

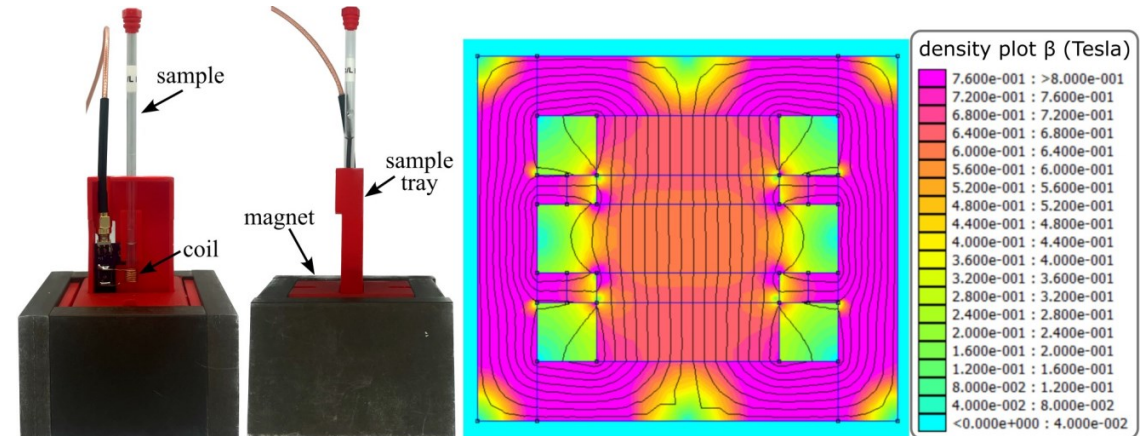
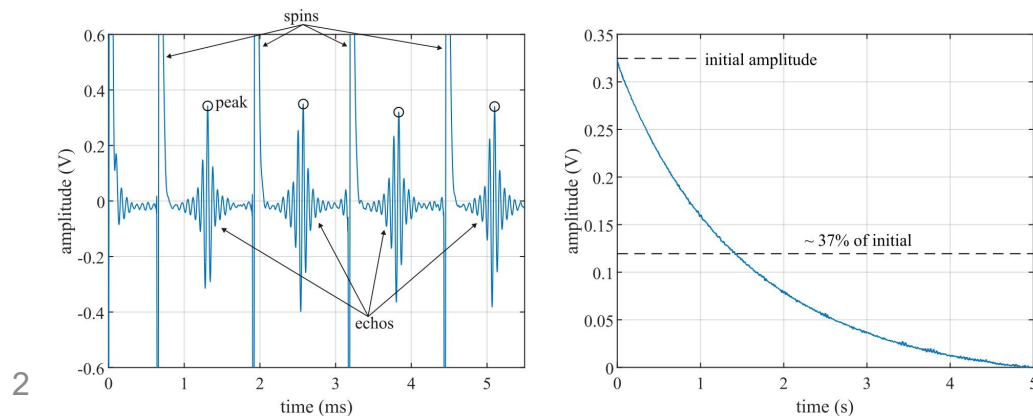
Field Deployable NMR for In Situ Water Quality Monitoring

Austin R.J. Downey
Associate Professor
Mechanical Engineering
Civil and Environmental Engineering



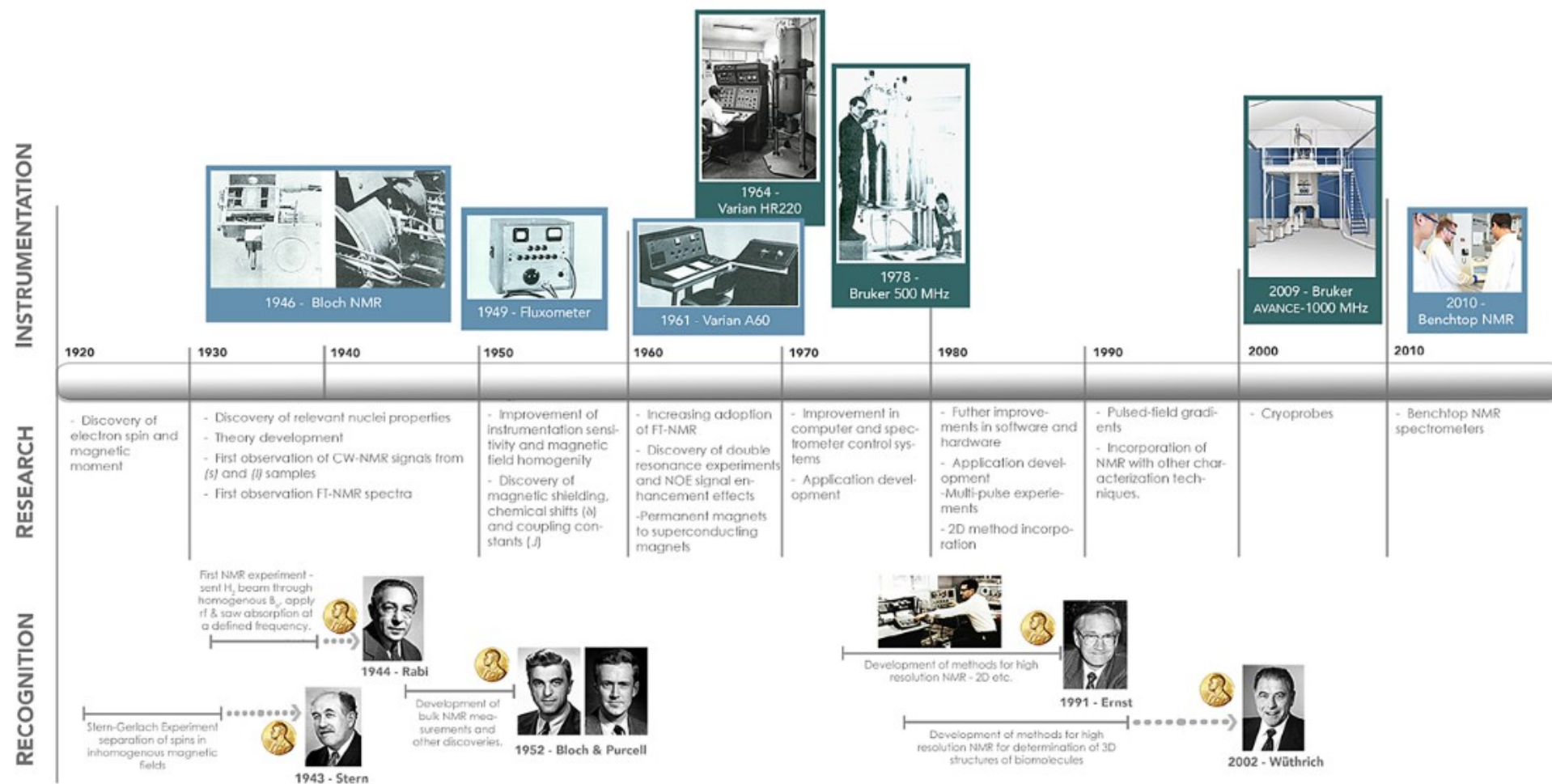
Outline for Today's Talk

- NMR Basics
- Our Open-source NMR System
- Use Case: Wildfire Ash
- Lab Data Collection for Model Training
- Field Deployment of In Situ NMR system



NMR Basics

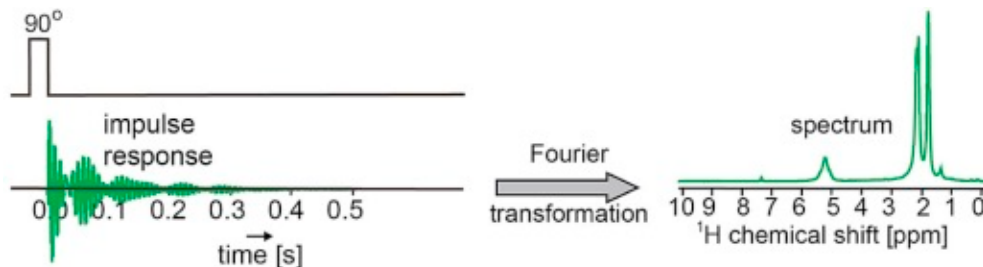
History of NMR



Nuclear Magnetic Resonance (NMR) Techniques

NMR spectroscopy

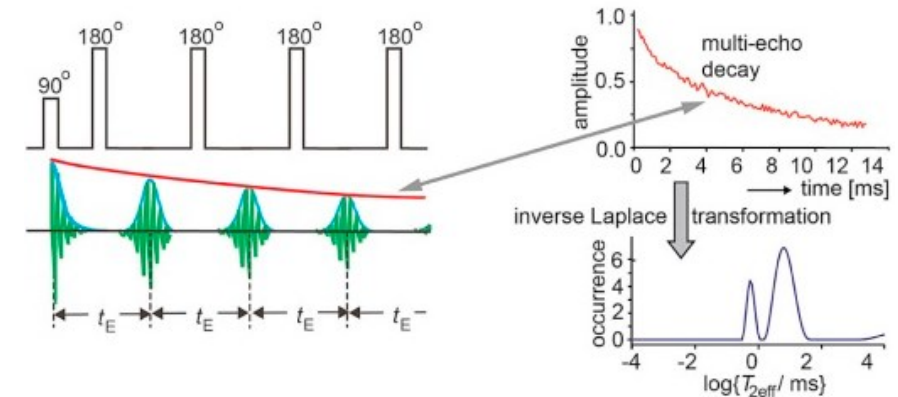
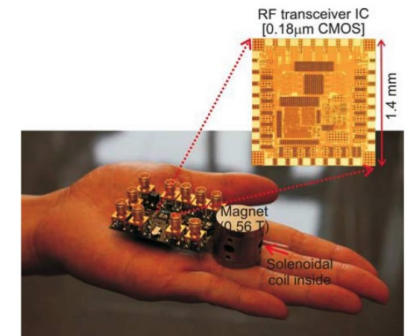
- Lab-Grade NMR
 - Frequency domain analysis
 - High resolution
 - Expensive & bulky



B. Blümich, "Introduction to compact NMR: A review of methods," TrAC Trends in Analytical Chemistry, vol. 83, pp. 2–11, Oct. 2016.

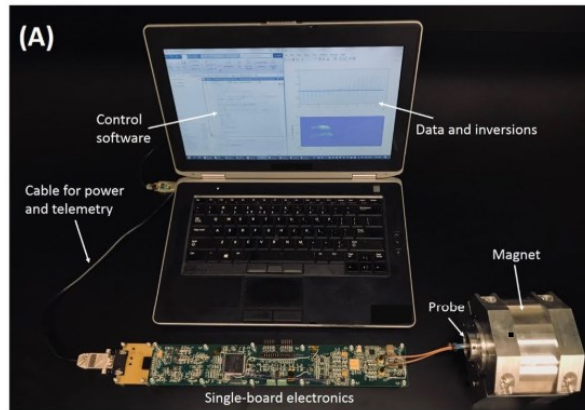
NMR Relaxometry

- Low-field NMR relaxometry
 - Time domain analysis
 - Low resolution
 - Inexpensive and portable

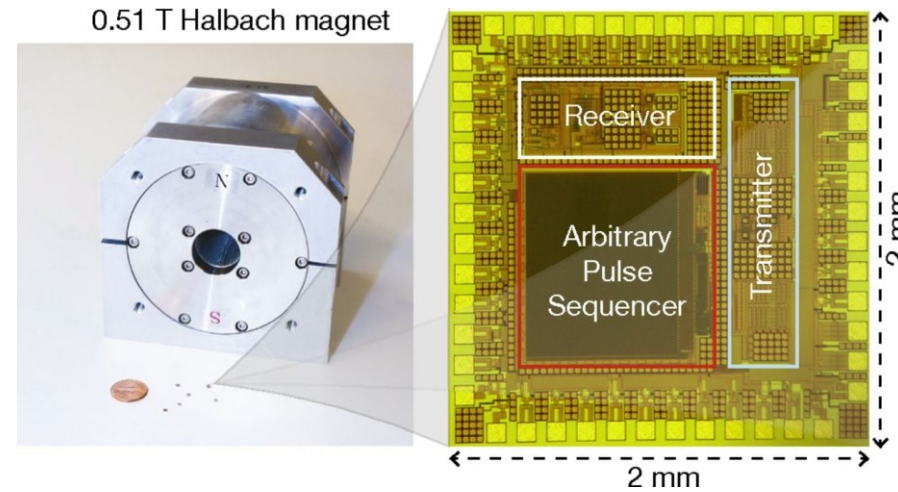


B. Blümich, "Introduction to compact NMR: A review of methods," TrAC Trends in Analytical Chemistry, vol. 83, pp. 2–11, Oct. 2016.

