Solid State Mixed-Potential Electrochemical Sensors for Natural Gas Leak Detection and Quality Control FE0031864 Lok-kun Tsui

University of New Mexico, Center for Micro-Engineered Materials



U.S. Department of Energy National Energy Technology Laboratory Resource Sustainability Project Review Meeting October 25 - 27, 2022

Project Overview

- Funding DoE FECM.
 - Gov't Share: \$1,498,217
 - Cost Share: \$374,555
 - Total: \$1,872,772
- Project Performance Dates: 4/1/2020 to 3/31/2023
- Project Participants:
 - University of New Mexico, Center for Micro-Engineered Materials
 - SensorComm Technologies, Inc.
- Overall Project Objectives:

Development of a portable, field-deployable sensor system for the identification and quantification of natural gas emissions.

Project Team







Lok-kun Tsui (PI)

Research Assoc. Professor (UNM CMEM and CBE) (Co-PI) Distinguishe d Professor (UNM CBE) Center Director (UNM CMEM and CBE)

Fernando

Garzon



Kannan

Ramaiyan

Research

Assoc.

Professor

(UNM

CMEM)



Sleight Halley

Graduate Student (UNM CBE + CMEM)



Kamil Agi

President and CEO (SCT), Research Associate Professor (UNM ECE)





Robert Ian

Innovation and Marketing Director (SCT) James Smith

Senior Engineer (SCT)

Motivation Cost of natural gas leaks

- Economic Cost of Methane Leaks: \$ 2 billion dollars per year¹
- Environmental CH₄ is a potent greenhouse gas
 - Global warming potential of over 100 years is 28x that of CO₂ (CO2e)²
 - Degrades quickly in atmosphere (half life ~ 10 years) ³
 - Limiting CH₄ emissions could have significant effect on short term climate change
- System Requirements:
 - Robust Field Deployment.
 - Distinguish between natural gas and other man-made and/or naturally occurring methane sources.
 - Limit of detection in the 10-100ppm range for surface level monitoring of buried pipelines – early warning system.





Figures from Maasakkers⁴

[2] "Global Methane Initiative." https://www.globalmethane.org/ (accessed Mar. 04, 2022).

[3] V. Masson-Delmotte et al., Eds., Climate Change 2021: The Physical Science Basis. on Climate Change. Cambridge University Press, 2021.

[4] J.D. Maasakkers, et al., Environ. Sci. Technol. 50 (2016) 13123–13133.

^{[1] &}quot;A.J. Marchese, et al. Science. 7204 (2018) eaar7204.

Technical Approach & Project Scope

Sensor Additive Manufacturing and Testing Develop AM methods to prototype sensor materials and designs to achieve 10's of ppm LoD for natural gas.

Machine Learning for NG ID and Quantification Develop field deployable ML methods to identify natural gas and quantify methane concentrations. Target accuracy > 97%.

IoT Technology

Develop IoT platform to record, process, and wirelessly transmit sensor data in a portable package for additional post processing of the data and early warning capability.

Field Testing

Demonstrate we can detect emissions in real world conditions in a field test.









Mixed Potential Sensors

- Composition Multiple electrodes with different materials embedded in a solid electrolyte.
- Operating Principle Solid state electrochemical device generates difference in catalytic activity between electrodes upon gas exposure generates a voltage.
- Multi-element array configuration - CH₄, Heavy HCs, NH₃/H₂.
- Prototyped with ceramic AM at 10s of devices scale.
- Clear transition path to mass production.





Ceramic Additive Manufacturing

Completed Sensor

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Technology Comparison

Competing Technologies

Satellites and Aircraft

- Surveys wide areas, but with low spatial resolution
 - Very expensive
 - Cannot do real-time, continuous monitoring

Optical IR Instruments

- CRDS / IR Spectroscopy / NDIR / Photoacoustic
 - High resolution ppb-ppm CH4
 - Limited speciation.
 - Need to keep cavities clean.

Semiconductor Sensors

- Sensitive to wide range of species with ppm level resolution.
 - Sensor drift is an unsolved problem with SC sensors.

Our Technology

- Mixed potential sensors are sensitive to gases of interest at 10-10000 ppm range.
 - Low cost, robust, field deployable.
 - Clear transition path to mass production: ceramic manufacturing methods.
 - Broad speciation: CH₄, C₂H₆, C₃H₈, NO_x, NH₃, H₂

Our Challenges

- Develop AM processes to prototype these devices
- Develop and integrate ML methods with high accuracy
- Integrate UNM's sensor technology with SCT's IoT platform.

PROJECT PROGRESS SINCE

Sensor Evolution (2020 to Present)



Additive Manufacturing – New Generation Sensors

- Previous work achieved < 1000 ppm limit of detection using yttria-stabilized zirconia (YSZ) substrates.
- Desired signals >1 mV for reliable signal-to-noise background on IoT platforms.
- We developed a process with magnesia- (MSZ) and ceria-stabilized zirconia (CSZ) that enhanced the mixed potential signal by providing better ionic isolation of the electrodes.
- Demonstrated a 20x enhancement in sensitivity. Would like 10-100 ppm sensitivity for buried pipeline measurements.





