

# Quantification of methane emissions from the natural gas gathering system using distributed sensors

Albert Presto

Dept. of Mechanical Engineering

Center for Atmospheric Particle Studies



**Carnegie  
Mellon  
University**

# Project objectives

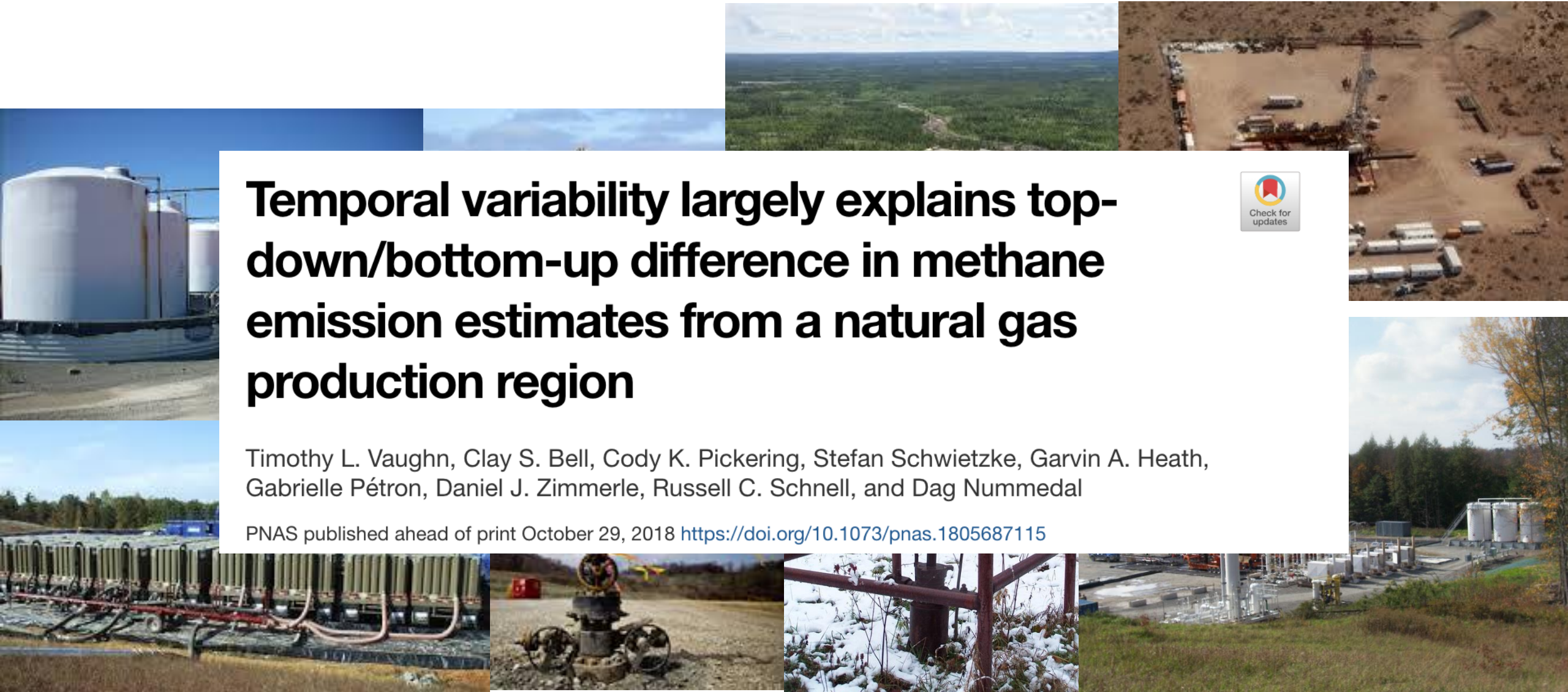
- Demonstrate the ability of a distributed, low-cost sensor network to quantify temporally varying methane emissions from natural gas gathering infrastructure
- Apply this approach to measure emissions from gathering pipelines and pig launchers

# Emissions occur at all stages of the gas life cycle

## Temporal variability largely explains top-down/bottom-up difference in methane emission estimates from a natural gas production region

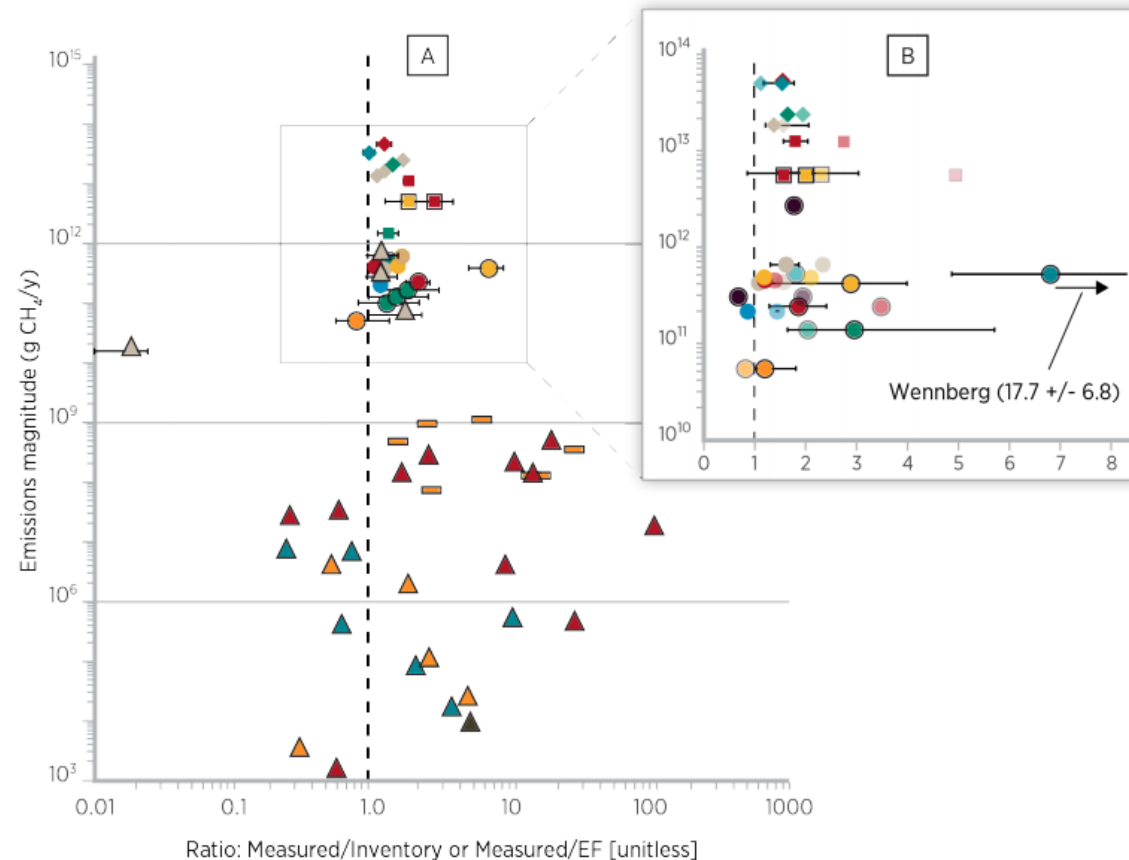
Timothy L. Vaughn, Clay S. Bell, Cody K. Pickering, Stefan Schwietzke, Garvin A. Heath, Gabrielle Pétron, Daniel J. Zimmerle, Russell C. Schnell, and Dag Nummedal

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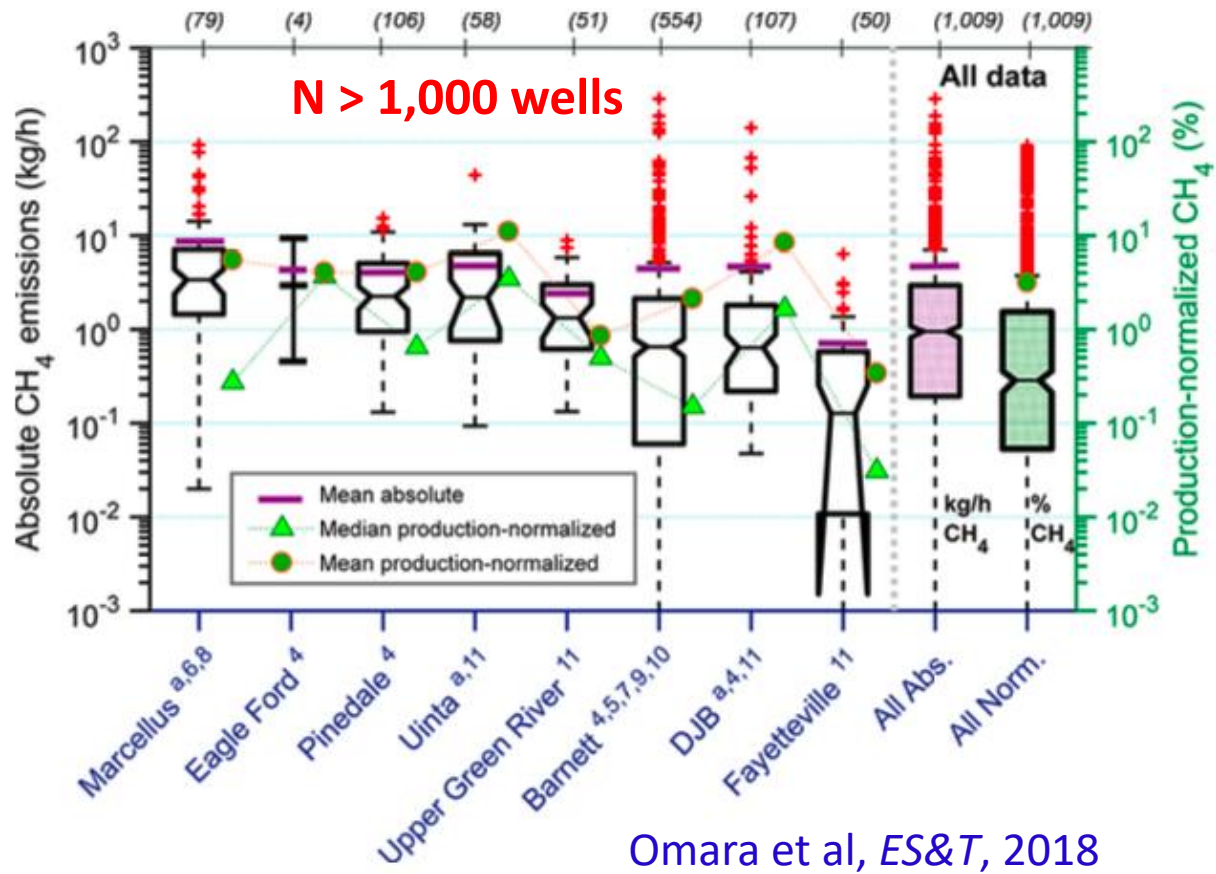
# Knowledge gaps

- **Mass Closure:** Inventories under predict actual emissions.