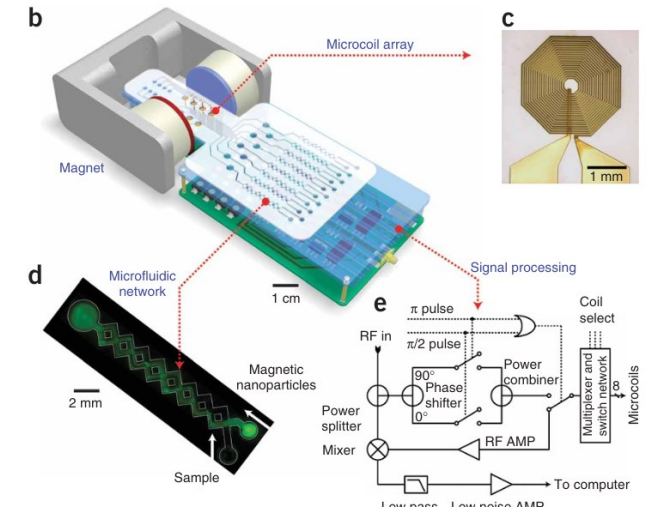
Miniature NMR systems



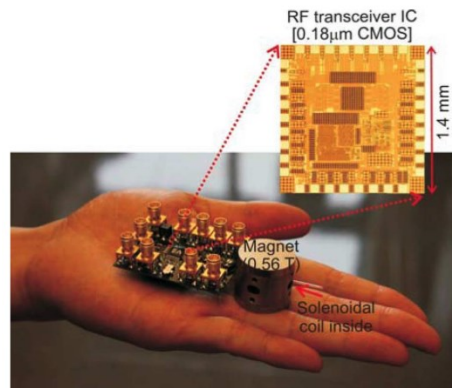
Tang, Yiqiao, David McCowan, and Yi-Qiao Song. "A miniaturized spectrometer for NMR relaxometry under extreme conditions." *Scientific reports* 9.1 (2019): 11174



<https://physicsworld.com/a/going-mobile-with-nmr-spectroscopy/>

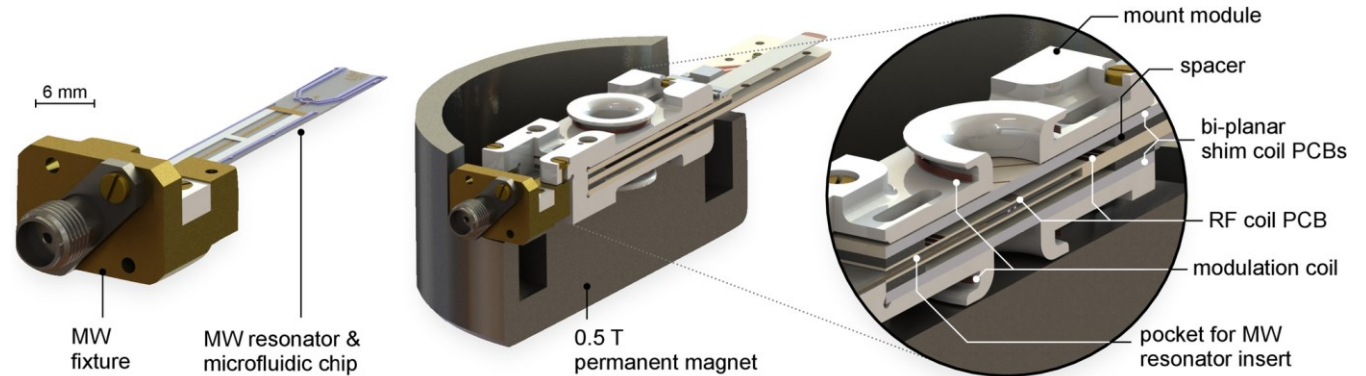


Lee, Hakho, et al. "Chip-NMR biosensor for detection and molecular analysis of cells." *Nature medicine* 14.8 (2008): 869-874.



6

Sun, Nan, et al. "Palm NMR and 1-chip NMR." *IEEE Journal of Solid-State Circuits* 46.1 (2010): 342-352.

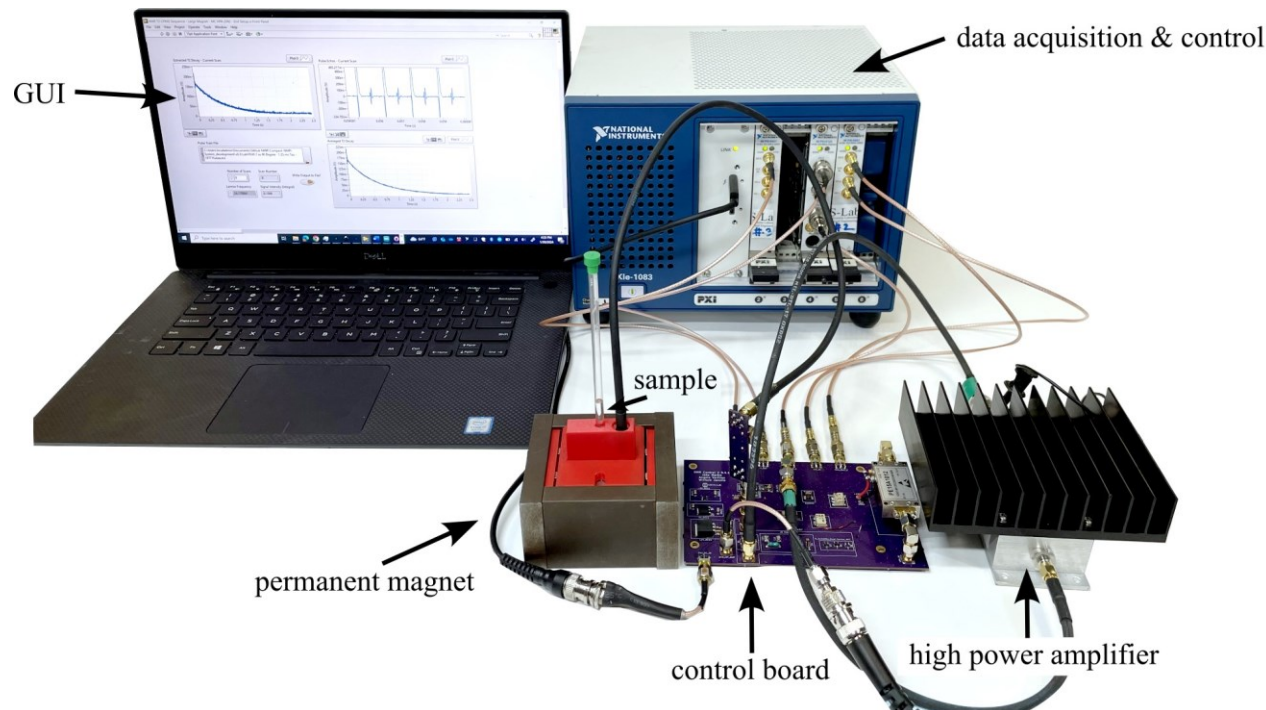


Lee, Hakho, et al. "Chip-NMR biosensor for detection and molecular analysis of cells." *Nature medicine* 14.8 (2008): 869-874.

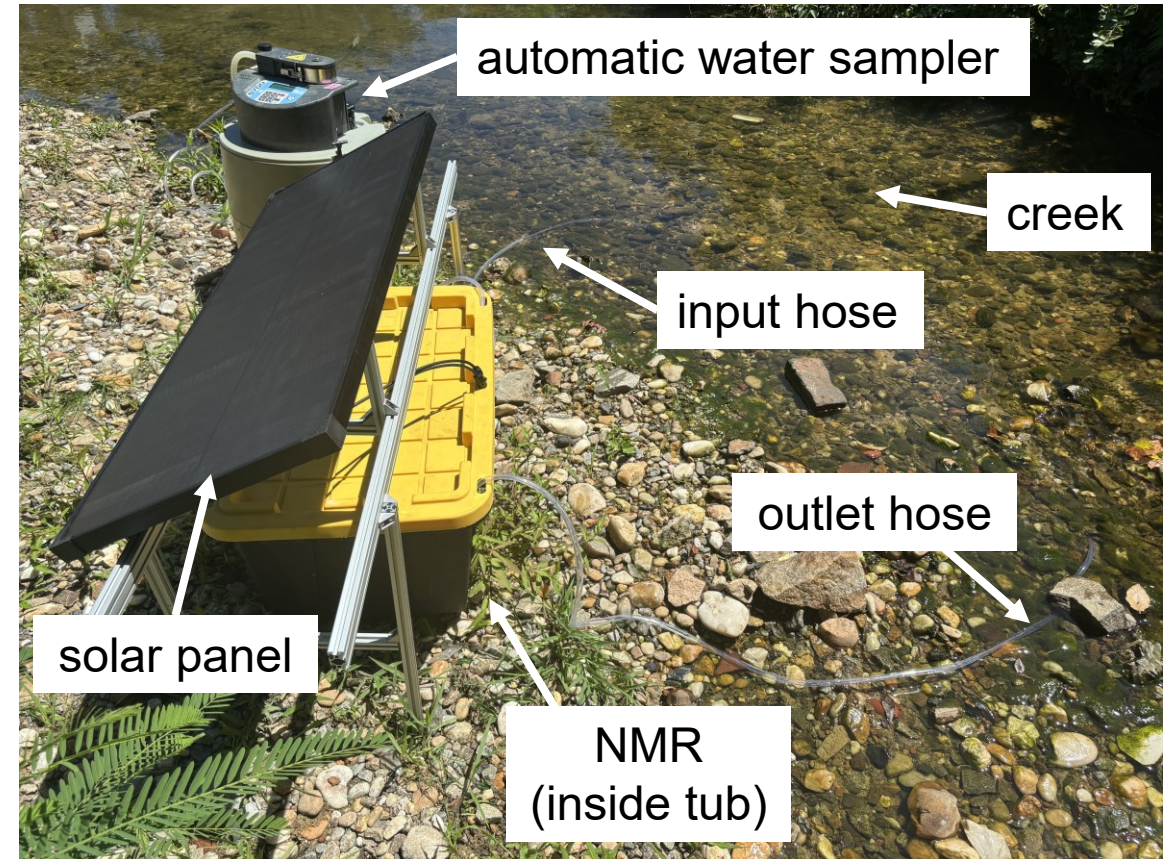
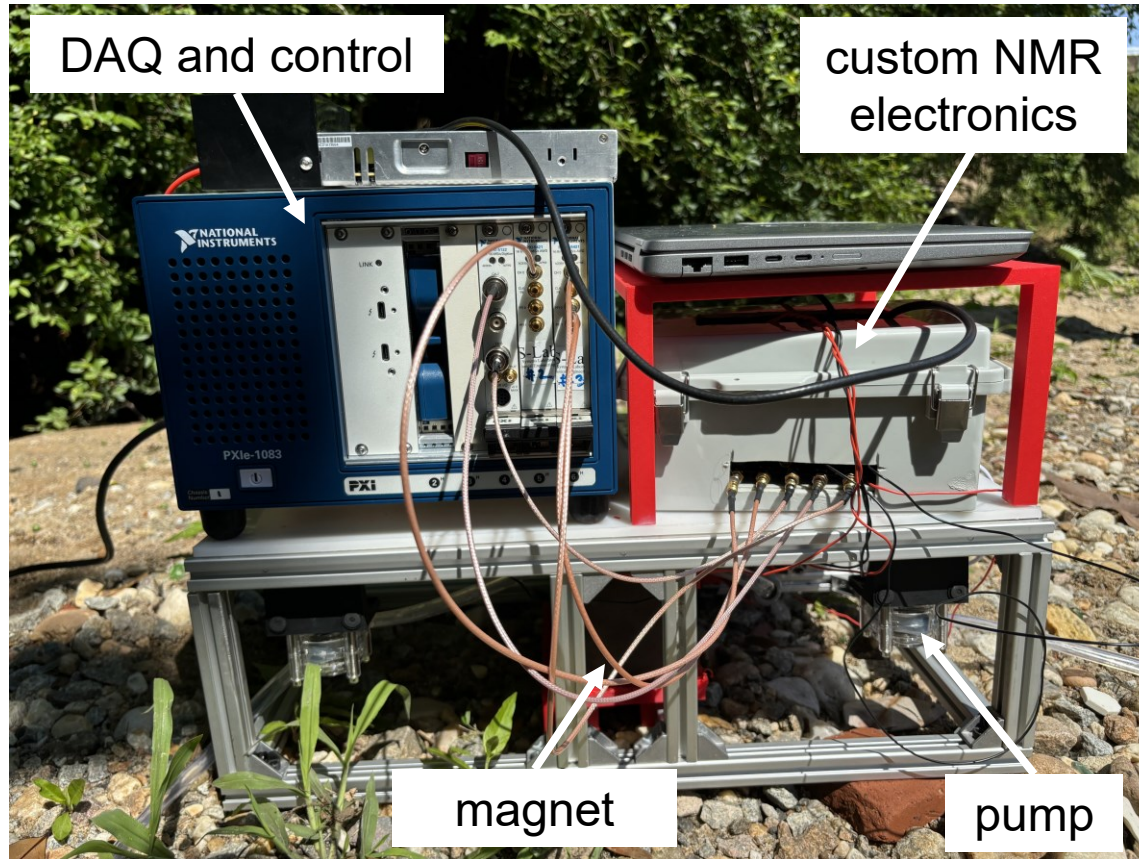
Our Open-source NMR System

