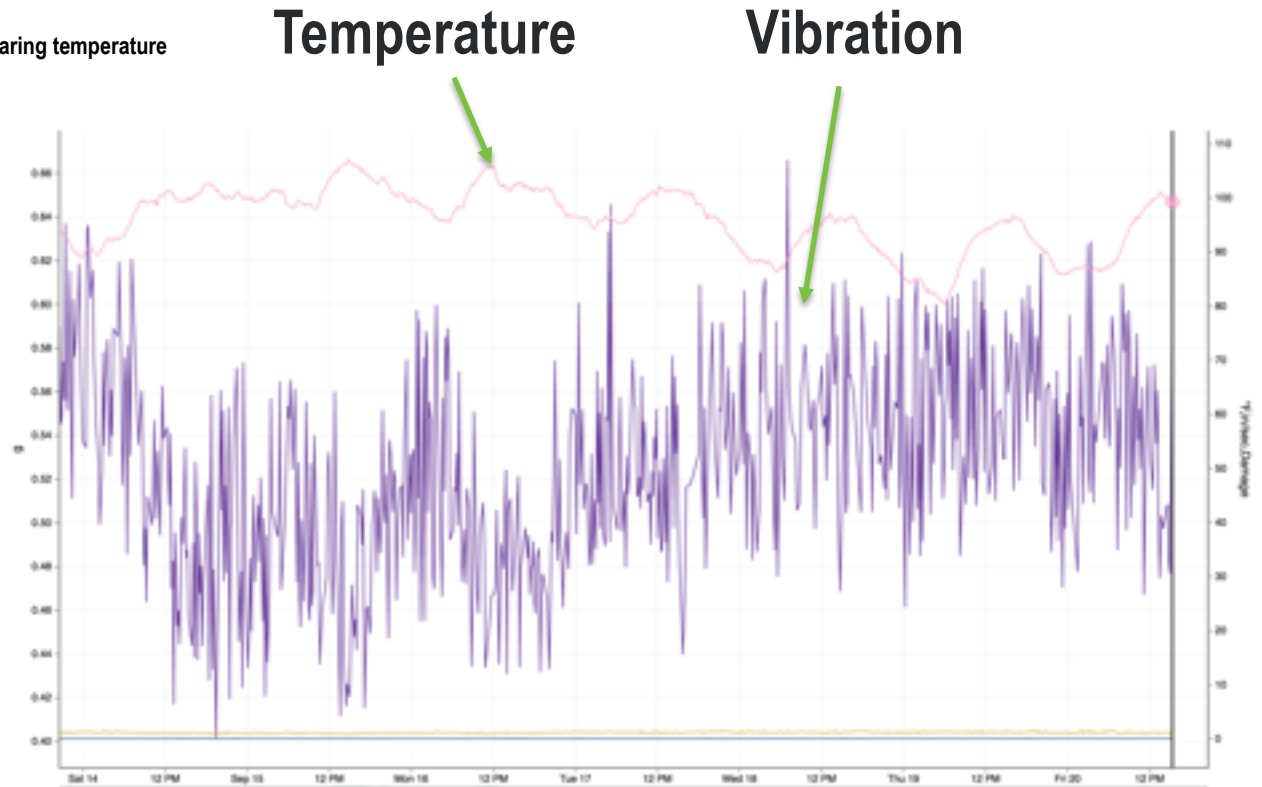
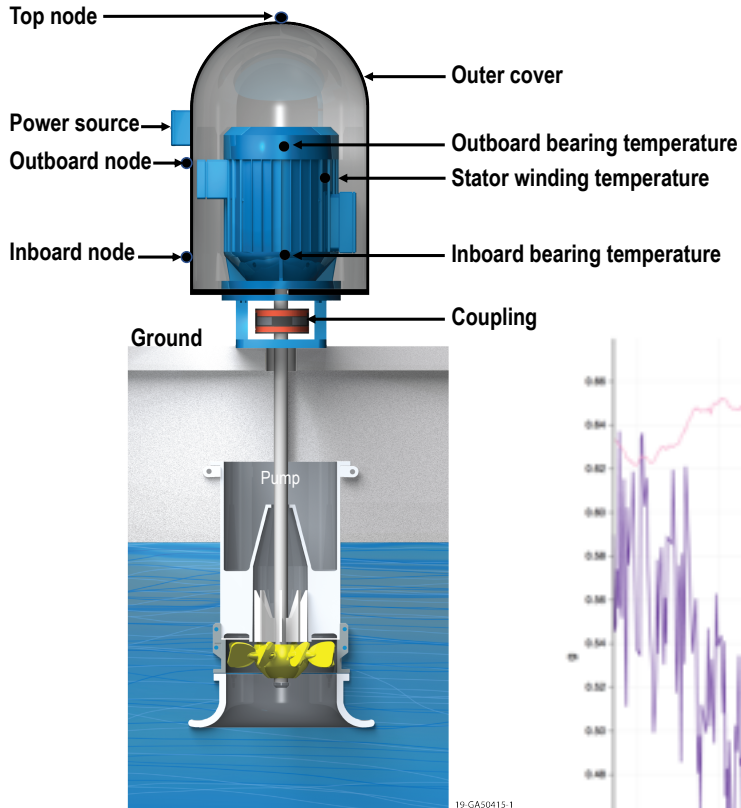


