

Award No.: DE-FE0031645

## A Robotics Enabled Eddy Current Testing System for Autonomous Inspection of Heat Exchanger Tubes

PI: Jian Lin

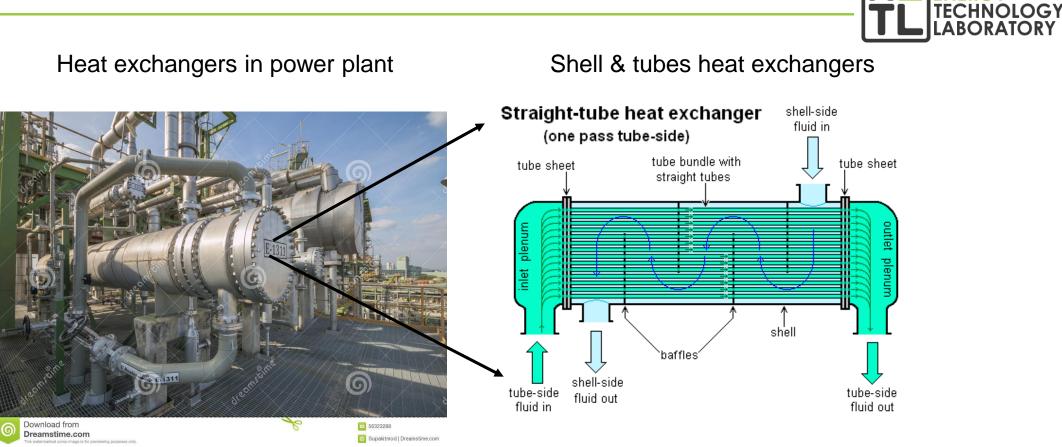
**Co-PI: Ming Xin** 

University of Missouri, Columbia

2020 FE R&D Virtual Project Review Meeting: Sensors and Controls 08/27/2020



#### **Heat Exchanger Tubes in Power Plants**



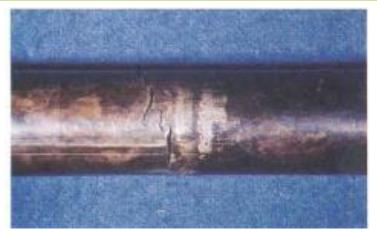
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#### **Failures of Heat Exchanger Tubes**