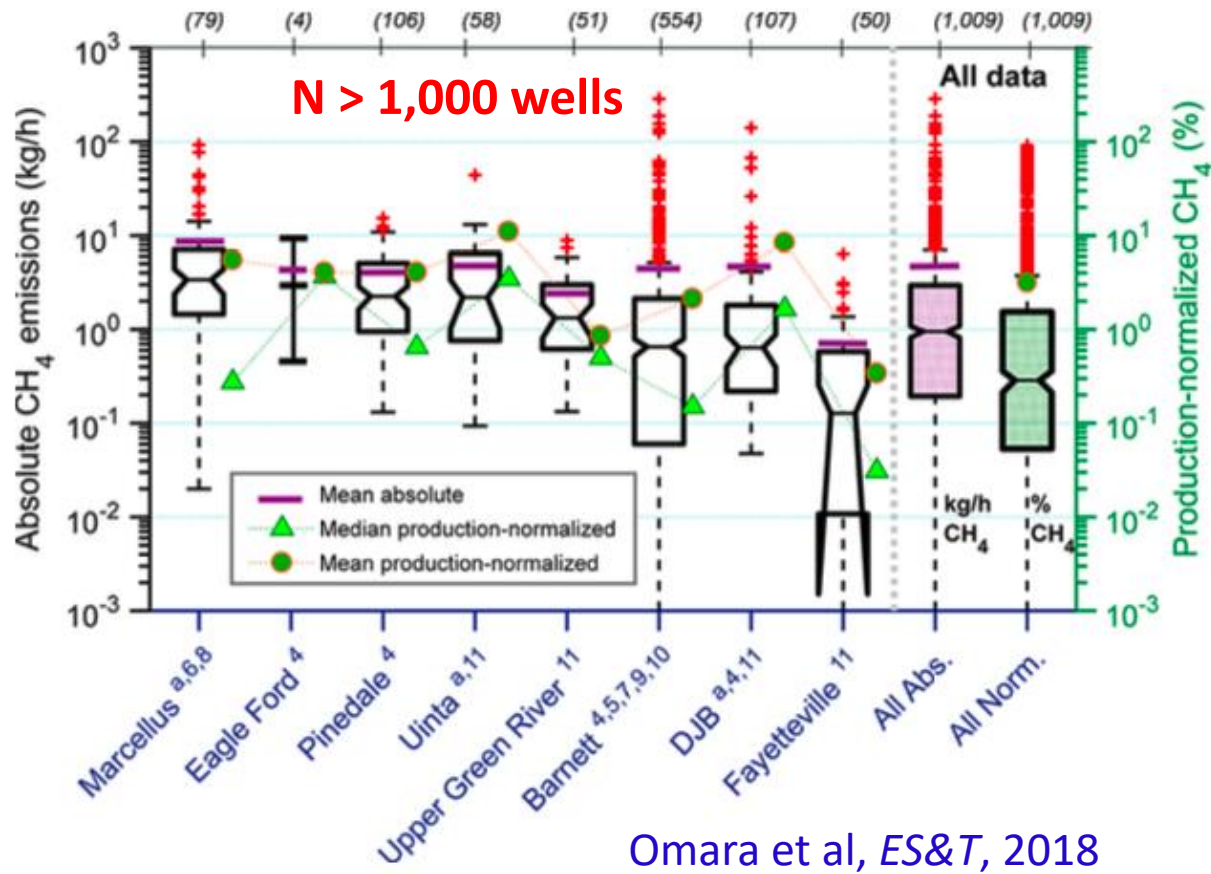
# Knowledge gaps

- ***Incomplete emissions information across sectors:*** Skewed towards production



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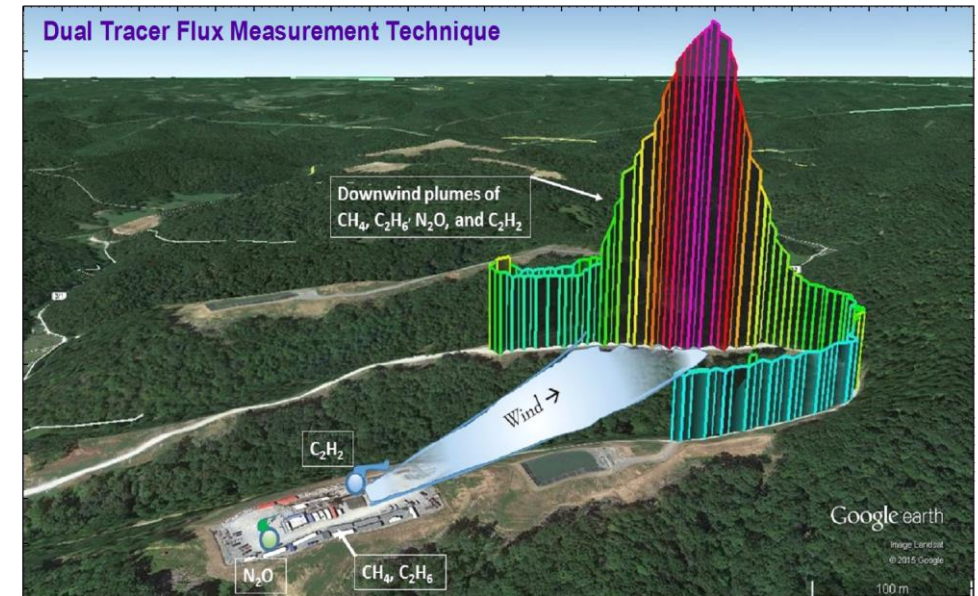
Gathering pipelines: 1 paper

Gathering pipeline methane emissions in Fayetteville shale pipelines and scoping guidelines for future pipeline measurement campaigns

**Authors:** Daniel J. Zimmerle , Cody K. Pickering, Clay S. Bell, Garvin A. Heath, Dag Nummedal, Gabrielle Pétron, Timothy L. Vaughn

# Knowledge gaps

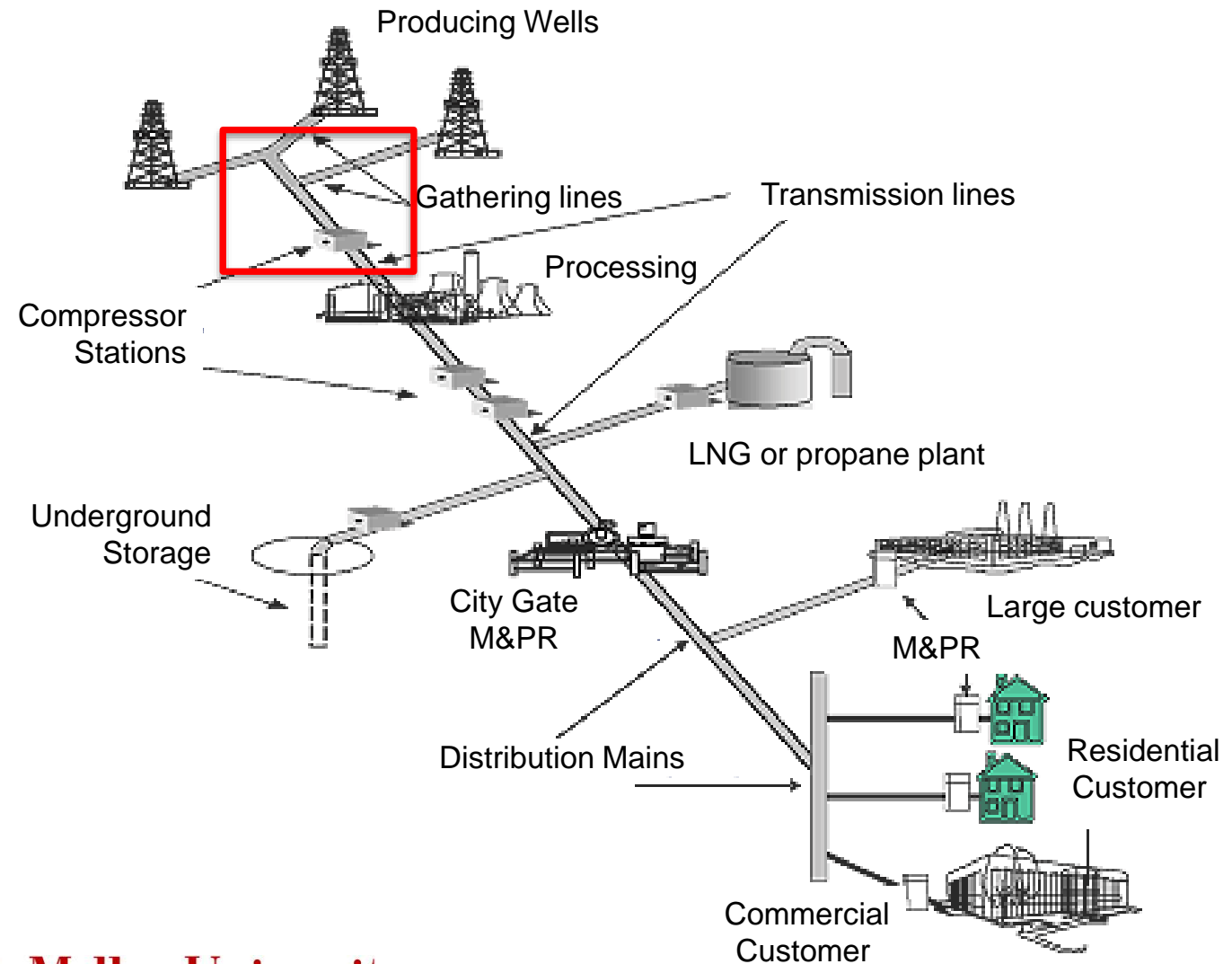
- ***Incomplete emissions information across time:*** Most previous emissions measurement studies collected snapshots of emissions.