- CLOUD**
- Easy setup
 - Cloud data storage
 - Remote access via Internet

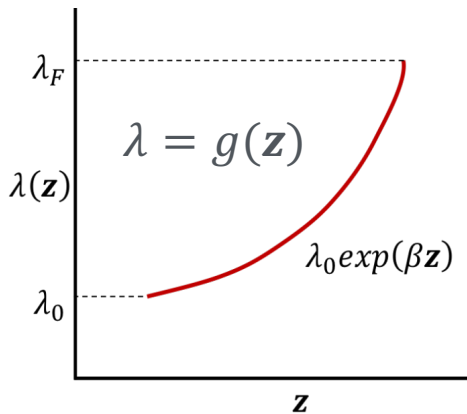
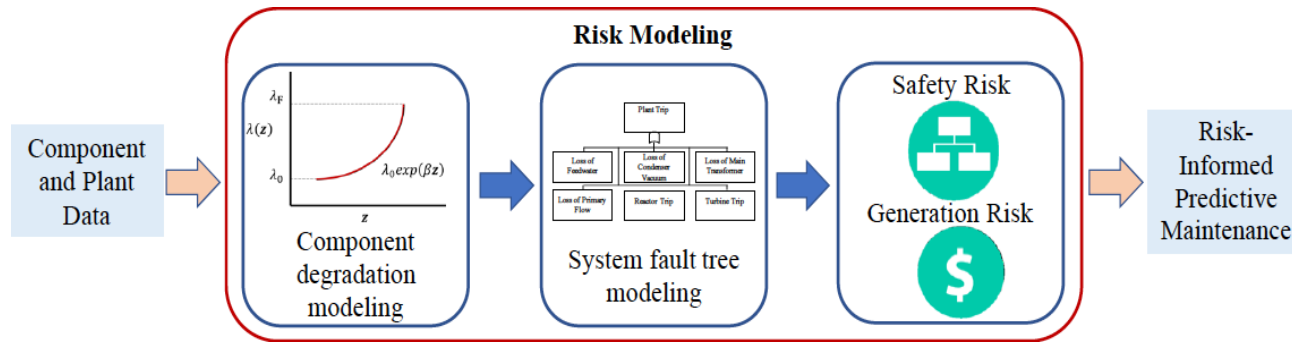


SMARTdiagnostics® Channel	A	B	C	D	E
Center Frequency (MHz)	2429	2436	2443	2450	2457

Accomplishments – Vertical Motor-Driven Pump with Wireless Vibration Sensors



Accomplishments – Risk Modeling Framework



$\mathbf{z} = (z_1, \dots, z_n)$ is the vector of n performance parameters measured for the component and $g()$ is a function capturing component failure due to degradation

- Loss of Power $LOP = \sum_{i=1}^T \lambda_T P_{T,i} R_{T,i} + \sum_{j=1}^D \lambda_D P_{D,j} R_{D,j}$