Stress corrosion

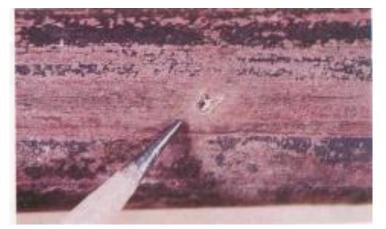


Stress cracking



General corrosion inside copper tube because of CO<sub>2</sub>

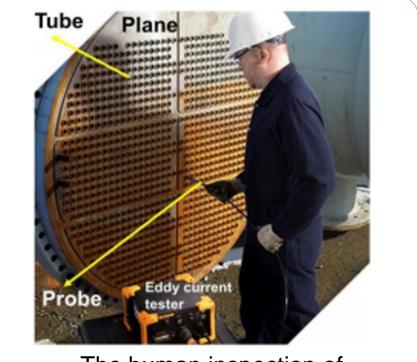




Oxygen pitting attack on copper tube

#### **Current State-of-Art and Problems**





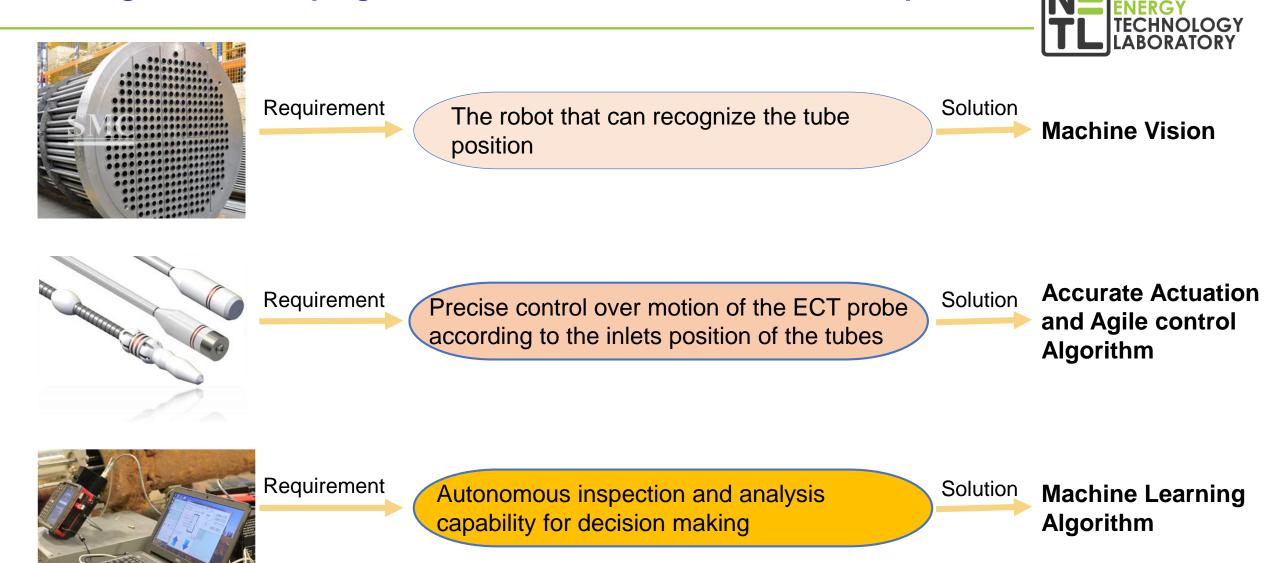
The human inspection of heat exchanger tubes

- Labor intensive: routine insertion and extraction of a probe
- Well-trained technicians to operate
- Inconsistent data collection
- Decision making essentially relies on the technician's experience: historic data may not be properly documented and utilized.

A robotic platform that can recognize tube location, perform actuation, and do the testing in a autonomous manner has not been demonstrated for solving the aforementioned problems.



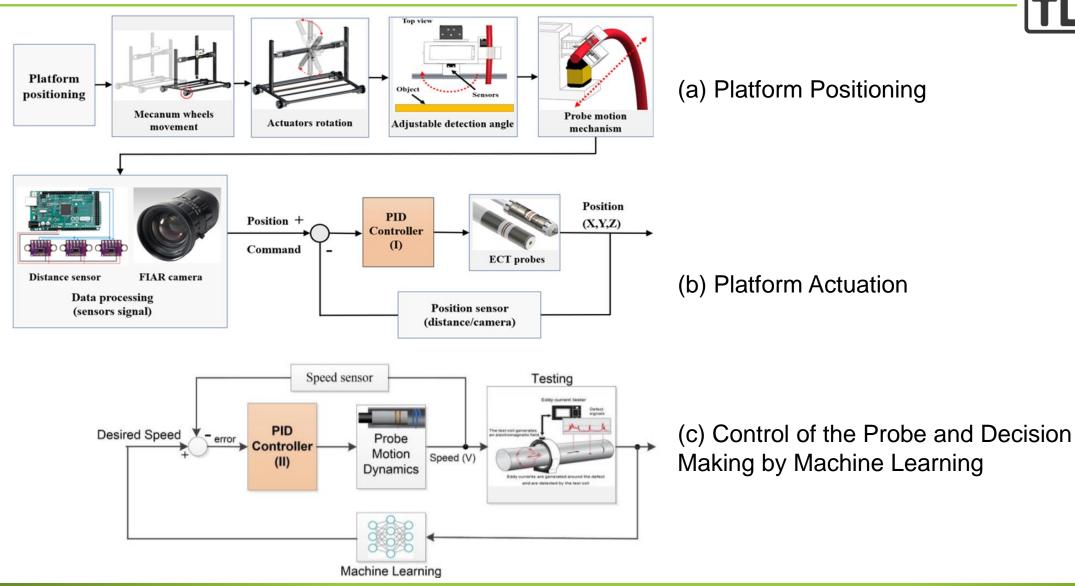
#### **Challenges of Developing Robotic Platform for Autonomous Inspection**