ARTS-Lab Desktop NMR System

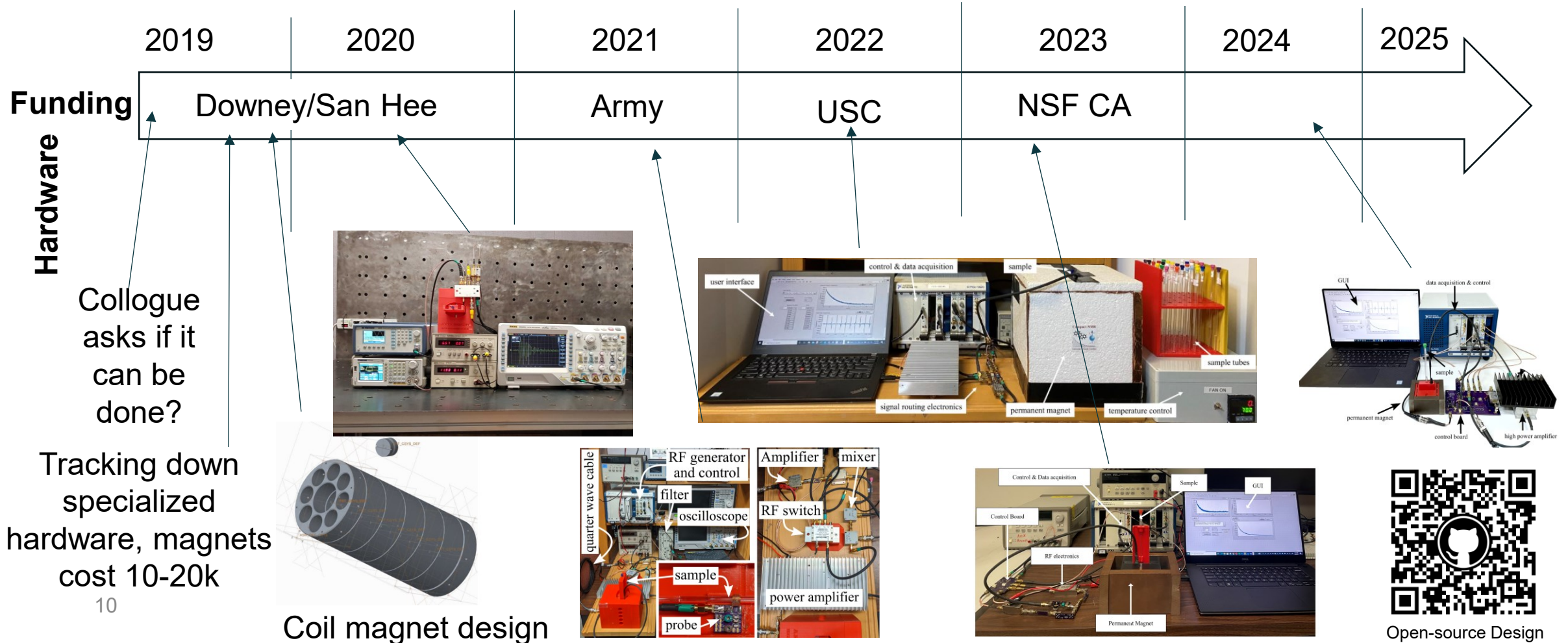
- Hardware and Software shared through a public repository
- A paper published in HardwareX to assist in building sensor
- Cost is approximately \$2,000 + DAQ system



Flow-through NMR



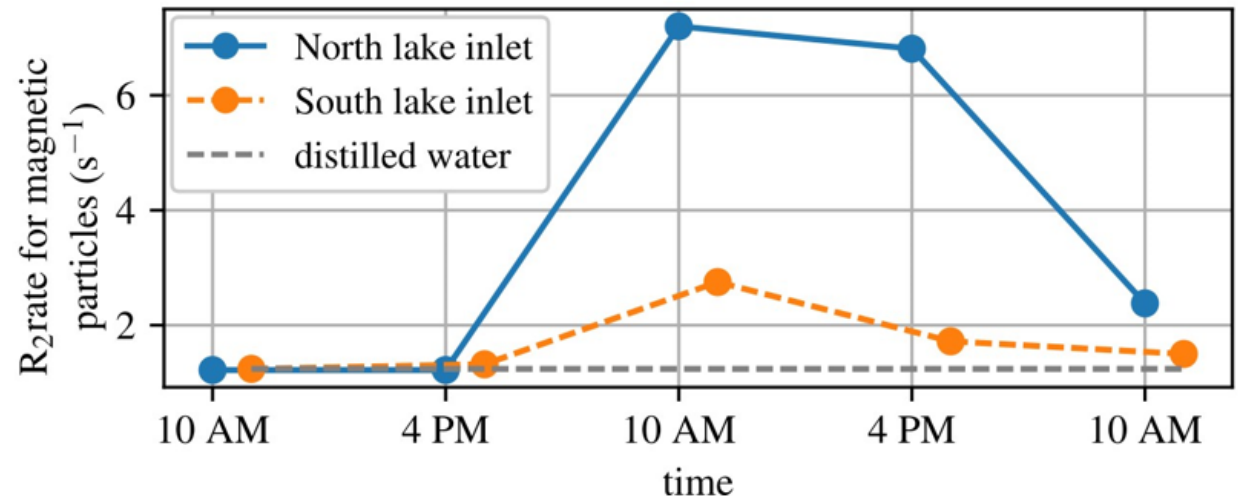
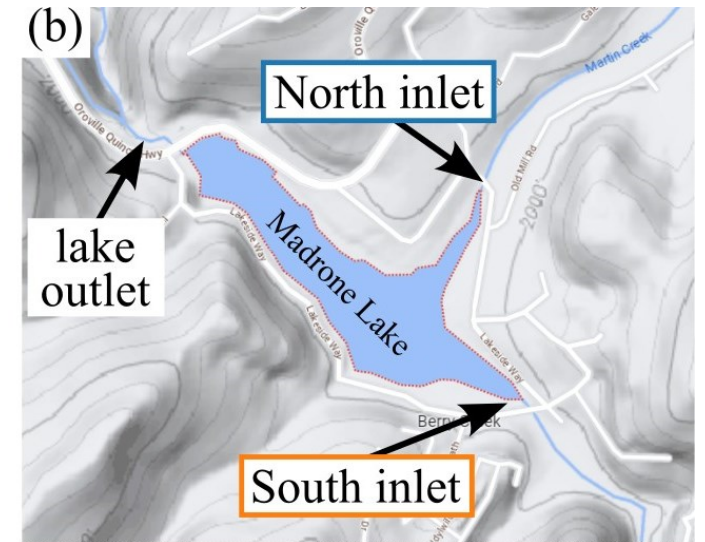
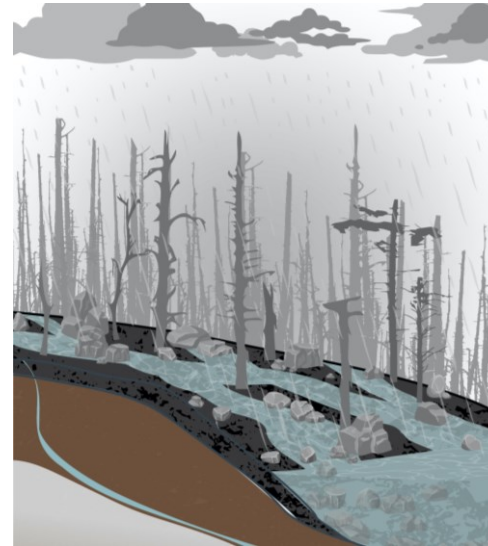
Past NMR Development



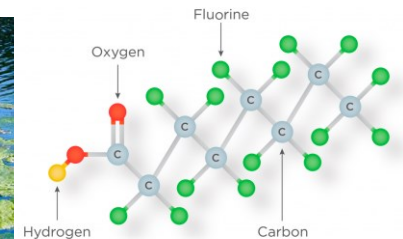
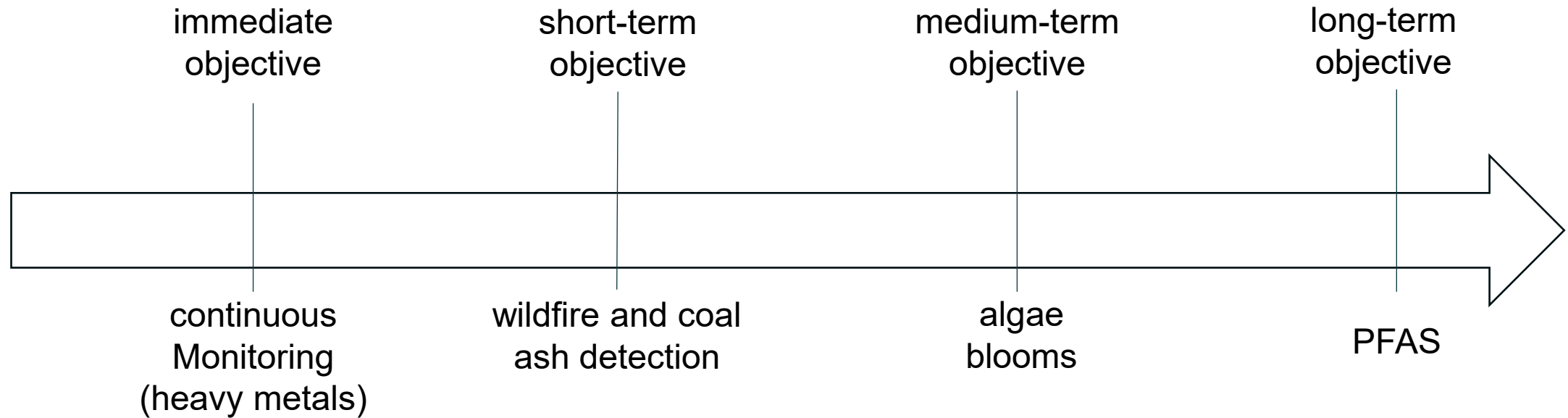
Continuous Water Quality Monitoring