# Knowledge gaps

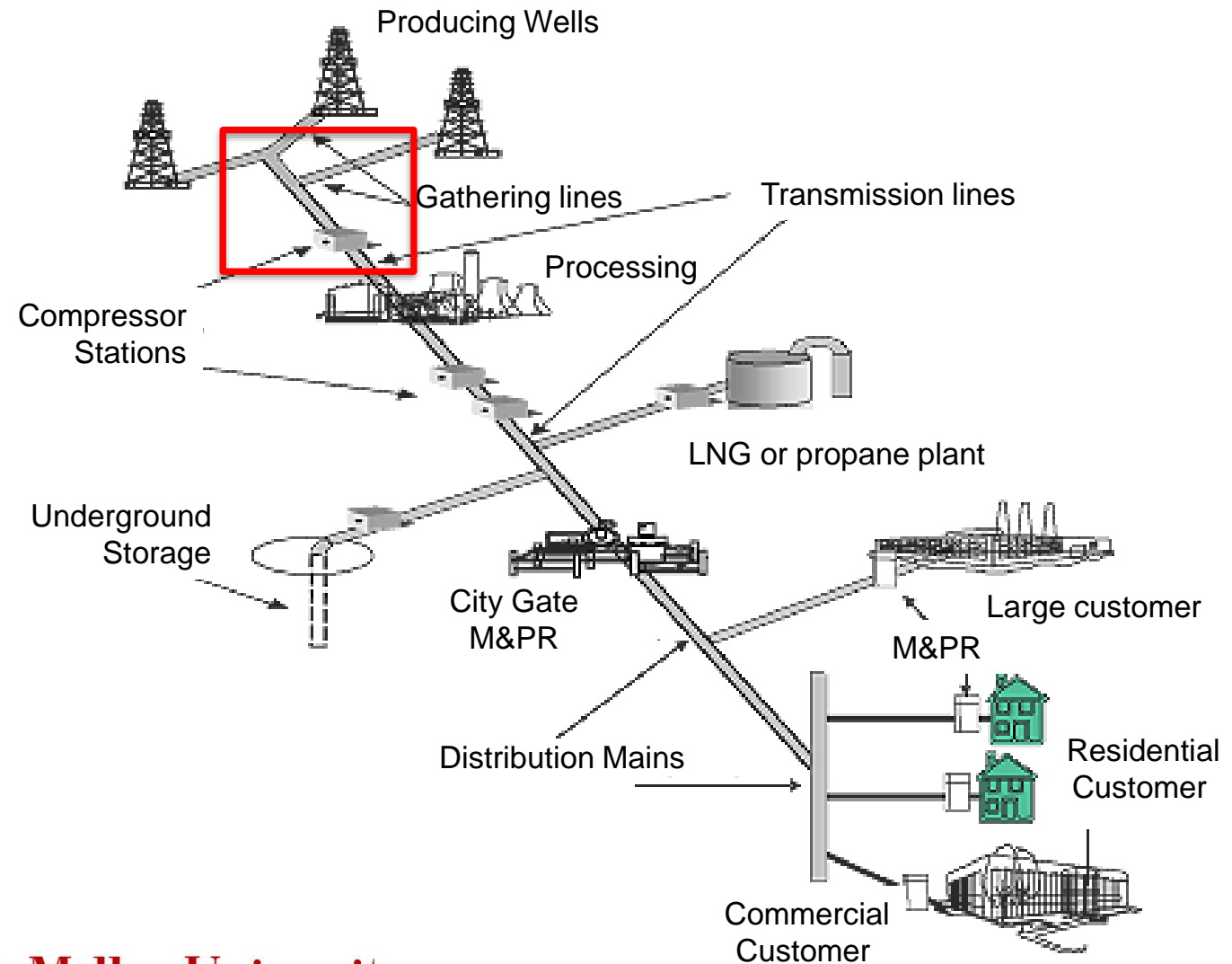
- ***Leak detection strategies:*** There is uncertainty in how to best identify leaks from widely distributed infrastructure (like pipelines) and how to design efficient maintenance and repair schemes

# Three main emissions sources for gathering system



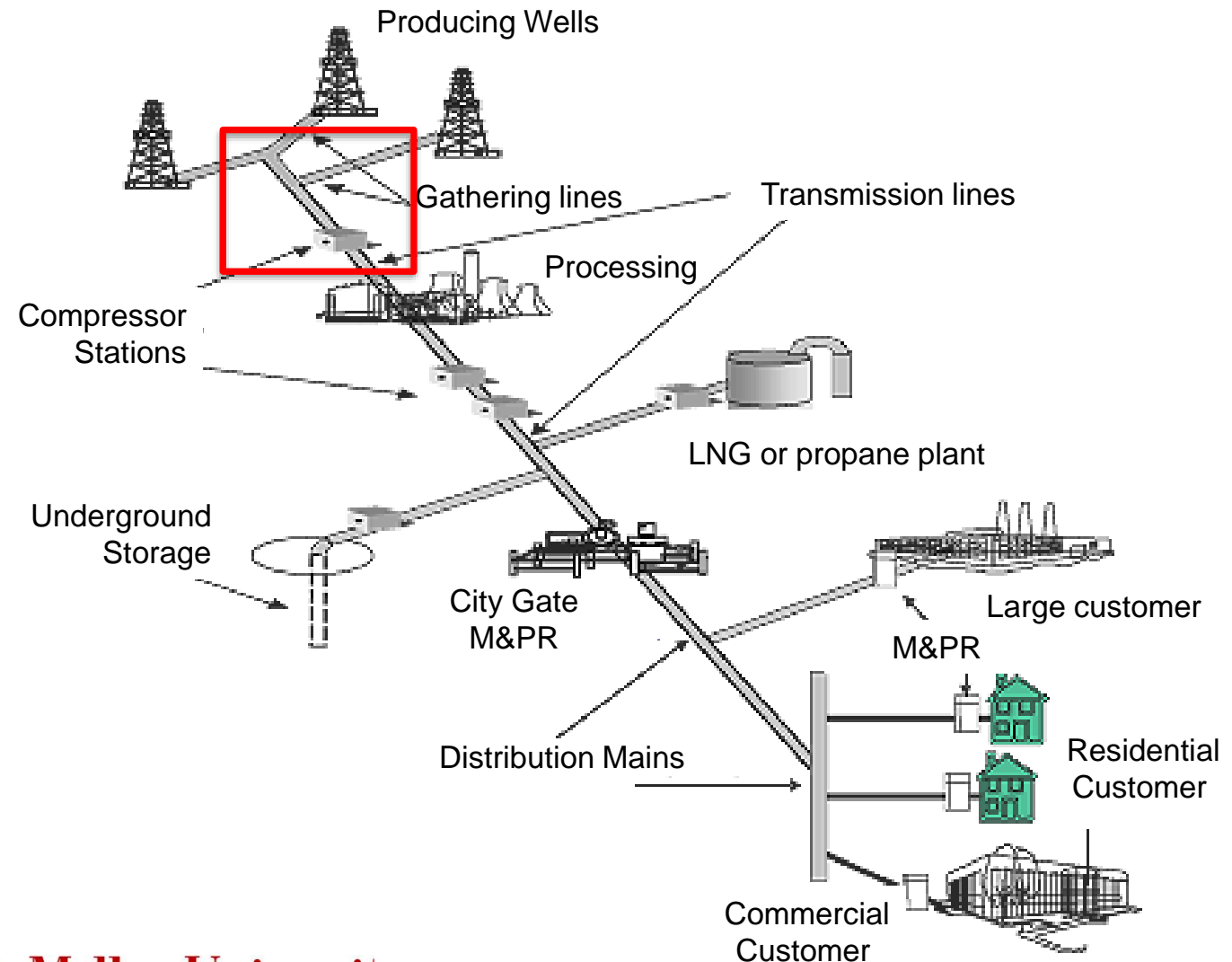
# Three main emissions sources for gathering system

- Pipeline leaks



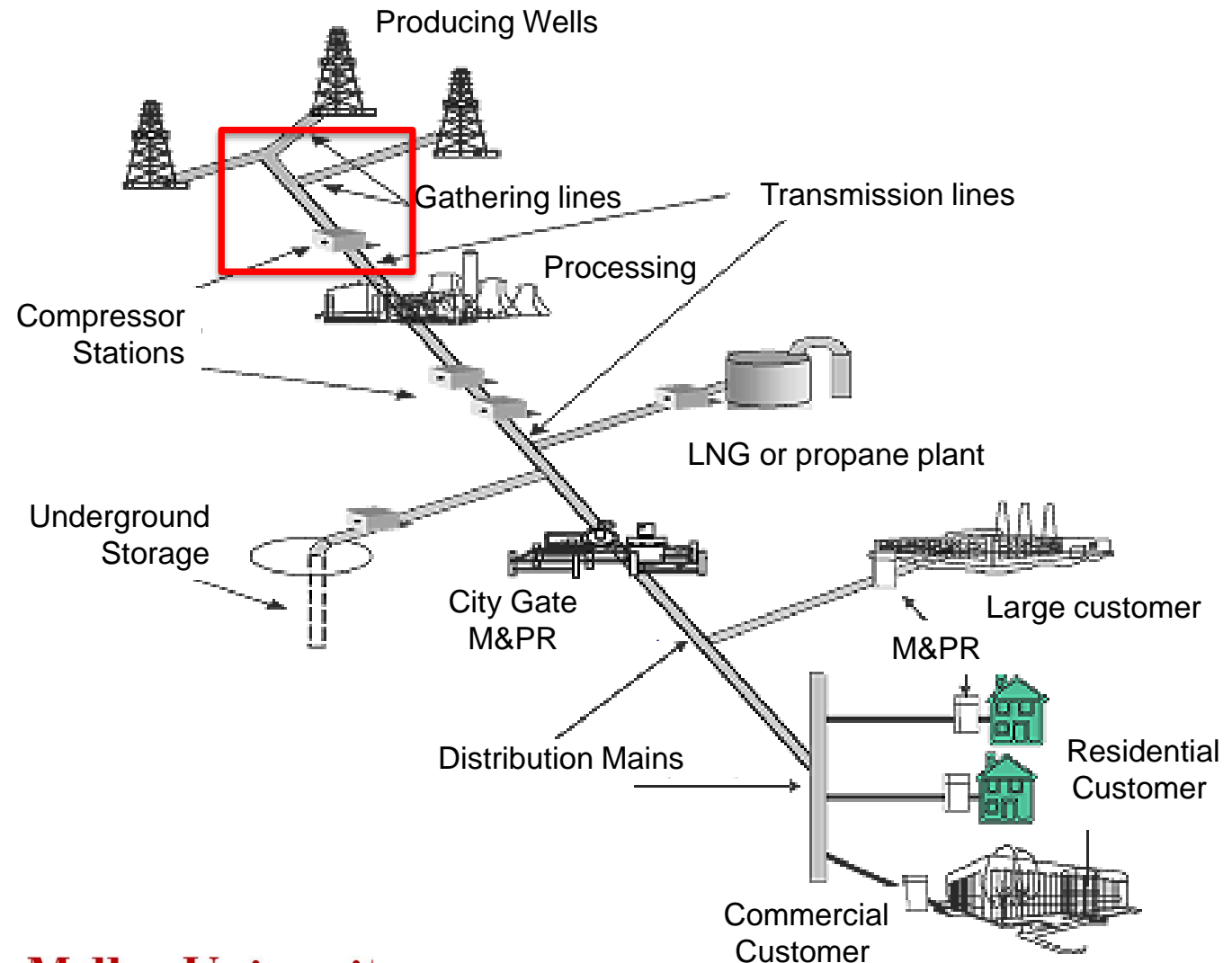
# Three main emissions sources for gathering system