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#### **Conceptual Design of the Robotic Platform**

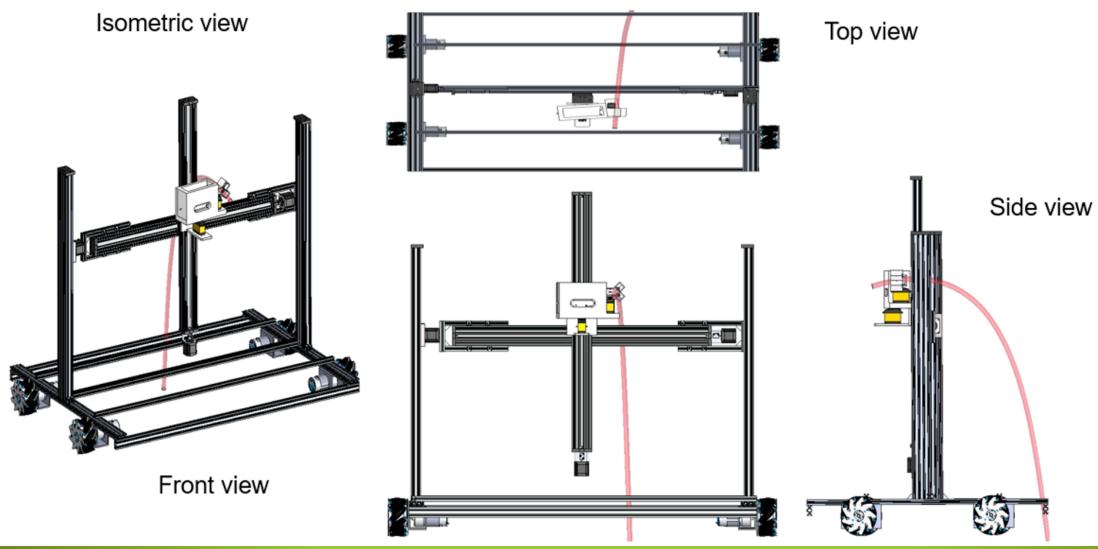






#### **Structural Design of a Robotic Platform**

NATIONAL ENERGY TECHNOLOGY LABORATORY



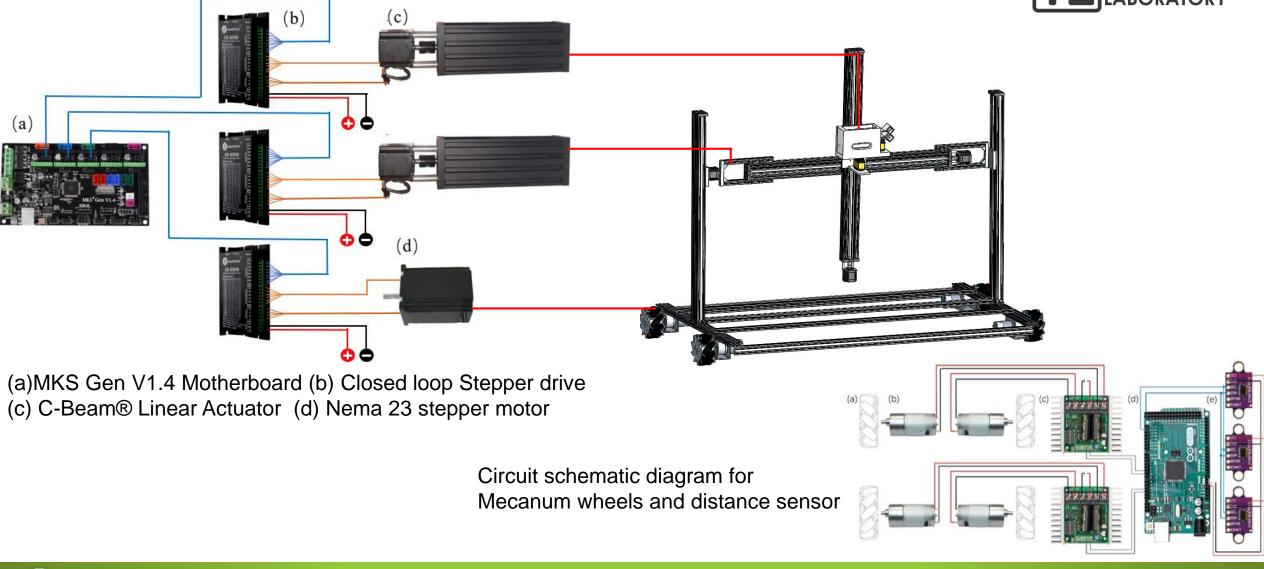


### **Actuation Systems** NATIONAL ENERGY TECHNOLOGY LABORATORY Probe/Camera station Precise control on actuator rotation/ $\bigcirc$ Omni-Linear Actuator



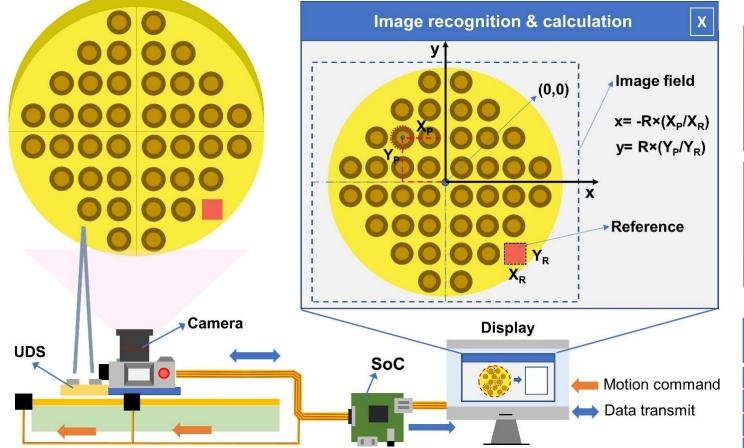