The system is being developed to:

- Track T2 relaxation over time
- Use AI/ML to infer contaminants
- Report results via web portal
- Integrate into a larger autonomous monitoring framework
- Enable continuous surveillance

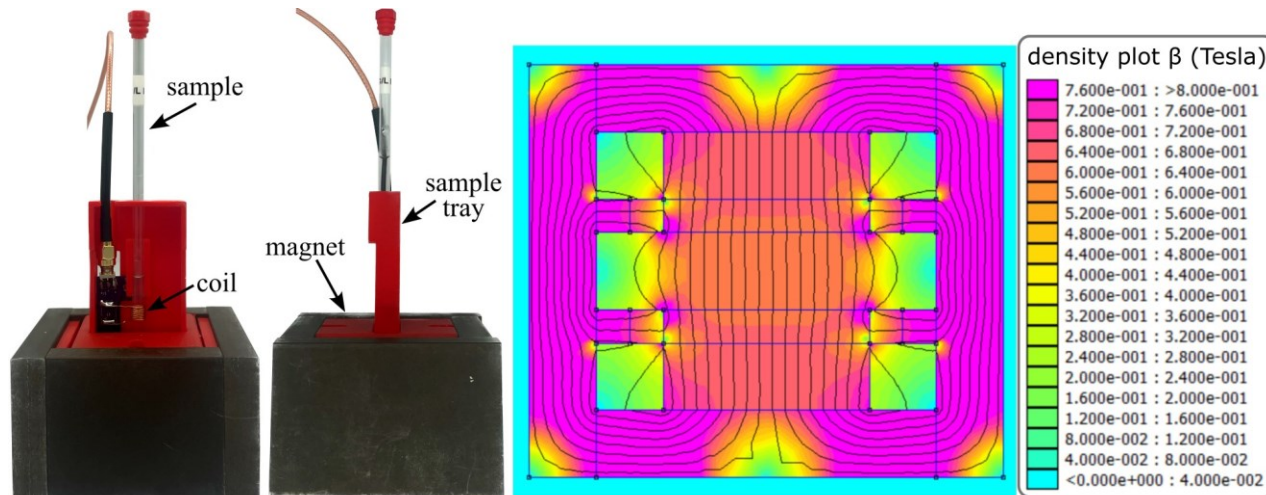


Proposed NMR Use Cases

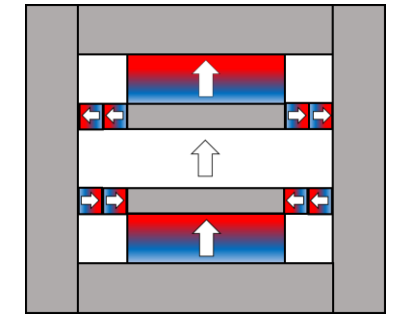
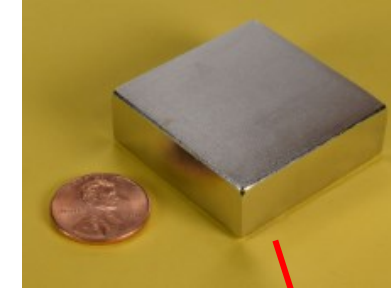


Permanent Magnet Array

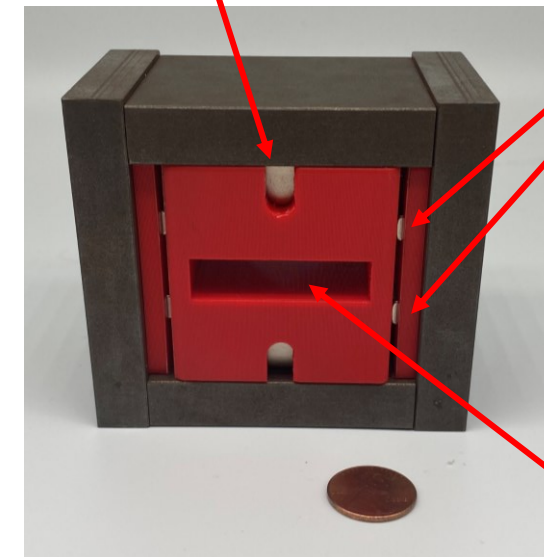
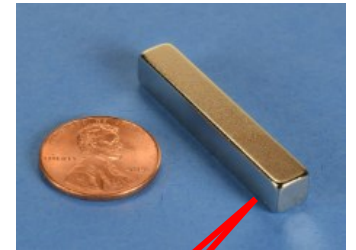
- **0.565 T** strength at 23°C
 - -800 ppm/K gradient
- Larmor (operating) frequency:
 - $f_{Larmor} = \gamma B = \left(42.58 \frac{\text{MHz}}{\text{T}}\right) (0.565 \text{ T}) \approx \mathbf{24 \text{ MHz}}$
- 150 ppm homogeneity
- 4.4 lbs



N42 magnet



N42 magnet



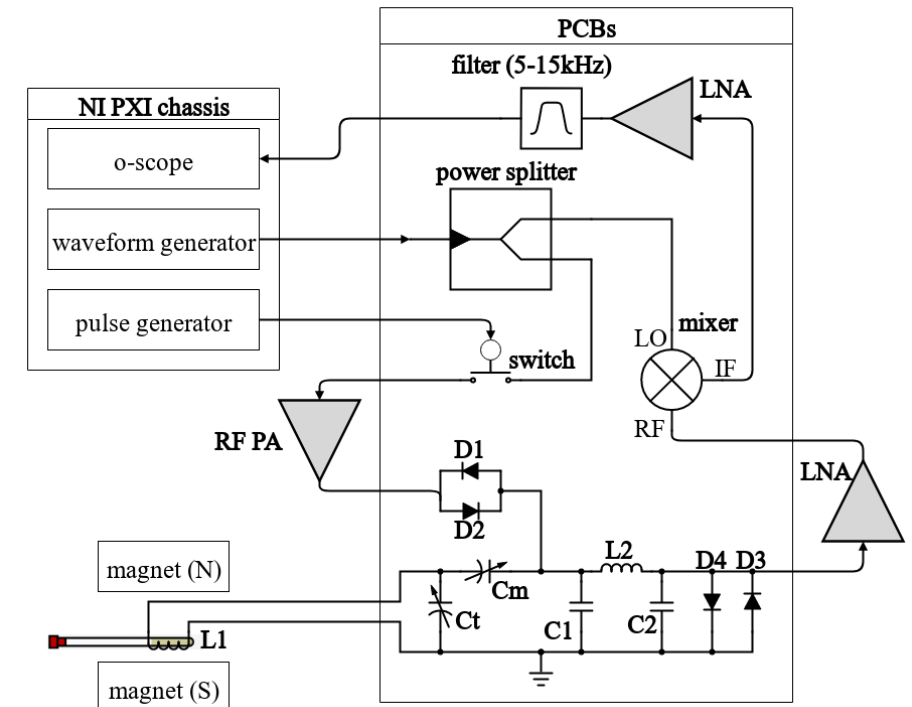
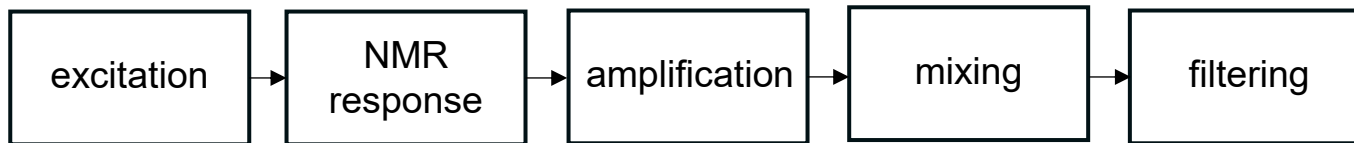
Fully assembled

Sample location

RF Electronics

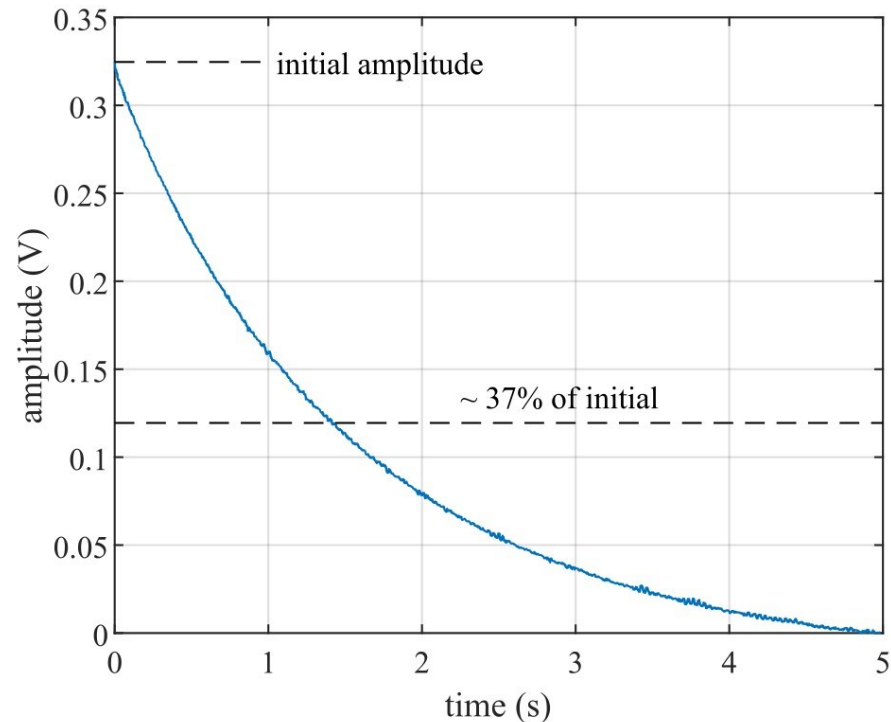
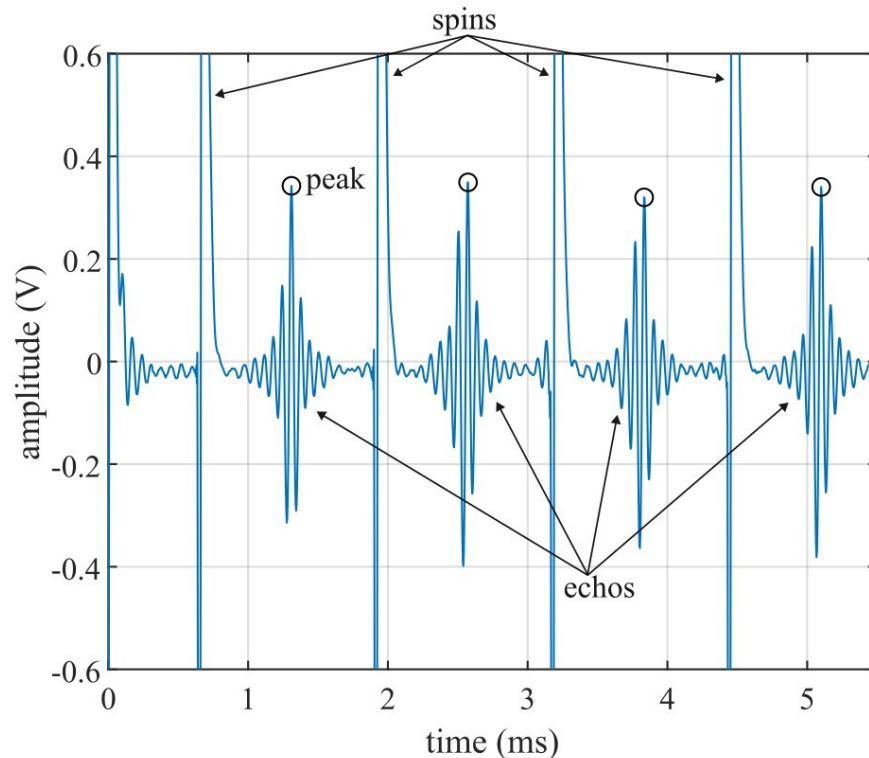
- A single 24 V DC power supply required
- Impedance of all cables and PCB traces matched to 50 Ω
- Waveform generator $\rightarrow$ sine wave at Larmor frequency
- Pulse generator $\rightarrow$ follows CPMG pulse train
- Duplexer (crossed diodes) isolates probe and LNA