Previous Effort – YSZ Substrate

Response to 100 ppm CH₄ in Natural Gas

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Enhanced Limit of Detection (LOD)

YSZ Substrate Sensor





- 40-5000 ppm CH₄ equivalent NG at 550 C was tested with E:M ratio of 0.19
- Sensor response of ITO vs. Pt was linear in log(concentration).
- MSZ substrate-based sensor has >1 mV response on sensor signals.
- LOD likely to be on order of 10 ppm.

Machine Learning – Mixture ID

- Task Distinguish between 4 mixes:
 - CH4 in air
 - Natural Gas Low Ethane (E:M = 0.02 0.05)
 - Natural Gas Hi Ethane (E:M = 0.19-0.27)
 - CH₄ + NH₃ Agriculture
- CH₄ content: 300-2500 ppm
- ANN's showed > 98% identification accuracy which meets target milestone accuracy metrics.



Real Labels

Machine Learning – Quantification

- Quantification was performed for CH₄ in two different natural gas mixtures, CH₄ in air, and CH₄ + NH₃ in 300-2500 ppm CH₄.
- Optimized ANN architecture together with a 10-neuron hidden layer artificial neural networks was found to have the best accuracy.
- Concentration (ppm) error at 2.5% (~80-90% of test data) milestone target.
- Demonstrated capability for quantification of secondary species: C₂H₆, total heavy hydrocarbon (C₂H₆+C₃H₈), and NH₃.
- Lower computational-cost methods for identification and quantification under investigation for better integration with IoT platforms.









Natural Gas $- C_2 H_6: CH_4 = 0.04$ 13

System Portability Development

2021



Computer, Furnace, Digital Multimeters.

Power requirements: ~ 1 kW.



2022

Sensor with portable ceramic disk heater



IoT data acquisition system (SCT)

Portable System Power Requirements ~10's W

IoT Development – SCT



Identifies real-time presence of methane gas. Differentiates livestock, wetland and natural gas infrastructure. Provides analytics for emission leak alerts (early warning system).



GOAL: Development of integrated read-out electronics and IoT capability

Key Research Topics:

- Effects of sampling rates
- Noise performance
- Development of read-out electronics
- Integration with IoT capability
- Early warning capability

IoT Development – SCT



Field Testing – CSU METEC

- Initial round of field testing was completed at CSU METEC on August 22-26th.
- Enables test in real world environment but with programmable leak rates and geometries.
- Examined emissions from a buried pipeline: 2 ft deep using natural mixed soil material.
- Leak rates from 9-40 SLPM were measured.
- Distance from source: 0-50 inches.
- Second round in progress this week.





Field Testing



Test ended (Thunderstorm)

- We observed a clear signal from our • sensor in response to a 22 SLPM leak.
- Signal decreases linearly with ٠ distance.
- Observed events such as pause in emissions and rain.
- Accomplished first in-field demonstration of MPES-IoT technology outside of laboratory for natural gas emissions detection!
- Identified aspects of test system that need improvement including sampling rate and cell reliability.
- Implemented in 2nd test run which is in progress this week.

Sensor Data Remote Dashboard



Testing at METEC on Tuesday



Data collected at METEC between 12:30-3:30PM EST 10/25

Plans for future testing/development/ commercialization

- Provisional Patent "Low Ionic Conductivity Substrates for Multi-Element Mixed Potential Natural Gas Sensor" (Filed 2/27/22)
- Intrinsically Safe Design of electronics (Class 1, Div 1)
- Transition to scale-up
 - Major need for screen printing and tape casting for mass production of MPES sensors.
 - Oxeon Energy* (North Salt Lake, UT, USA)
 - Exploring building large-scale manufacturing capacity
 - Manufacturing facility in New Mexico (methane, hydrogen, NOx sensors and systems)
 - Funded through DoE loan program?

Plans for future testing/development/ commercialization

- Funding opportunities for continuation of this research and commercialization(DoE, EPA, Southwest Hydrogen Hub)
- Customer Discovery
 - Potential Pilot Programs: Encino Energy, Sunline Bus Company
- New Applications
 - Hydrogen sensors
 - Hythane sensors
 - NO_x sensors
 - Testing sensors in vehicular applications (e.g. tailpipe)

Future Work - Hythane

- Discussions with DoE program manager have indicated an interest in Hythane (H₂ + CH₄) sensitivity.
- Initial tests in our lab indicate hydrogen can be easily detected in H₂ + CH₄ mixes.
- Further optimization of materials selection could boost selectivity and sensitivity to H₂.



Outreach and Workforce Development Efforts or Achievements

• Outreach:

- Presented work to New Mexico's US Senator Martin Heinrich (February 2022).
- Research article published in J. Electrochem. Soc.,¹ review published in Sens. Act. B (invited),² 2 more papers submitted by end of year (SNB, ECS Sensors Plus).
- Presentations at Electrochemical Society Meeting (May & October 2022) and Solid Freeform Fabrication Symposium (July 2022).
- Total 2 publications and 10 conference presentations to date.
- Workforce Development:
 - Sleight Halley (Ph.D. Graduate Student), expected graduation spring 2023.
 - Donna Koechner (engineer) hired at SCT.