- Pipeline leaks
- Emissions from process equipment



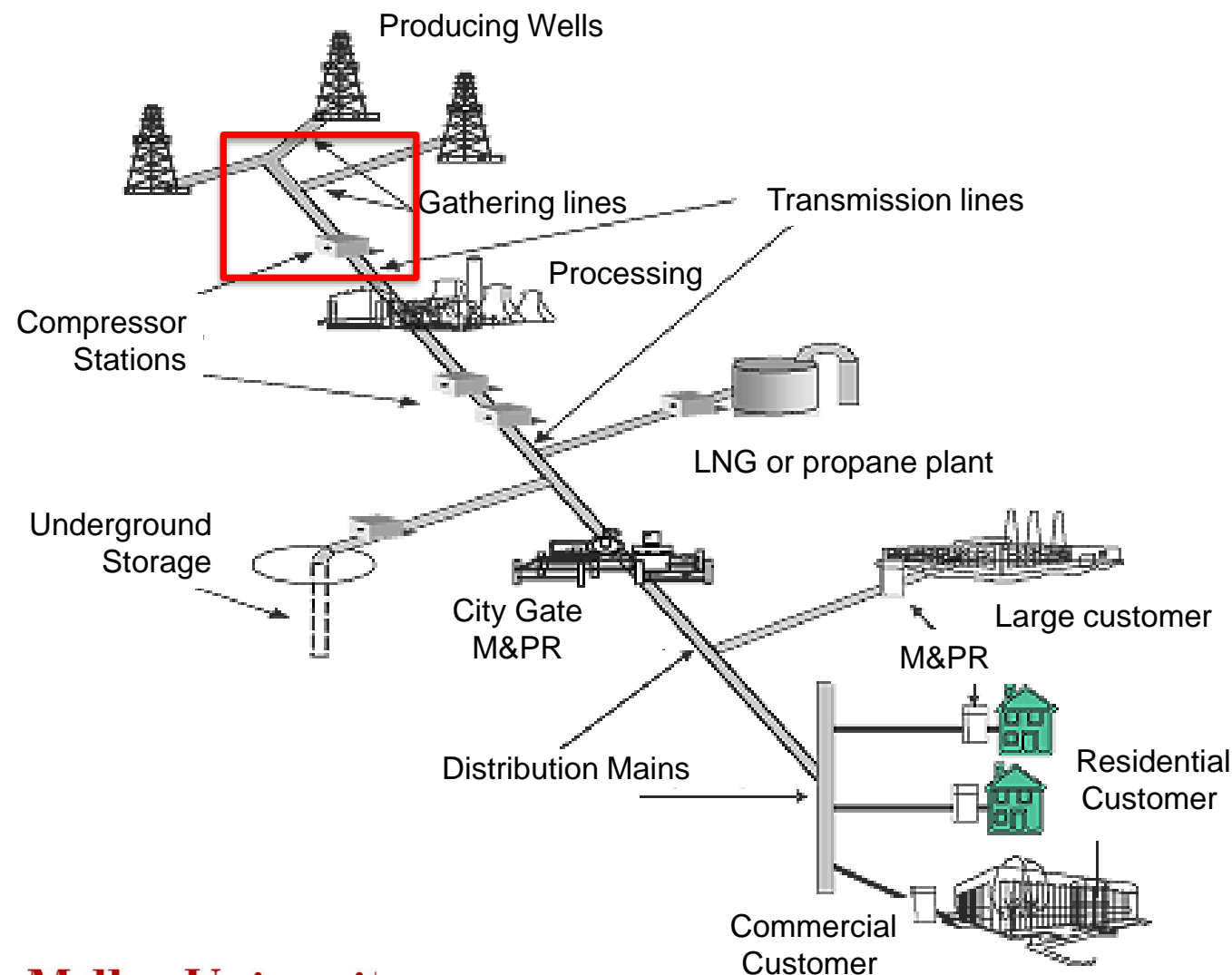
# Three main emissions sources for gathering system

- Pipeline leaks
- Emissions from process equipment
- Emissions from pipeline operation (e.g., blowdowns)



# Two major challenges in emissions quantification

- Accessibility – underground infrastructure
- Temporal variability



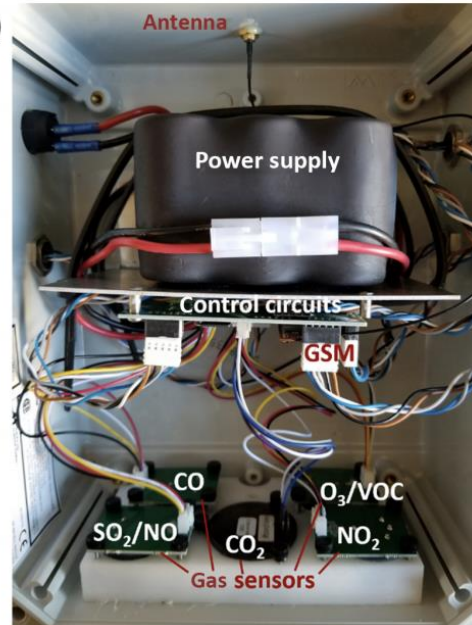
# Approach: Use distributed sensors to detect leaks

## “RAMP”

(a)

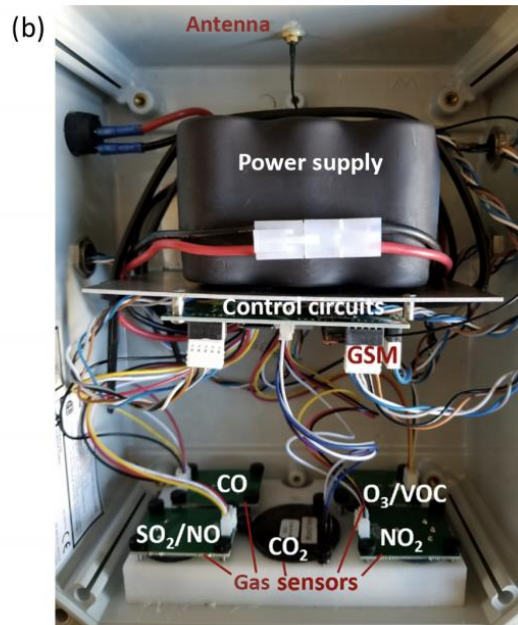
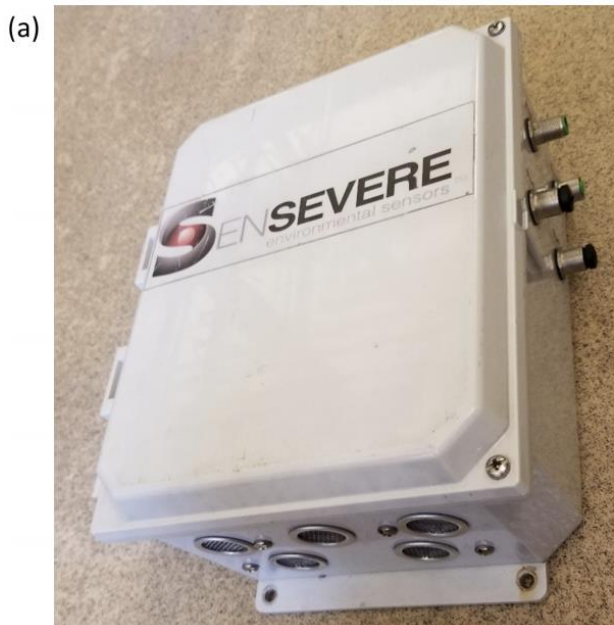


(b)