#### **Control for Actuation System**





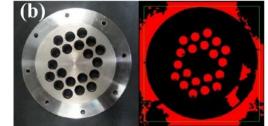
#### **Machine Vision for Identification of Tube Inlet Positions**













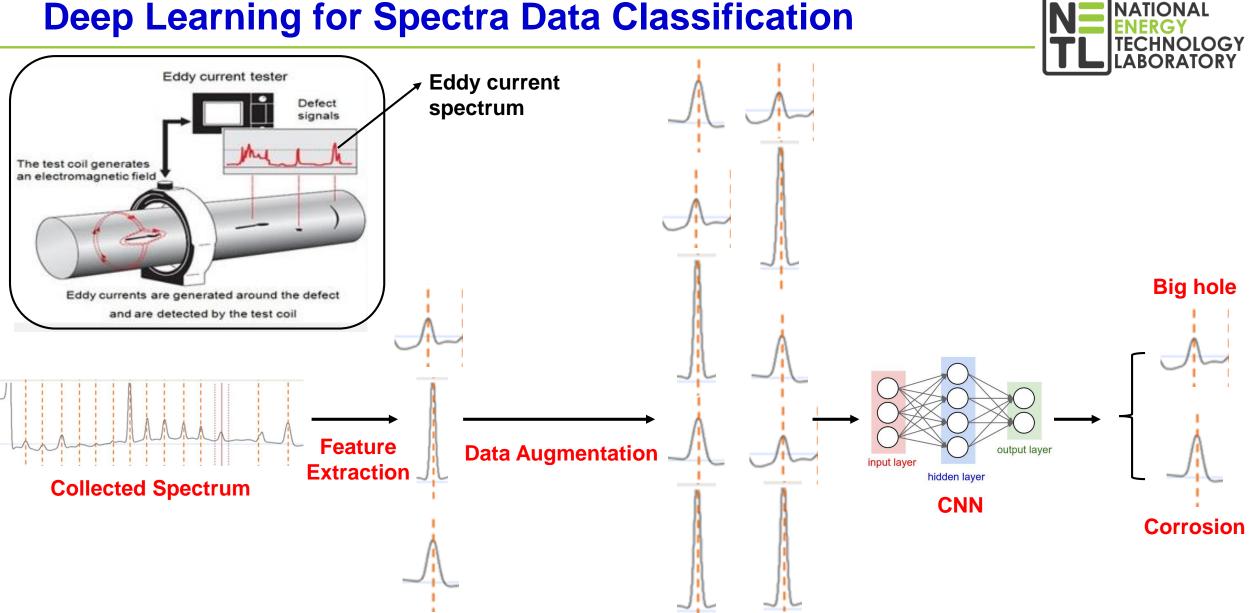
	Quantity	Detection quantity	Average radius (a.u.)	Accuracy (%)
Case a	20	20	13.023	100
Case b	20	20	15.018	100
Case c	16	16	14.528	100
Case d	27	27	13.100	100