General flow



TD-NMR Signals

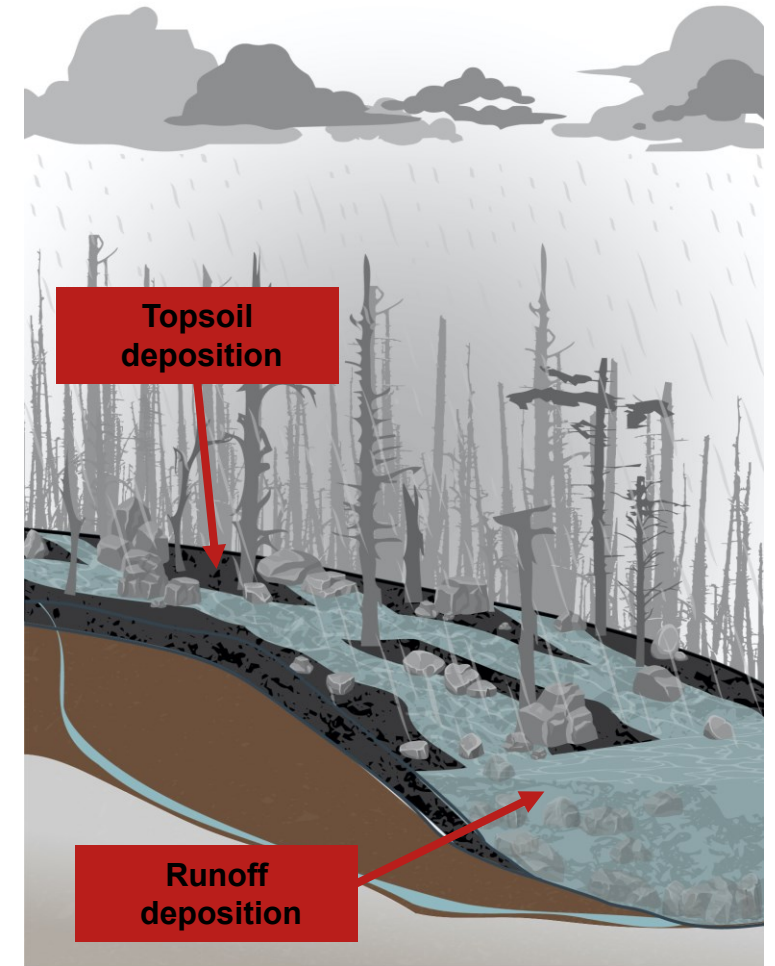
- T_2 relaxation modeled as $M_{xy}(t) = M_0 \exp(-t/T_2)$
- Relaxation rate is the reciprocal of relaxation time (i.e., $R_2 = 1/T_2$)
- Linear relationship between R_2 and MP concentration well established



Use Case: Wildfire Ash

Why Monitor Magnetic Contents of Wildfire Ash?

- Effects on topsoil
 - Ash deposits enhance magnetic content in soil
 - Magnetic properties are closely related to climate & rainfall
- Deposition through runoff water
 - Nearby bodies of water accumulate magnetic content
 - Nanoscale magnetite is linked to brain disease
- Understand fire severity and the reaches of magnetic deposition

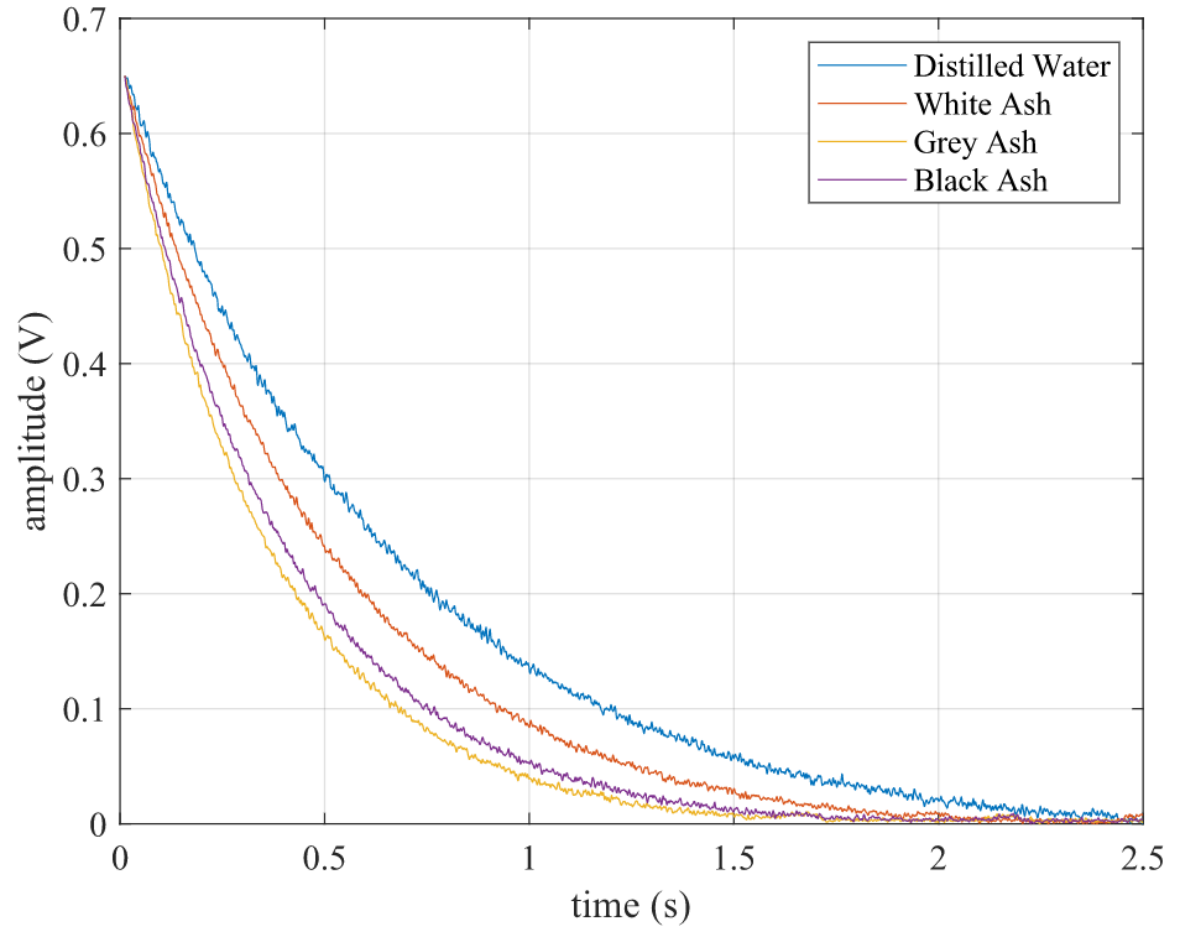


USGS, "How wildfires threaten U.S. water supplies," Water Data Labs, 06-Nov-2020. [Online]. Available: <https://labs.waterdata.usgs.gov/visualizations/fire-hydro/index.html#/>. [Accessed: 28-Oct-2022].

NMR Relaxometry with MPs

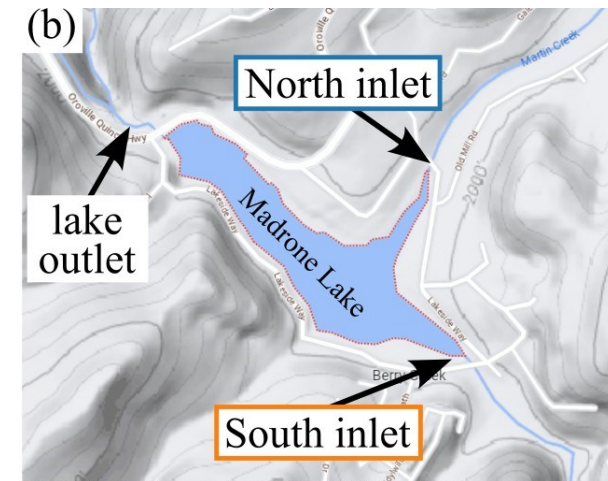
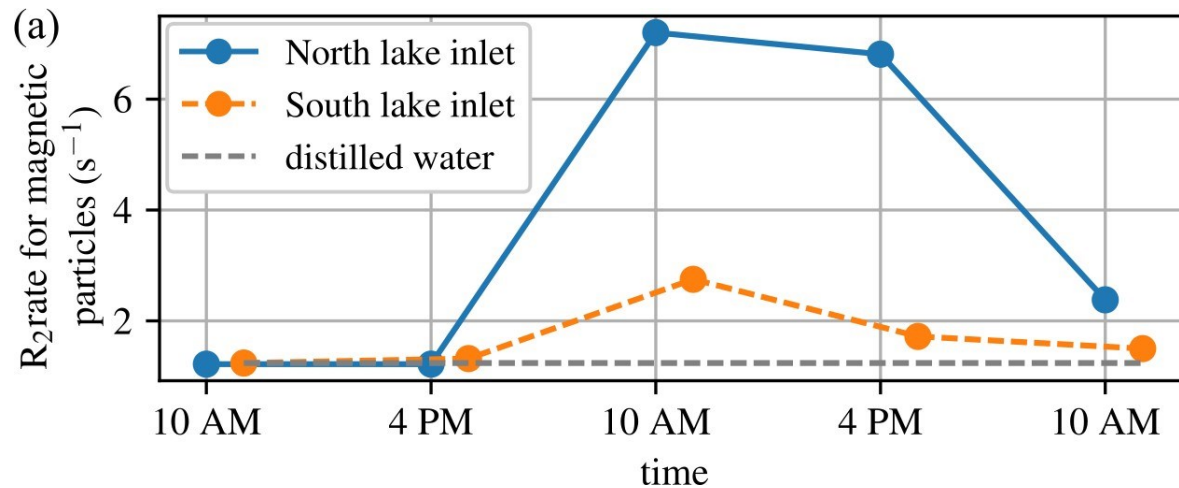
- 10 total ash samples
- 20 mg in 20 mL of water
- Distilled water used as reference
- R_2 extracted via least squares regression