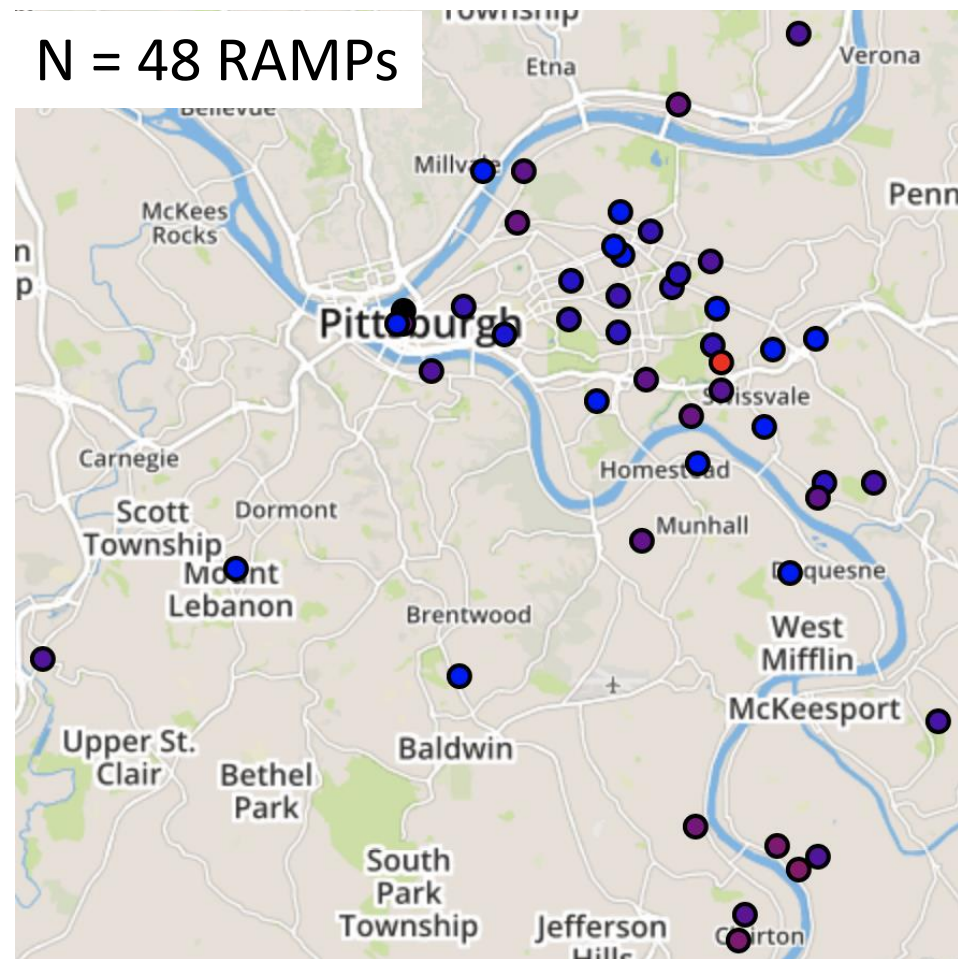


# We already run a large network of low-cost sensors

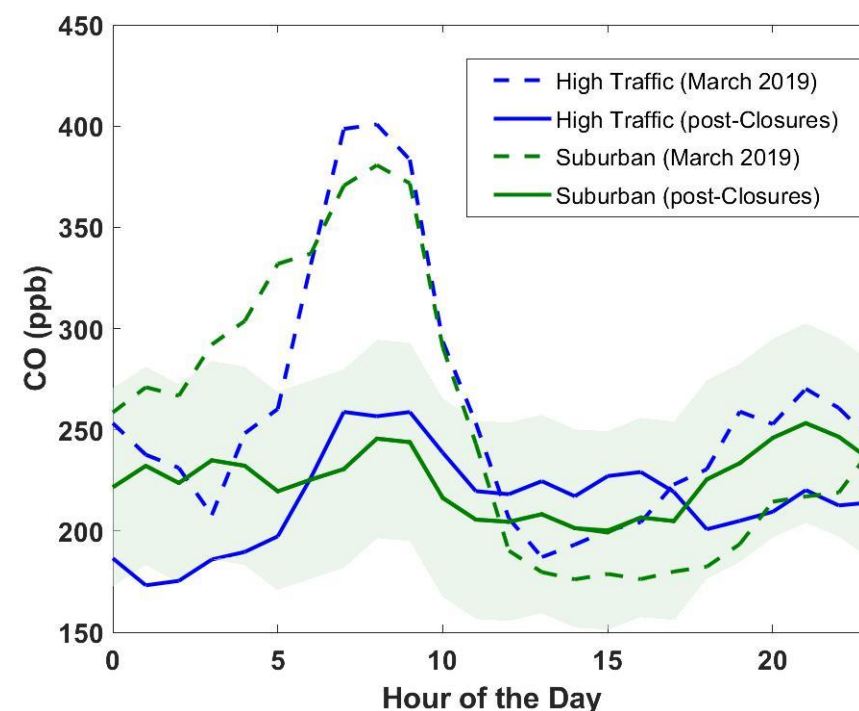
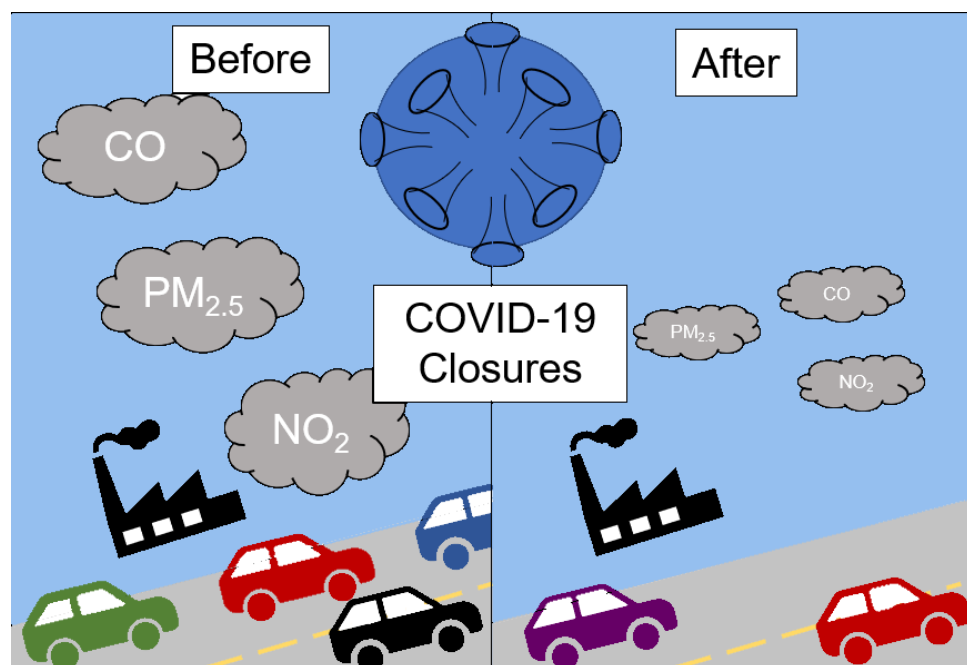
**“RAMP”**



N = 48 RAMPs

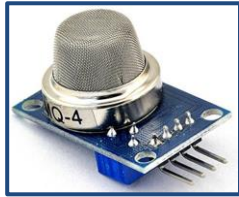


# Example outcome: Impact of COVID on air quality

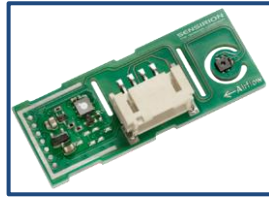


# We tested sensors using different operating principles

## Metal oxide semiconductor



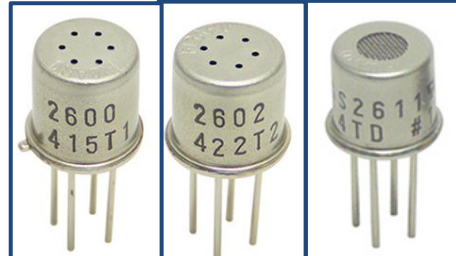
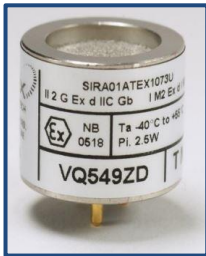
MQ-4