1. "Combined Mixed Potential Electrochemical Sensors and Artificial Neural Networks for the Quantification and Identification of Methane in Natural Gas Emissions Monitoring" S. Halley *et al.* 2021 *J. Electrochem. Soc.* **168** 097506

2. "A review of zirconia oxygen, NOx, and mixed potential gas sensors – History and current trends." S. Halley *et al.* 2022 *Sensors and Actuators B: Chemical* **370** 132363





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Summary Slide

- We have developed a multi-electrode mixed potential sensor array with limit of detection of natural gas at 10s of ppm.
- Machine learning methods were successful in identifying and quantifying CH₄ and other subcomponents.
- The sensors were integrated into a portable IoT platform for field deployment.
- We were able to successfully detect the emission from a simulated buried pipeline during a field test.

Future direction: Scale up of sensor systems production, additional in-field testing, taking advantage of new applications in renewable energy economy.

Acknowledgements:

- Aidan Duggan and Dan Zimmerle (CSU METEC) for assistance in development and implementation of field test plan.
- This work was supported by DoE Office of Fossil Energy and Carbon Management through award FE0031864.
- Program Managers: William Fincham (2020-2022); Joseph Renk (2022 – Present)

Contact Information



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Appendix

These slides will not be discussed during the presentation but are mandatory.

Organization Chart



Subcontract



PI: Lok-kun Tsui **Co-PI**: Fernando Garzon **Accounting**: Svetlana Shevkun

Research Assoc. Professor: Kannan Ramaiyan

Graduate Student: Sleight Halley

President and CEO: Kamil Agi

Innovation and Marketing Director: Robert lan

Electrical Engineer: James Smith

Gantt Chart / Task 1 and 2

		Q3 BP3											
Task	Assigned Resources		Yea		Year	r 2		Year B					
		Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4
Task 1.0 Project Management and Planning	UNM / SCT												
Task 1.1 Project Management Plan	UNM / SCT	0											Δ
Task 1.2 – Technology Maturation Plan	UNM / SCT	0											Δ
Task 1.3 – Publication and Presentation of Results	UNM / SCT			0									Δ
Task	Assigned Resources		Yea		Yea	r 2		Year 3					
		Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4
Task 2.0 Sensor Fabrication	UNM												
Subtask 2.1 – Sensor Prototyping	UNM	0			Δ								
Milestone 2.1 – Prototype 2-element sensor	UNM			<									
Subtask 2.2 – Sensor Element Evaluation	UNM		0			Δ							
Subtask 2.3 – Screen Printed Sensor Fabrication	UNM					0						Δ	
Milestone 2.3 – Multi-Element Sensor	UNM							~					

Gantt Chart / Task 3

									Q3 BP3				
Task	Assigned Resources			Yea	r 2			Year	3				
		Q1	Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4			
Task 3.0 Artificial Neural Network Development	UNM/SCT												
Subtask 3.1 – Laboratory Collection of Training Data	UNM	0									Δ		
Milestone 3.1 – Initial Training Data Batch				×									
Subtask 3.2 – Gas Type Identification Training	UNM			0			Δ						
Milestone 3.2 – – Optimized ANN Algorithm for Identification	UNM					>							
Subtask 3.3 – Gas Species Quantification ANN Training	UNM			0					Δ				
Milestone 3.3 – Optimized ANN Algorithm for Quantification	UNM							~					
Subtask 3.4 – Deployment of ANN algorithm on Mobile Hardware	UNM/SCT					0							Δ
Milestone 3.4 – ANN on Development Board	UNM/SCT									~			

Gantt Chart / Task 4

						Q3 BF								
Task	Assigned Resources	Year 1					Year	r 2			Yea	·3		
Task 4.0 – Development of an Integrated Sensing Platform		Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4	
Subtask 4.1 – Sensor Interface Development	SCT	0			Δ									
Milestone 4.1 – 2-Element Sensor Interface Device Completed	SCT				~									
Subtask 4.2 – Multi-Element Sensor Interface	SCT			0				Δ						
Milestone 4.2 – Multi-Element Sensor Interface w/ wireless transmission Device Completed	SCT							>						
Subtask 4.3 – Integration of ANN Inference Hardware	SCT						О						Δ	
Milestone 4.3 – Completed Sensor Package	UNM/SCT										~			

Gantt Chart / Task 5

										BP3			
Task	Assigned Resources			Yea	r 2			Yea	r 3				
Task 5.0 – Field Test and Validation		Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4	Q1	Q2	Q3	Q4
Subtask 5.1 – Arrange for Access to Field Test Facility	UNM						о	Δ					
Milestone 5.1 – Field Test Location Selected	UNM									~			
Subtask 5.2 – Development of Field Test Plan and Completion of NEPA Documentation	UNM/SCT						ο		_	>			
<u>Comprehensive Field Test Plan</u> (Decision Point I)	UNM/SCT									~ <			
Subtask 5.3 – Field Test	UNM/SCT									C	\rightarrow		Δ
Milestone 5.2 – Field Test Results Completed	UNM/SCT											7	*