- $M_{xy} = M_0 \exp(-R_2 t)$



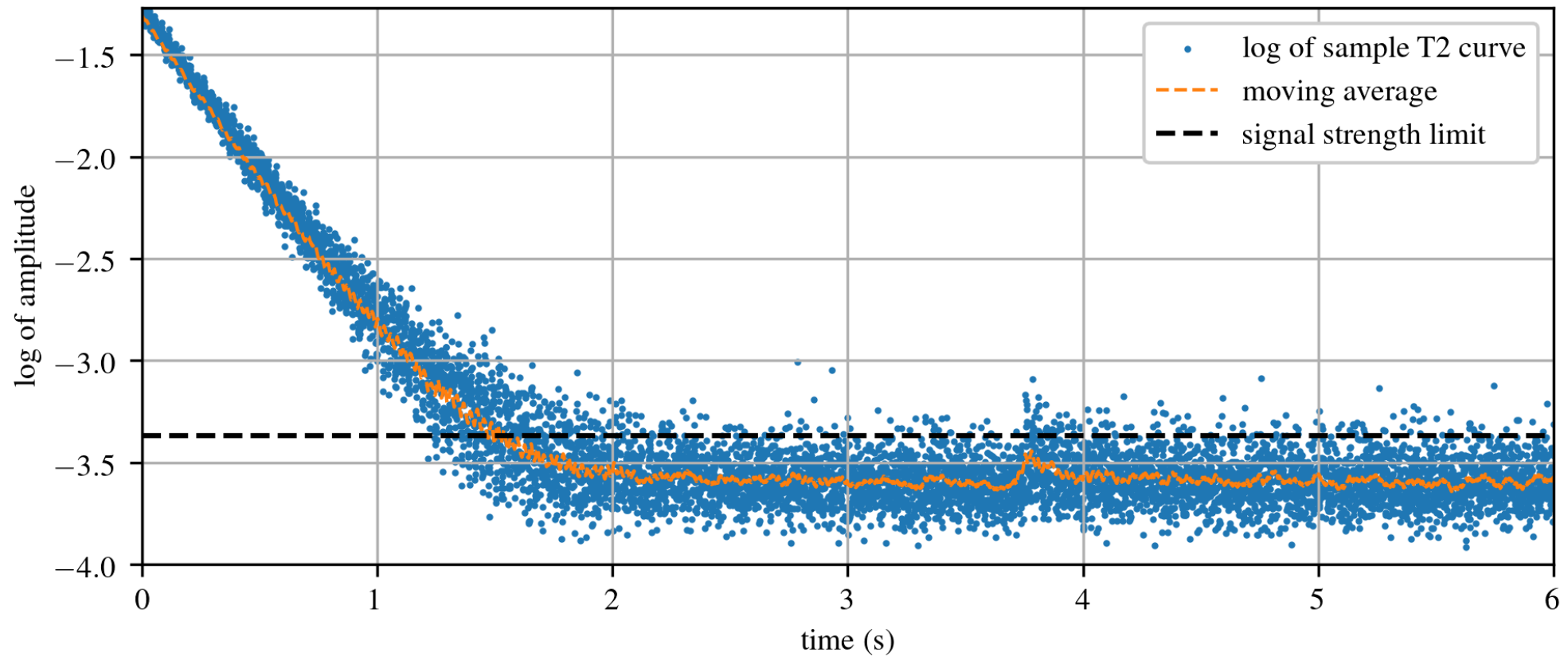
Real-time In Situ Tracking

- Monitoring Wildland-Urban Interface Fire Ashes and Run off Total iron content collected
- 10 surface water samples collected from two inlets to Lake Madrone that were subjected to runoff following the North Complex Fire in California



Separating Signal from Noise

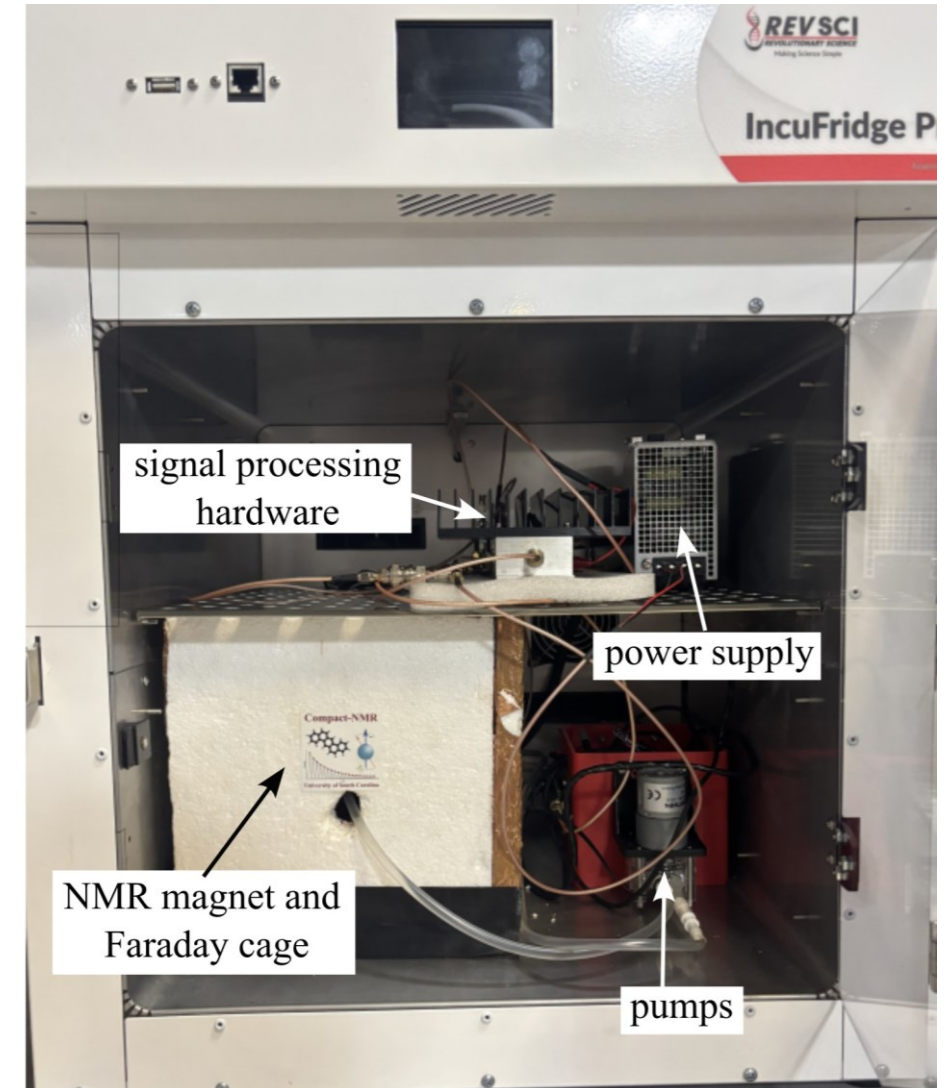
- Natural logarithm of T2 signal allows for the separation of signal and noise



Lab Data Collection for Model Training

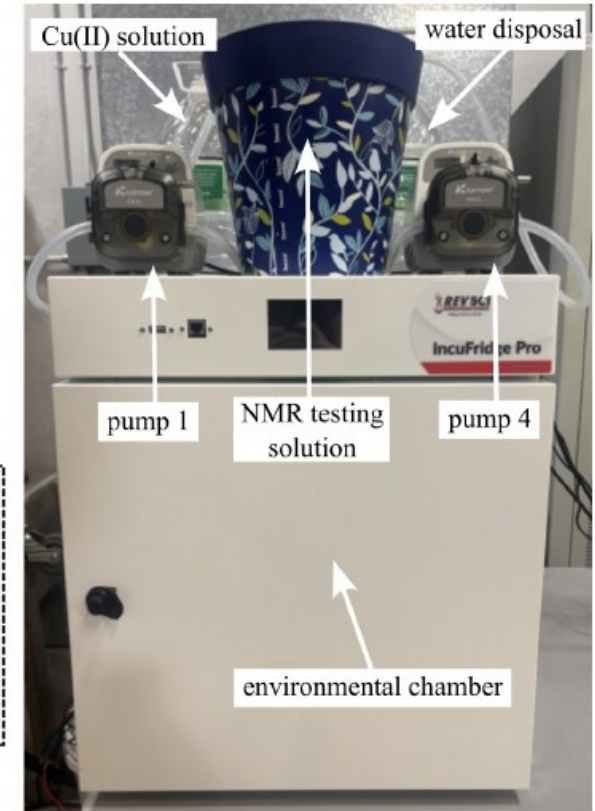
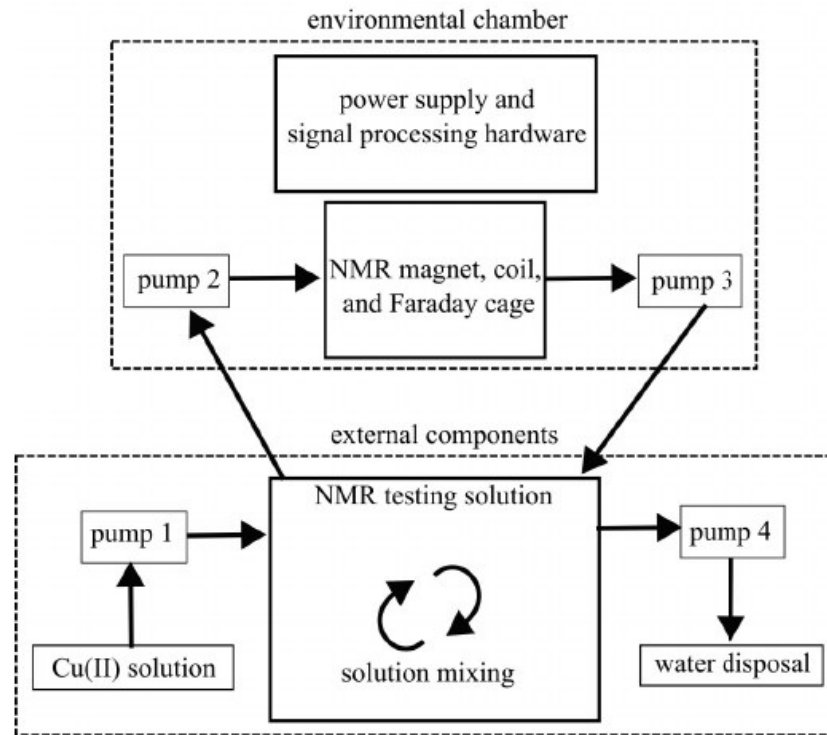
NMR in Environmental Chamber

- NMR is placed in an environmental chamber for temperature control.
- Long-term, an environmental chamber would not be easy if the magnet is calibrated over a temperature range.
- Over-sized chamber used for simplicity.



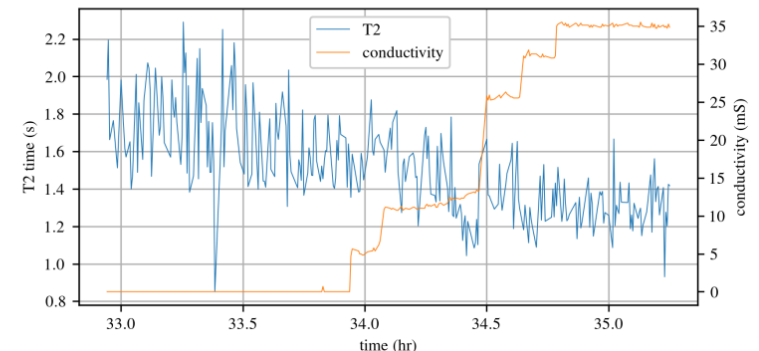
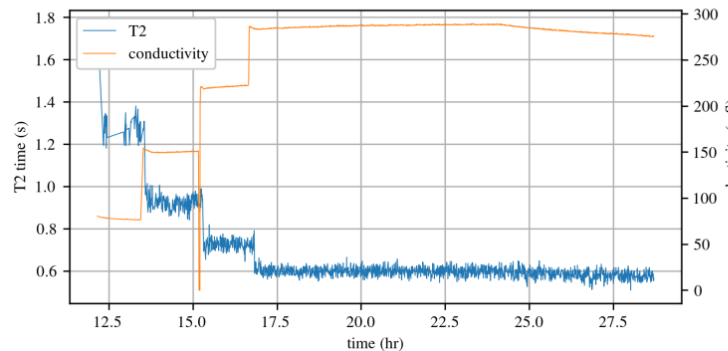
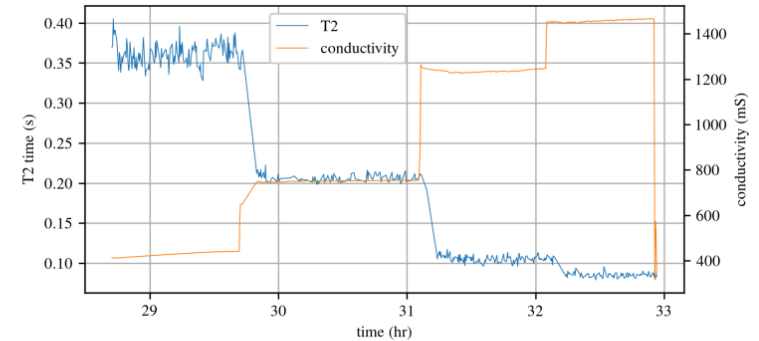
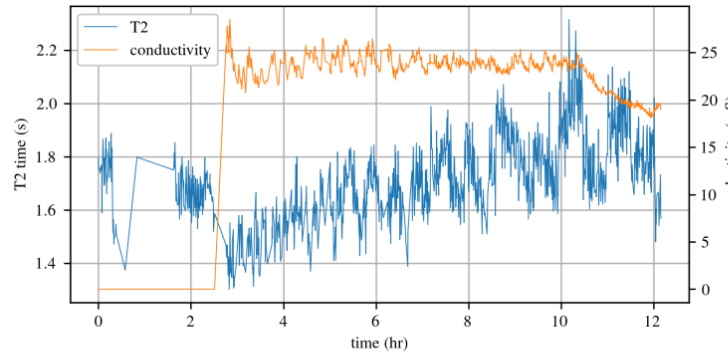
Data Collection for Model Training