Sensirion  
SVM30



SGX IR12GJ, VQ549ZD



TGS 2600, 2602, 2611



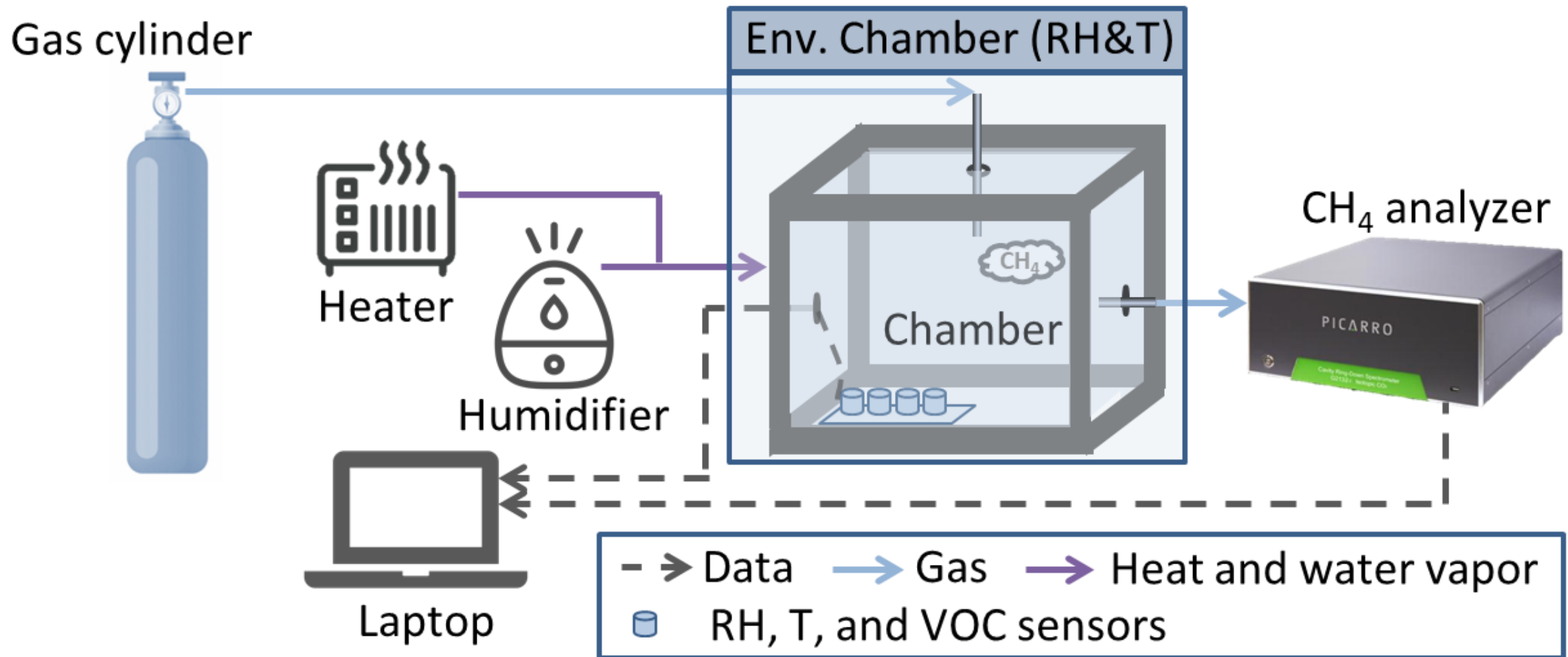
Alphasense MOX

## Photo ionization

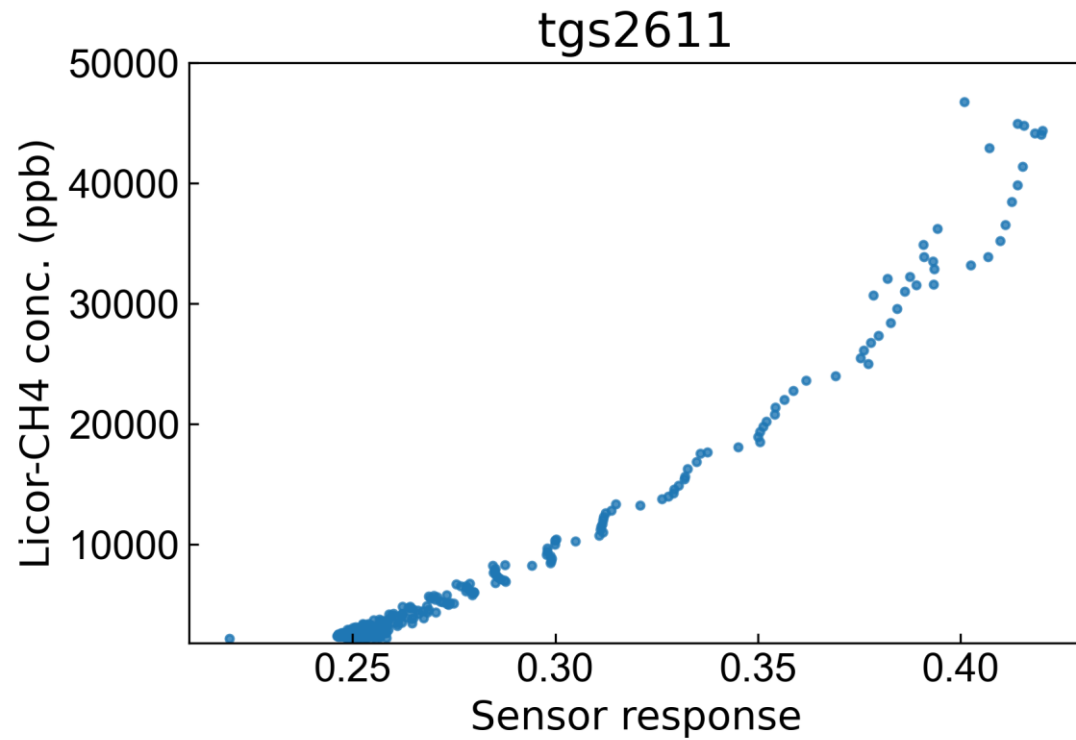


Alphasense PID (10.6 & 9.6eV)

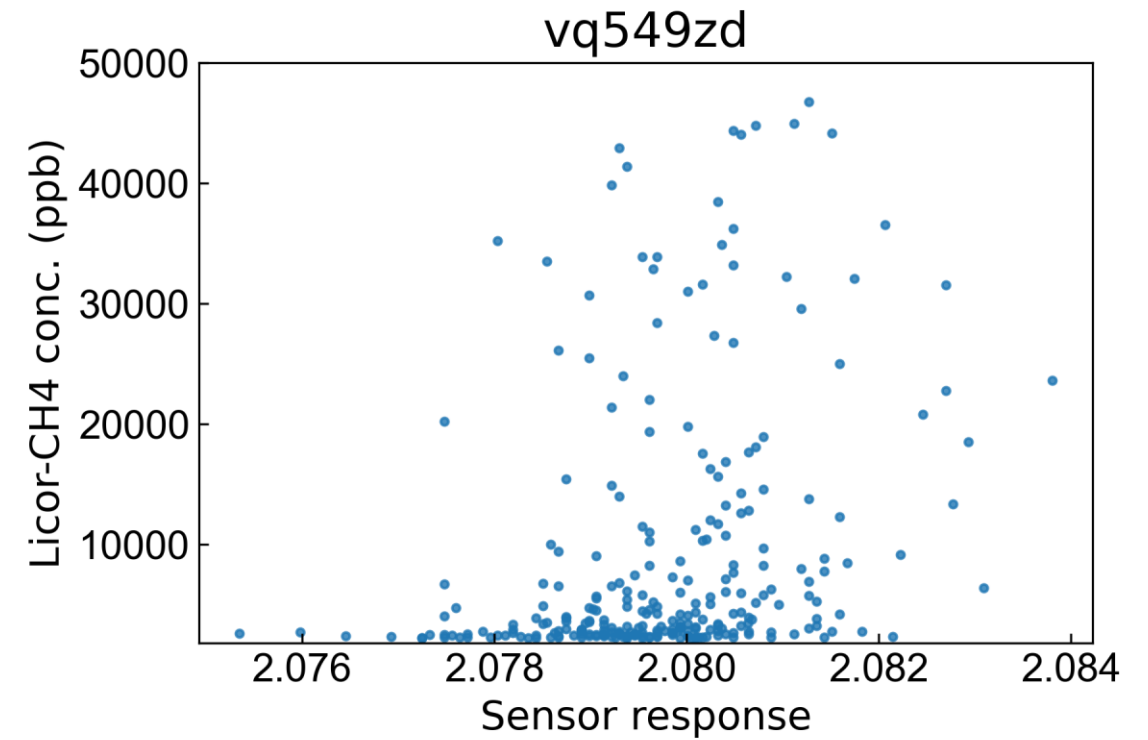
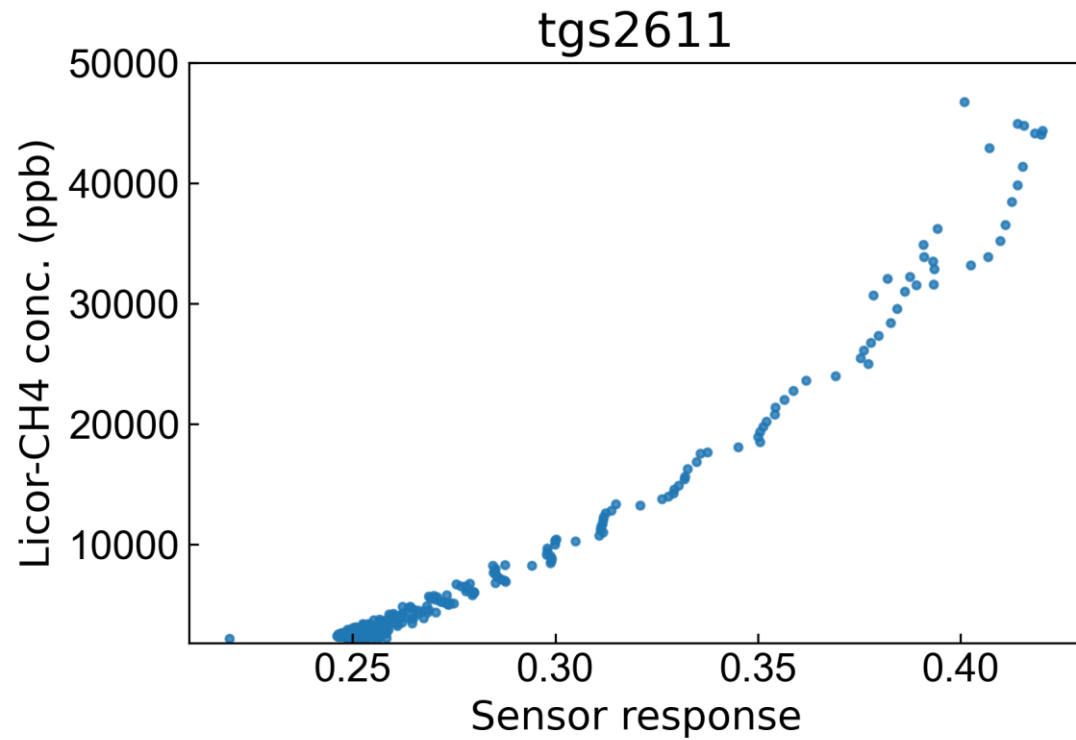
# We conducted laboratory tests to identify candidate sensors



# Some sensors performed well

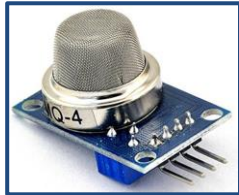


# Others did not

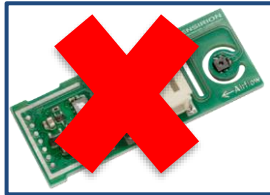


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## Metal oxide semiconductor



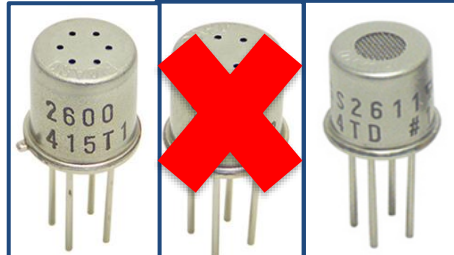
MQ-4



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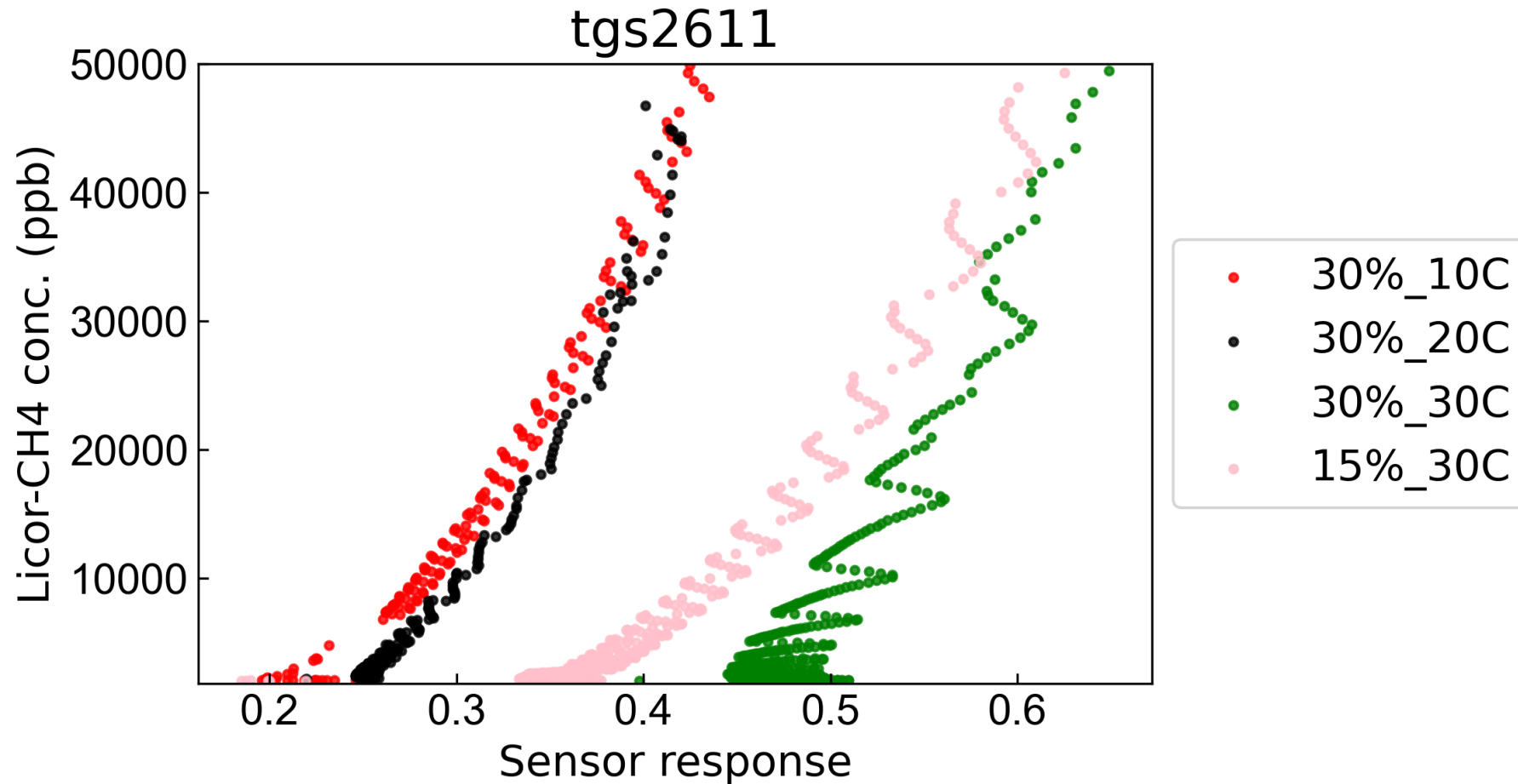
Alphasense MOX