λ_T : Trip frequency; λ_D : Derate frequency

$R_{D,j}$ is the restoration time in hours for the an j -th derate event

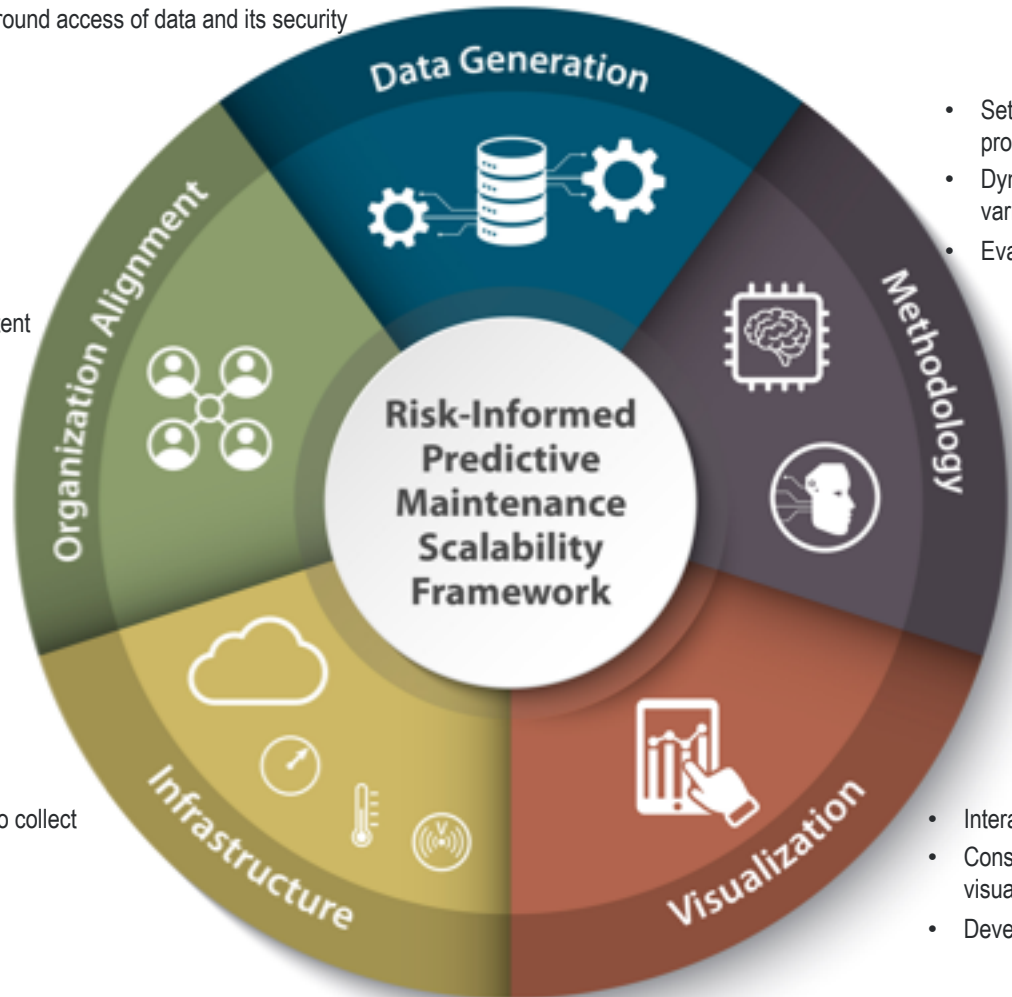
$R_{T,i}$ is the restoration time in hours for the an i -th trip event

$P_{D,j}$ is the reduced power level due to derate caused by j –th SSC failure or unavailability

$P_{T,i}$ is the power level due to trip caused by i th SSC failure or unavailability

Accomplishments – Scale-up of Risk-informed Predictive Maintenance Strategy

- Collect, process, prepare, and structure the data
- Data governance for managing the data
- Policy around access of data and its security