- Data collection method: slowly drip Cu(II) solution into distilled water to provide near-continuous training data
- Remove water at same rate to avoid overflow



Model Training Data

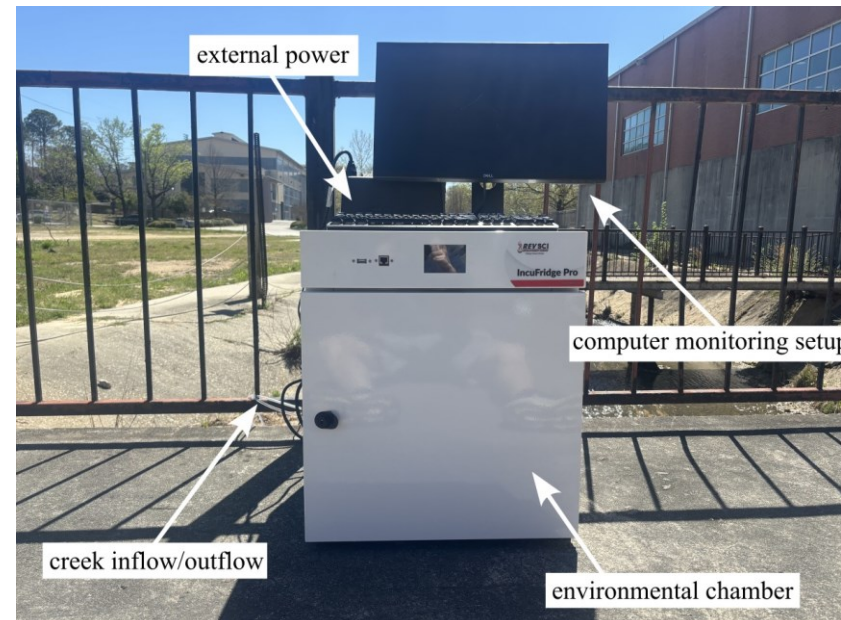
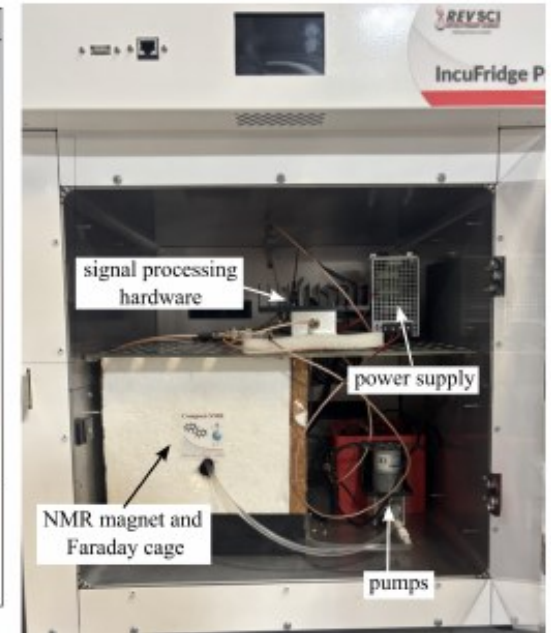
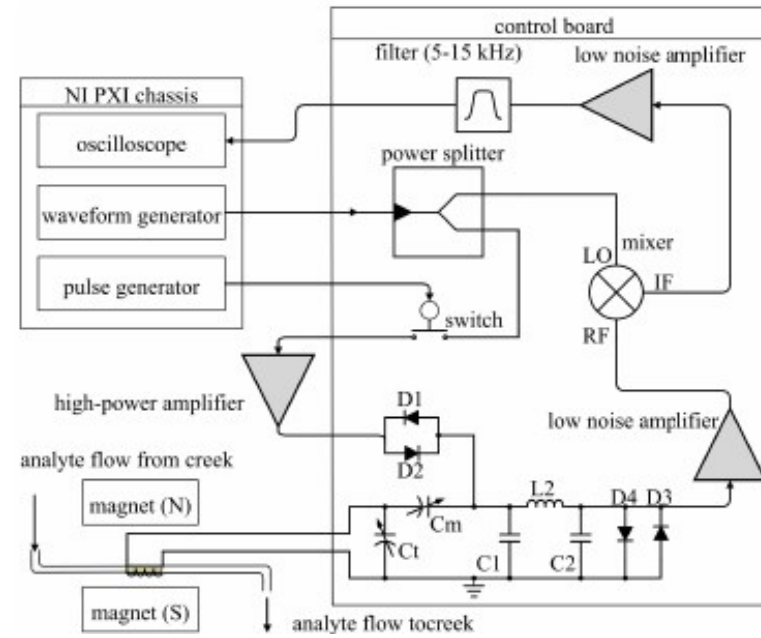
- Consists of Cu(II) contaminated water from 0mg/L to 1000mg/L
- Stair-step concentration increases to provide model with comprehensive ranges
- Slow and steady increase in Cu(II) contamination at low concentrations to provide near-continuous data



Field Deployment of In Situ NMR system

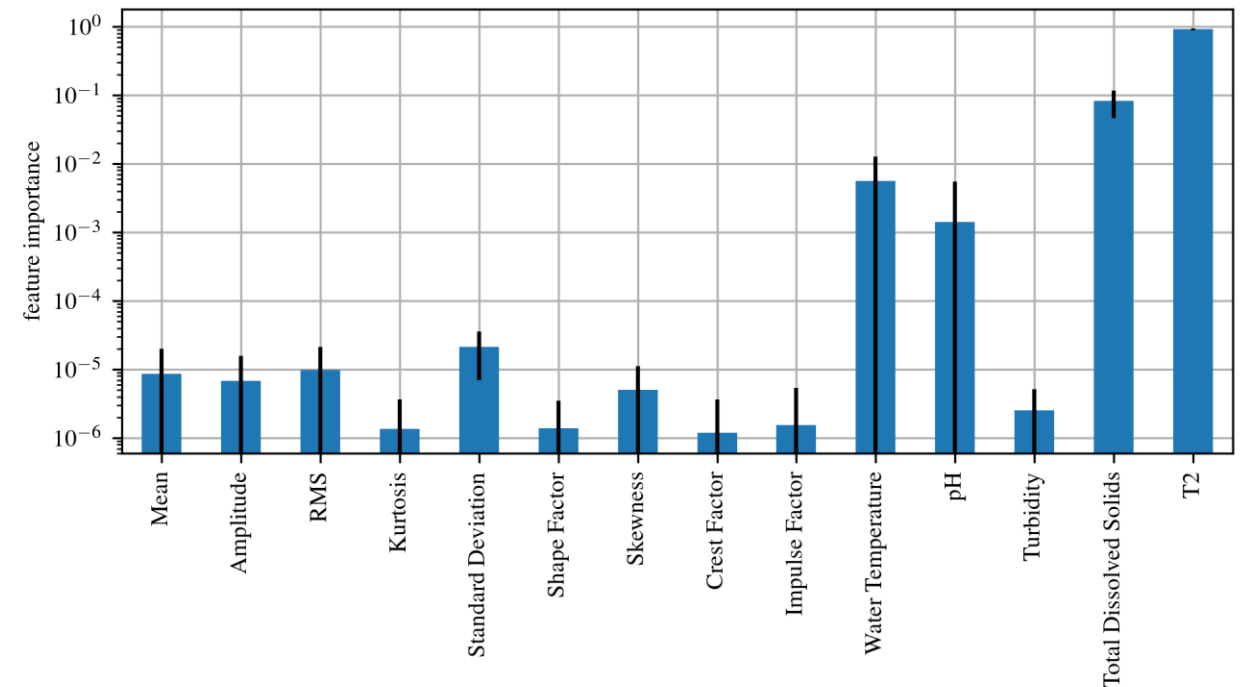
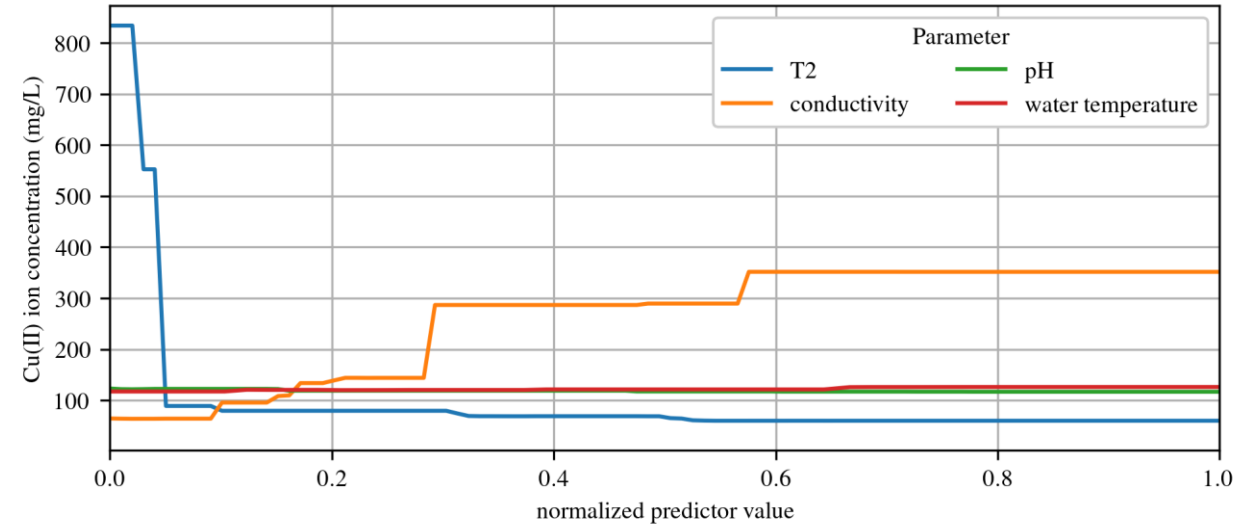
Field Deployed System

- Environmental chamber: enables temperature control for magnet and RF electronics
- Flow-through pumps: enable automatic sample collection
- NI PXI-8821: enables remote data acquisition with LabVIEW software
- Water quality sensor: measures pH, temperature, turbidity, and conductivity