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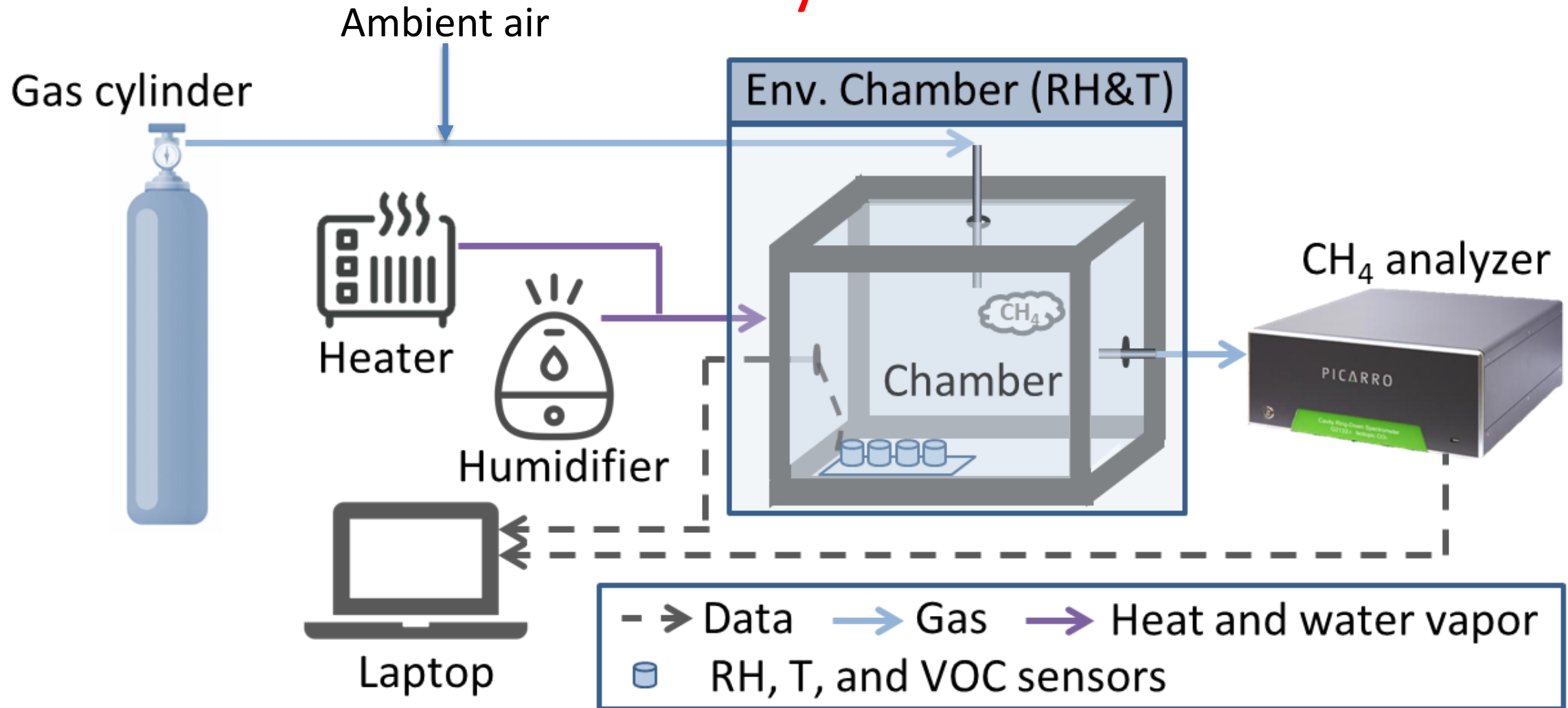


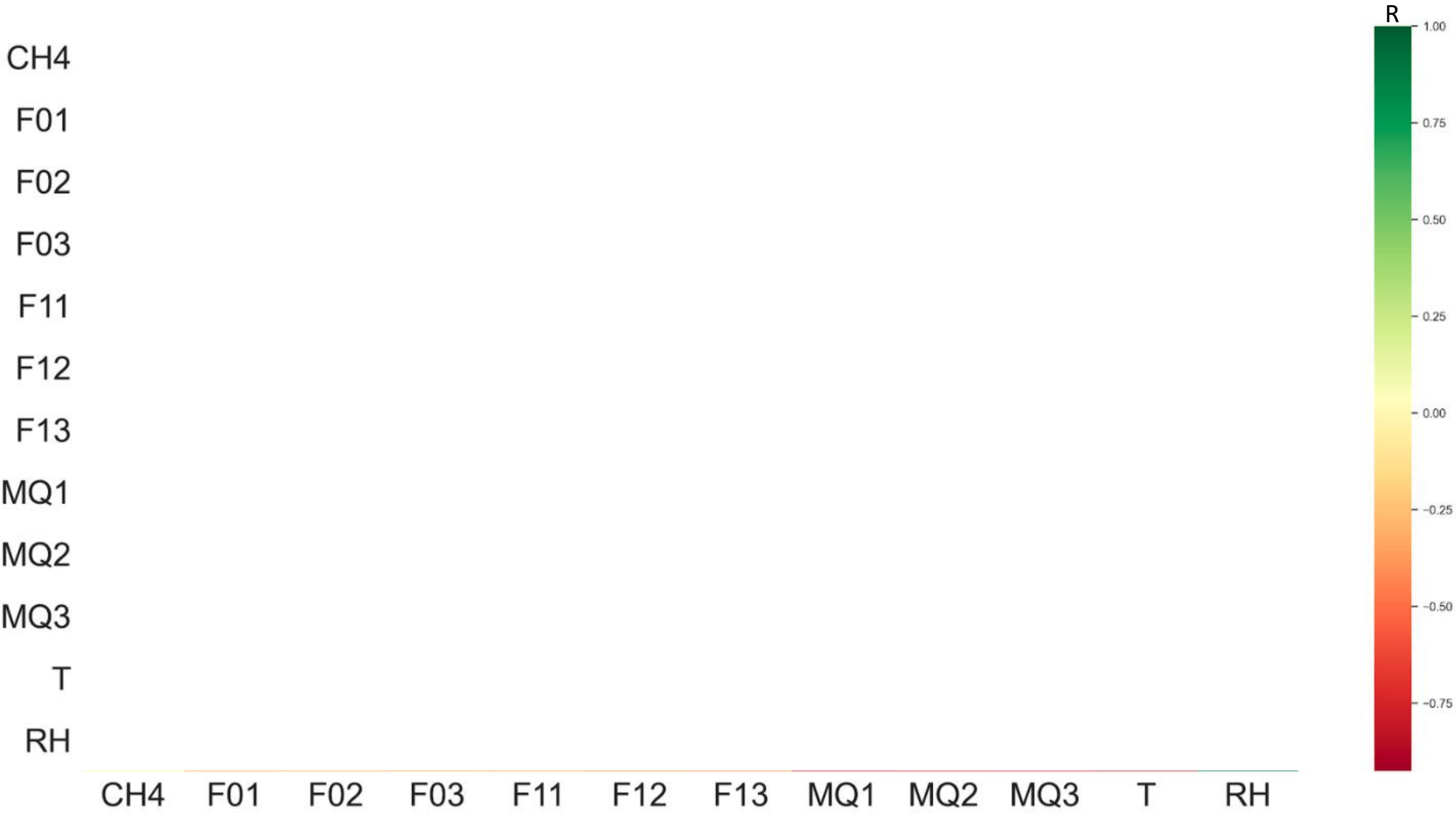
Alphasense PID (10.6 & 9.6eV)

# “Good” sensors showed humidity and T dependence

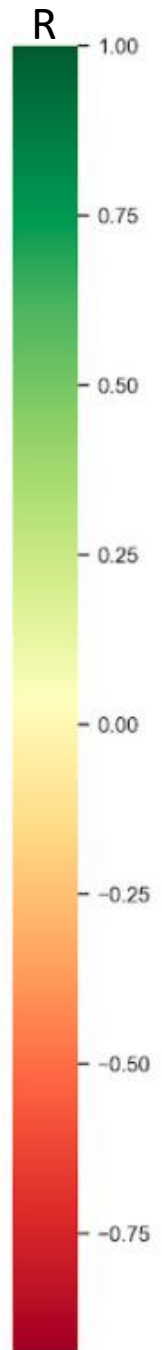


We doped ambient air with methane to explore a wider variety of conditions



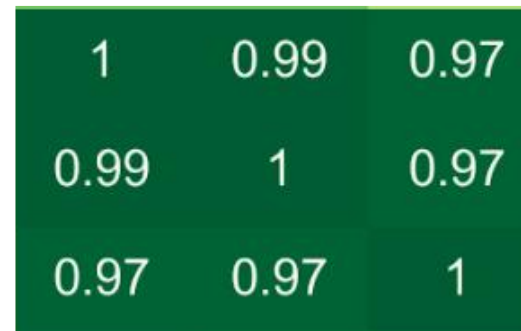
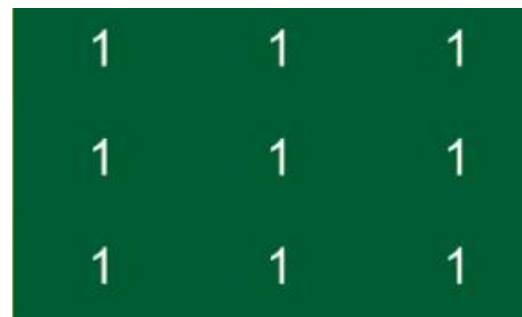
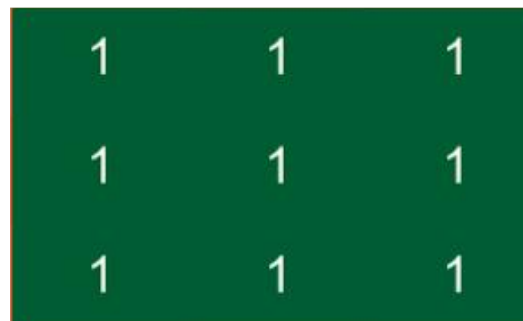