#### **Demonstration**









#### **Other Outcomes**



Journal Publications Partially Funded by the Grant:

- 1. H. Wang, Y. Xie, D. Li, M. Xin, and **J. Lin**\*. Rapid Identification of X-ray Diffraction Patterns Based on Very Limited Data by Interpretable Convolutional Neural Networks. *Journal of Chemical Information and Modeling*, 60, 4, 2004-2011 (2020).
- 2. Y. Xie, C. Zhang, X. Hu, C. Zhang, S. P. Kelley, J. L. Atwood\*, and **J. Lin**\*. Machine Learning Assisted Synthesis of Metalorganic Nanocapsules. *Journal of the American Chemical Society*, 142 (3), 1475-1481 (2020).
- 3. Y. Dong, D. Li, C. Zhang, C. Wu, M. Xin, J. Cheng, and **J. Lin**\*. Inverse design of two-dimensional graphene/h-BN hybrids by a regressional and conditional GAN. *Carbon*, Accepted (2020).

#### **Education and Training**

- So far one domestic Ph.D. student, one M.S. student, and four undergraduate students are involved in this project.
- Knowledge obtained from the project is integrated to course of "Manufacturing" that the PI is teaching.

**Collaboration with Industrial Partners** 

- Establish relationship with Eddify which is a Eddy current tester manufacturing company. They showed interest in collaboration on autonomous detection enabled by deep learning algorithms.
- Survey the need from local power plant.
- Participate in the field maintenance of the exchange heat tubes.





#### **Technical Challenges**

- Machine vision works well with lab setup. As the environment in real power plant is complex and the tube conditions vary, there may be gap in testing results.
- Accumulative positioning error exists as the number of the tubes increases.
- Lack of eddy current spectra data for deep learning algorithm development.

#### **Next Steps**

- Improve the machine vision capability by using simulated setup that is close to real situation when training the model.
- Use a close-loop control algorithm to offset the accumulative positioning error.
- Employ our recently developed data augmentation technique to overcome the issue of limited data.
- Integrate all sensing and actuation systems to one control unit.
- Perform the system testing.



#### **Benefits**



- Autonomous robots for testing the exchange heat tube can fill the market gap that calls for increasing automation for power plant maintenance.
- Autonomous decision making enabled by deep learning the eddy current testing data will provide new opportunity for the eddy current testing market.

#### **Technology-to-Market Path**

- The developed control algorithm and software can be integrated into existing eddy current tester manufacturers.
- The developed robotic platform can achieve autonomous testing and automate the power plant maintenance, laying foundation for future research in developing field robots.
- Challenges of improving machine vision capability and reducing the position error for accurate path planning will be overcome to achieve the proposed goal.
- Working closely with industry collaborators for understanding the market need and technology transfer will be needed.







Funding: DE-FE0031645





2019: Group members attended training on demonstration of exchange heat tube maintenance in the MU power plant.

# Thanks for your attention! Questions?