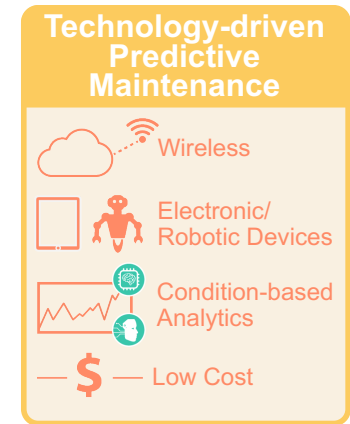
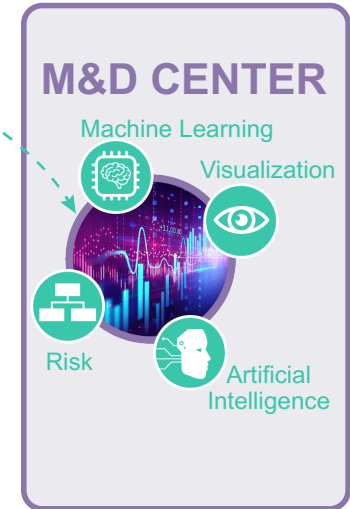
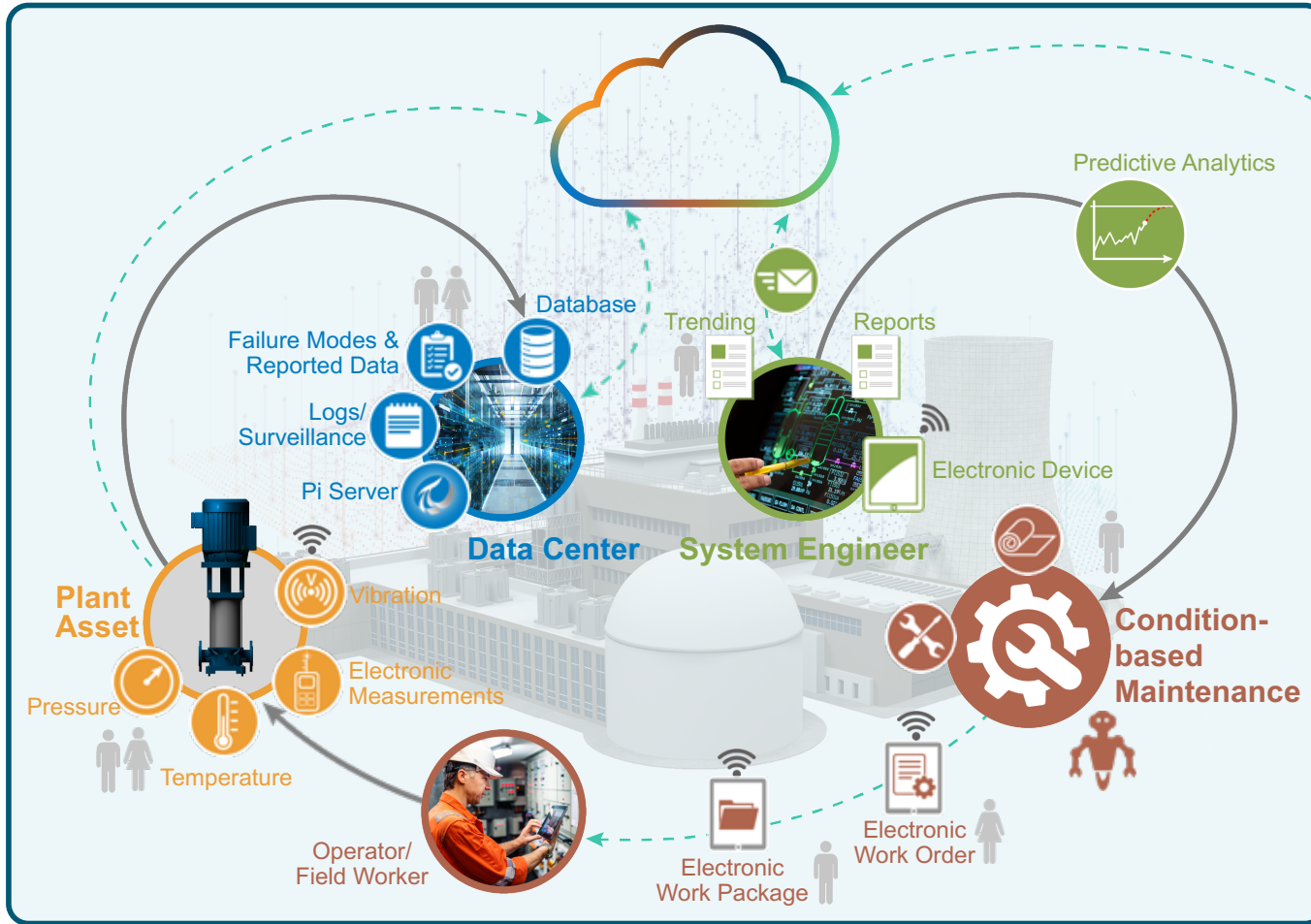
- Set of algorithms to perform diagnosis and prognosis
- Dynamic in nature (ability to incorporate data at various scales)
- Evaluated against different performance metrics

- Interactive visualization
- Consistent performance across different visualization platforms
- Development of style-guides or standards

- Organization commitment is necessary
- Early and clear communication of the intent
- Open to feedback and culture change

- Sensors, communication, and platform to collect different types of data
- Agile, safe, and secure and open
- Upgradable

Accomplishments – Risk-informed PdM



Technology Impact (1)

- *Advances the state of the art for nuclear application*
 - Advances online monitoring at a nuclear plant site for different plant assets
 - Provides machine learning approaches to integrate and analyze heterogeneous structured and unstructured data (i.e., analytics-at-scale)
 - Visualization of information to make informed decision-making
- *Supports the DOE-NE research mission*
 - Enhance reliability and economic operation of domestic existing fleet
 - Research outcomes can be utilized to develop maintenance strategy for next generation of advanced reactors
 - Develop talent pipeline (interns, post doctoral researchers) to support future nuclear work force

Technology Impact (2)

- *Impacts the nuclear industry*
 - Enable industry to transition from preventive maintenance strategy to risk-informed predictive maintenance strategy
 - Reduce operation and maintenance costs

- *Will be commercialized*
 - This research will be commercialized under the existing award under industry Funding Opportunity Announcement

Conclusions

- Performed extensive data analysis of historical data from a plant site on vertical motor-drive pumps
- Correlated shifts in the data with maintenance records
- Summarizes the installation of sixty wireless vibration sensors on vertical motor-driven pumps
- Presents a risk-informed modeling framework
- A framework to scale-up the risk-informed predictive maintenance strategy is presented.
- Vivek.Agarwal@inl.gov any additional questions that may not be answered during the webinar.



Clean. **Reliable. Nuclear.**