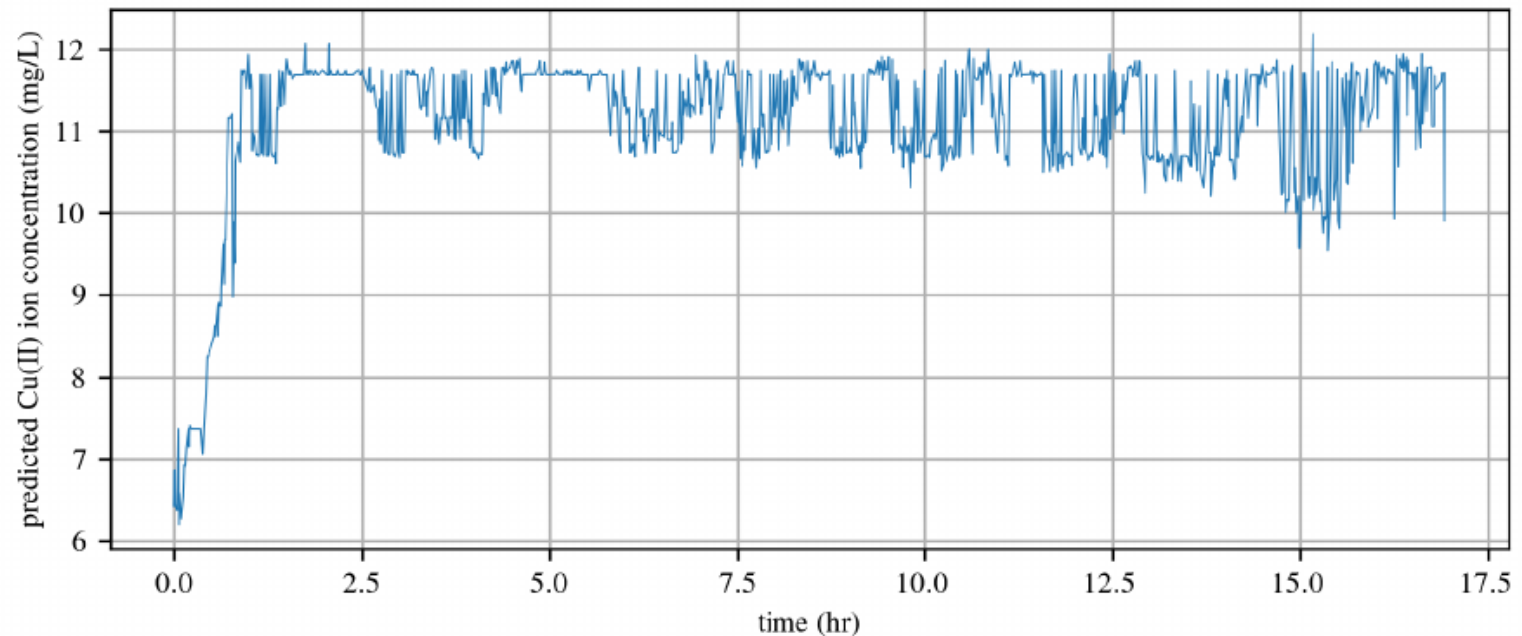
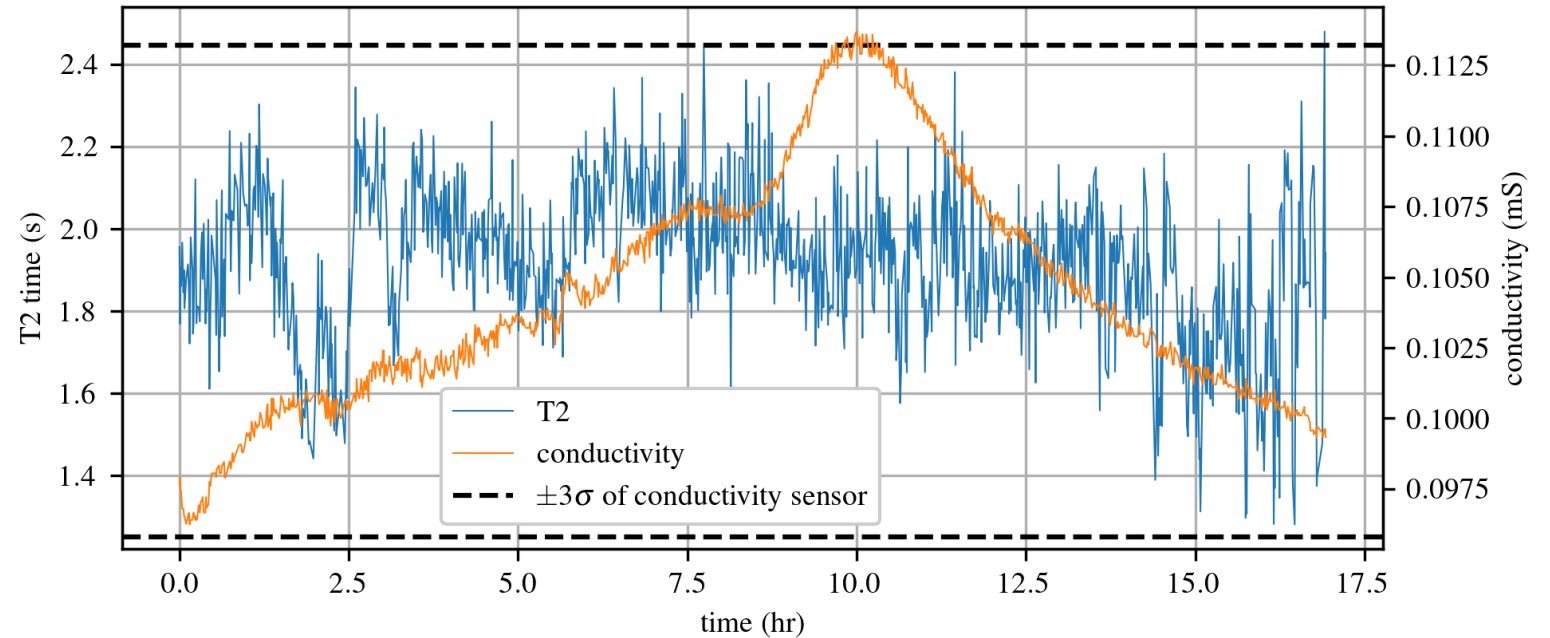
Machine Learning Model

- Partial dependence plot: indicates low T2 and high conductivity cause high Cu(II) concentration and high T2 and low conductivity cause low Cu(II) concentration
- Importance plot: shows that T2 and conductivity are by far the most important
- Together, they indicate the model is thinking correctly



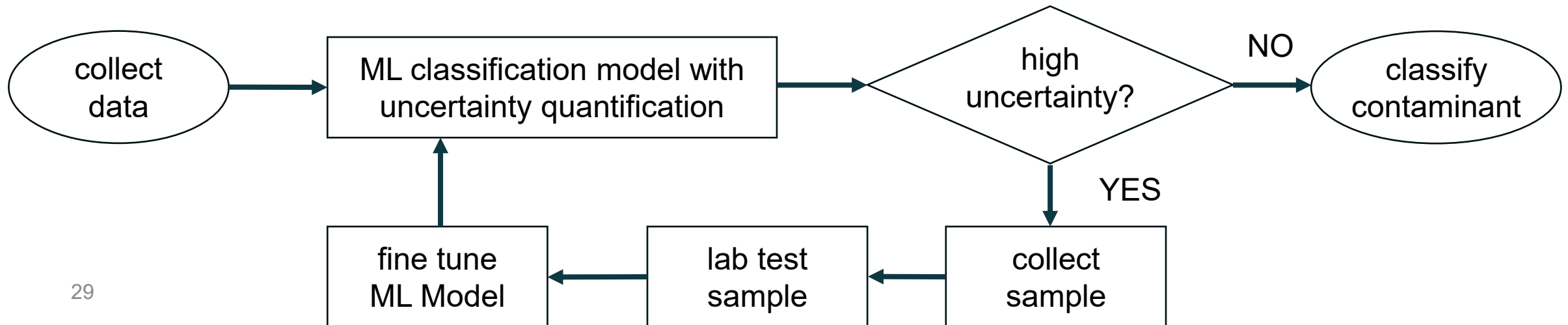
Rocky Branch Creek Data

- T2 and conductivity data collected in-situ over 17 hours
- T2 and conductivity (within 3σ) stay the same
- Model predictions agreeing with the consistency of data collection



Future Work: Fine-tuning ML Model

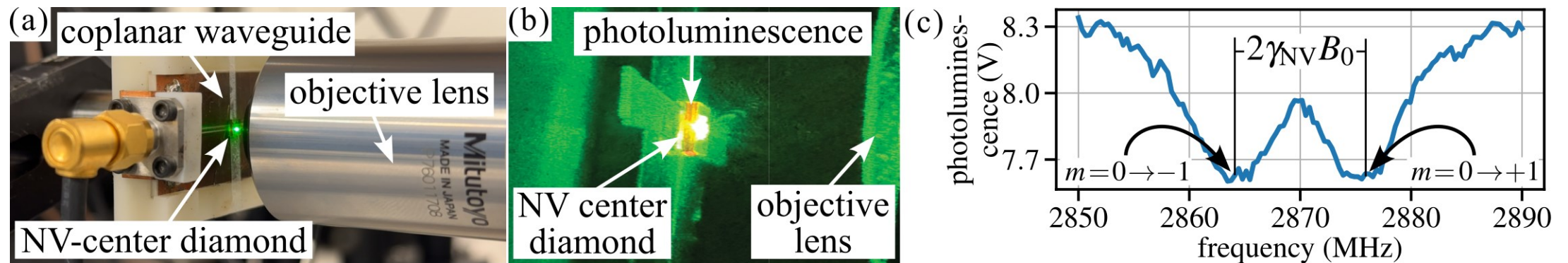
- The flow-through NMR will be deployed with an automatic water sampler and will trigger a sample based on uncertainties in predicted contaminate.
 - Collected samples will be returned to the lab for further assessment.
 - Lab results will be used to fine-tune the model
 - Over time, fewer lab samples will be required as the AI/ML model will more closely track the system.
 - Unknown contaminates events will trigger sample be taken, limiting False Negatives.



Future Work: Quantum Sensing

We are building a Quantum Sensor (NV center-based) to extend NMR to Optically Detected Magnetic Resonance (ODMR) to enable PPT sensing of PFAS in situ.

- **Operational ODMR on bench:** Confocal microscope + 543 nm pump, CPW microwave drive, and PL readout show clear Zeeman-split dips (Earth-field detection) on a 300 ppb NV diamond chip.
- **Optics/electronics in place:** Green HeNe + AOM, GHz MW source/amplifier, filters/pinholes; PL collected >640 nm with stable counts suitable for control/fit routines.
- **Gaps to close for NMR/ESR:** Need gated timing electronics for laser/MW pulsing and a gated single-photon-level detector



Acknowledgements



This material was sponsored by the ARO, United States under Grant No. W911NF 21-1-0306 and the National Science Foundation, United States under Grant Nos. 2152896 and 2344357. The views and conclusions contained within this document are those of the authors and should not be interpreted as representing the official policies of the ARO, NSF, or U.S. Government.



Thank You for Your Time

<https://github.com/ARTS-Laboratory/Compact-NMR>



Name: Austin Downey

Title: Associate Professor

Email: austindowney@sc.edu

Lab GitHub: github.com/arts-laboratory



**Molinaroli College of
Engineering and Computing**
UNIVERSITY OF SOUTH CAROLINA

References

1. Parker Huggins, Jacob S. Martin, Austin R.J. Downey, and Sang Hee Won. Interpretable machine learning for predicting the derived cetane number of jet fuels using compact TD-NMR. *Sensors and Actuators B: Chemical*, page 137018, December 2024. doi:10.1016/j.snb.2024.137018
2. Jacob S. Martin, Austin R.J. Downey, Mohammed Baalousha, and Sang Hee Won. Rapid measurement of magnetic particle concentrations in wildland-urban interface fire ashes and runoff using compact NMR. *IEEE Sensors Journal*, pages 1-1, 2023. doi:10.1109/jsen.2023.3272882
3. Janvrin, Winford, Jacob Martin, Daniel Hancock, Austin RJ Downey, Perry Pellechia, Joud Satme, and Sang Hee Won. "Open-Source Compact Time-Domain Hydrogen (1h) NMR System for Field Deployment." *Available at SSRN 5079344*.
4. Daniel Hancock, David P. Wamai, Md Asifuzzaman Khan, Winford Janvrin, Austin R. J. Downey, Mohammed Baalousha, and Thomas M. Crawford. Continuous water quality monitoring using field deployable NMR and explainable AI. In Weilin Hou, Linda J. Mullen, and Jarom Jackson, editors, *Ocean Sensing and Monitoring XVII*, page 15. SPIE, May 2025. doi:10.1117/12.3052964