1	1	1
1	1	1
1	1	1

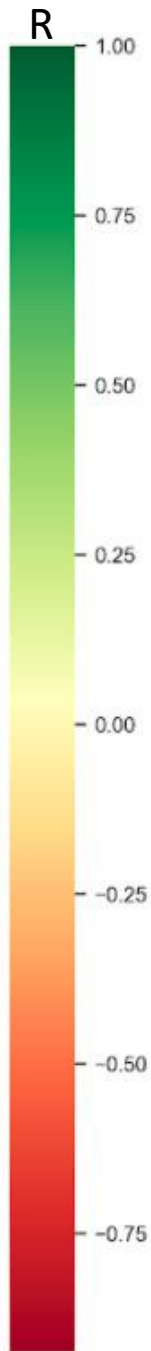


# Sensors showed inter-unit precision

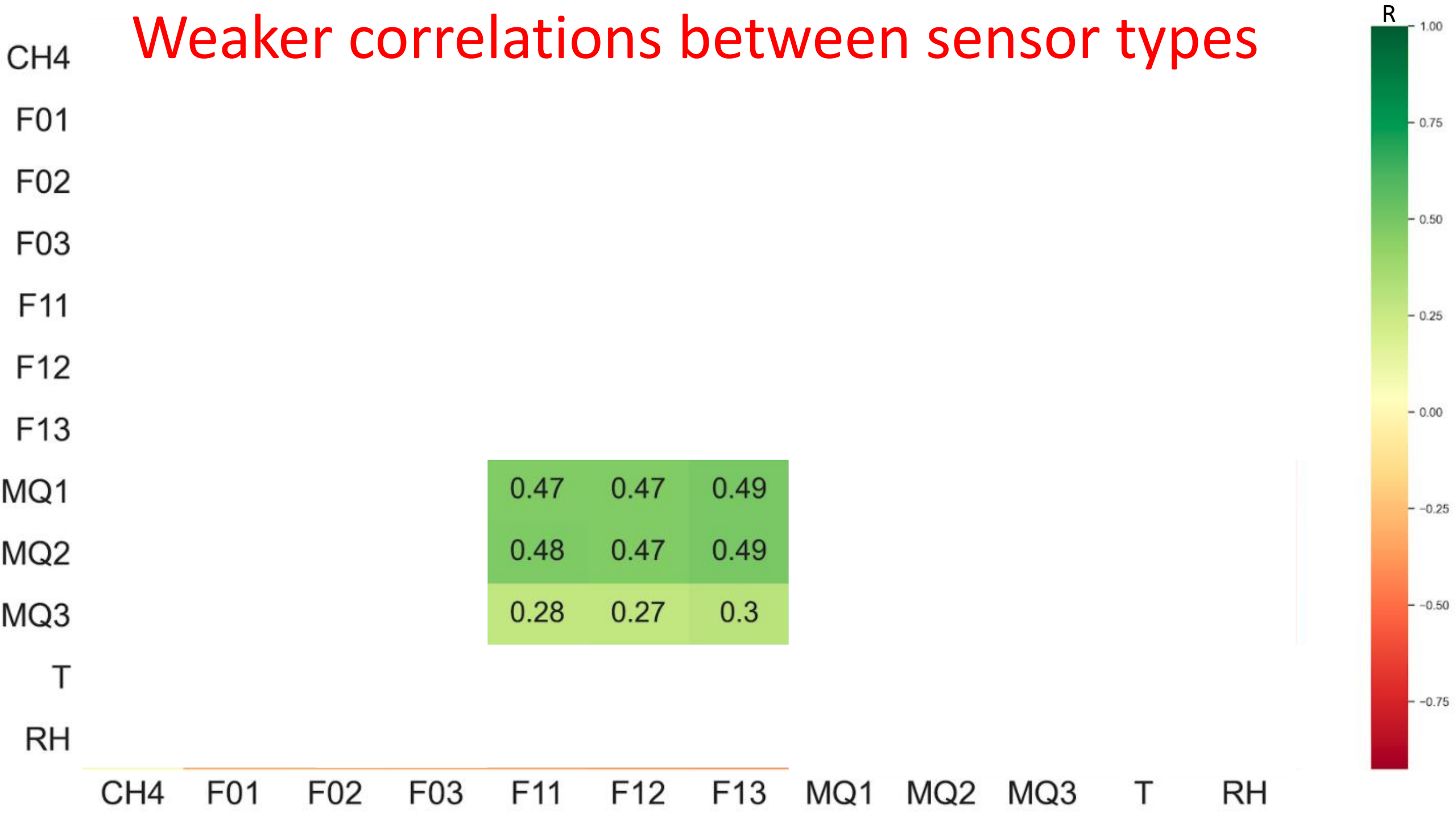
CH4  
F01  
F02  
F03  
F11  
F12  
F13  
MQ1  
MQ2  
MQ3  
T  
RH



CH4 F01 F02 F03 F11 F12 F13 MQ1 MQ2 MQ3 T RH

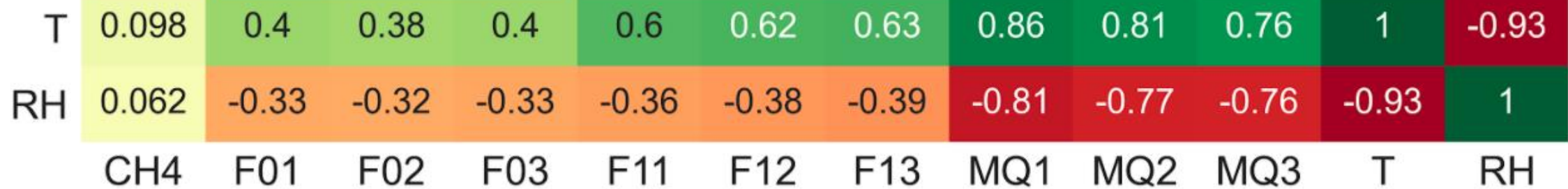


## Weaker correlations between sensor types

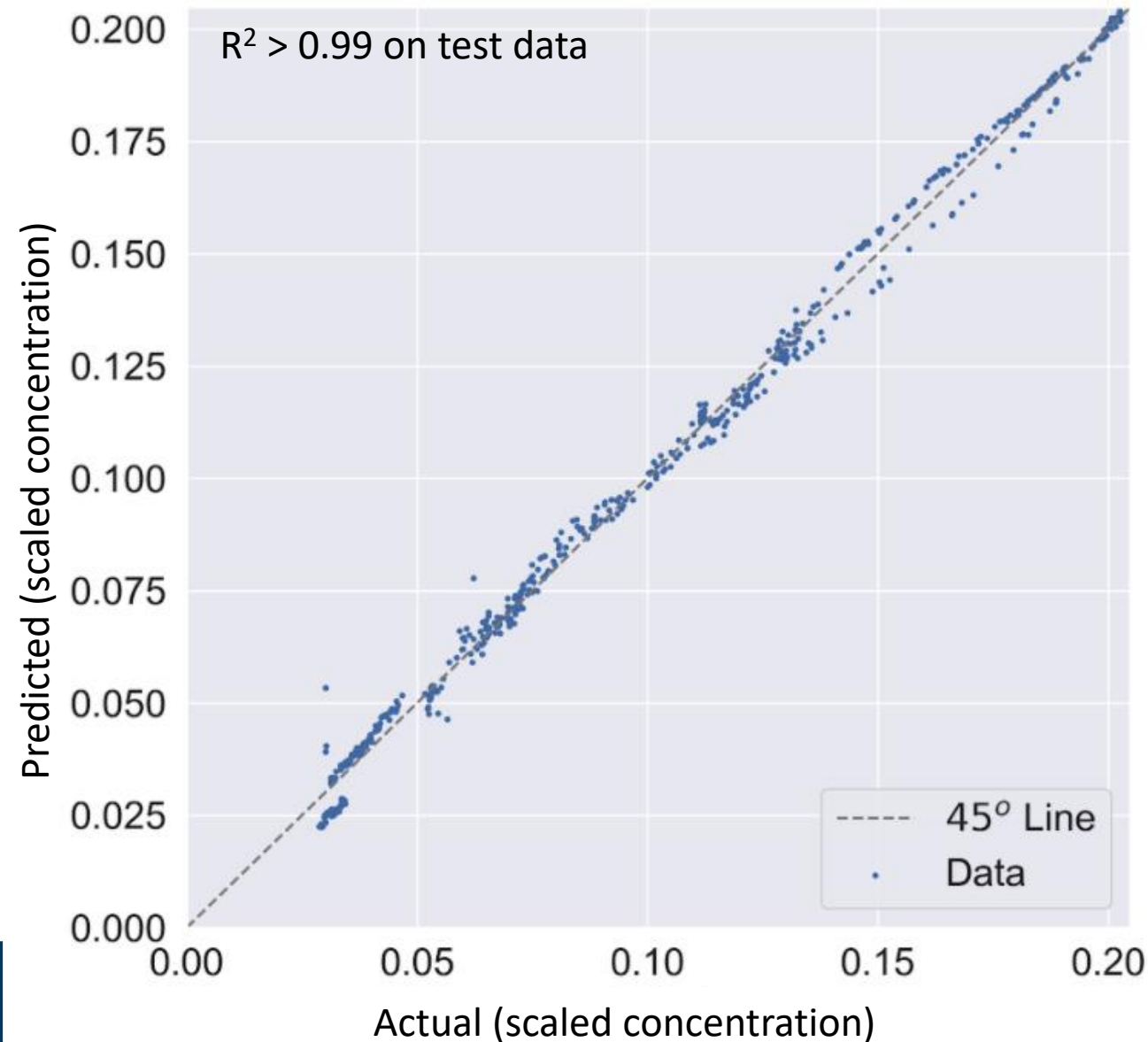


All sensors responded to RH and T

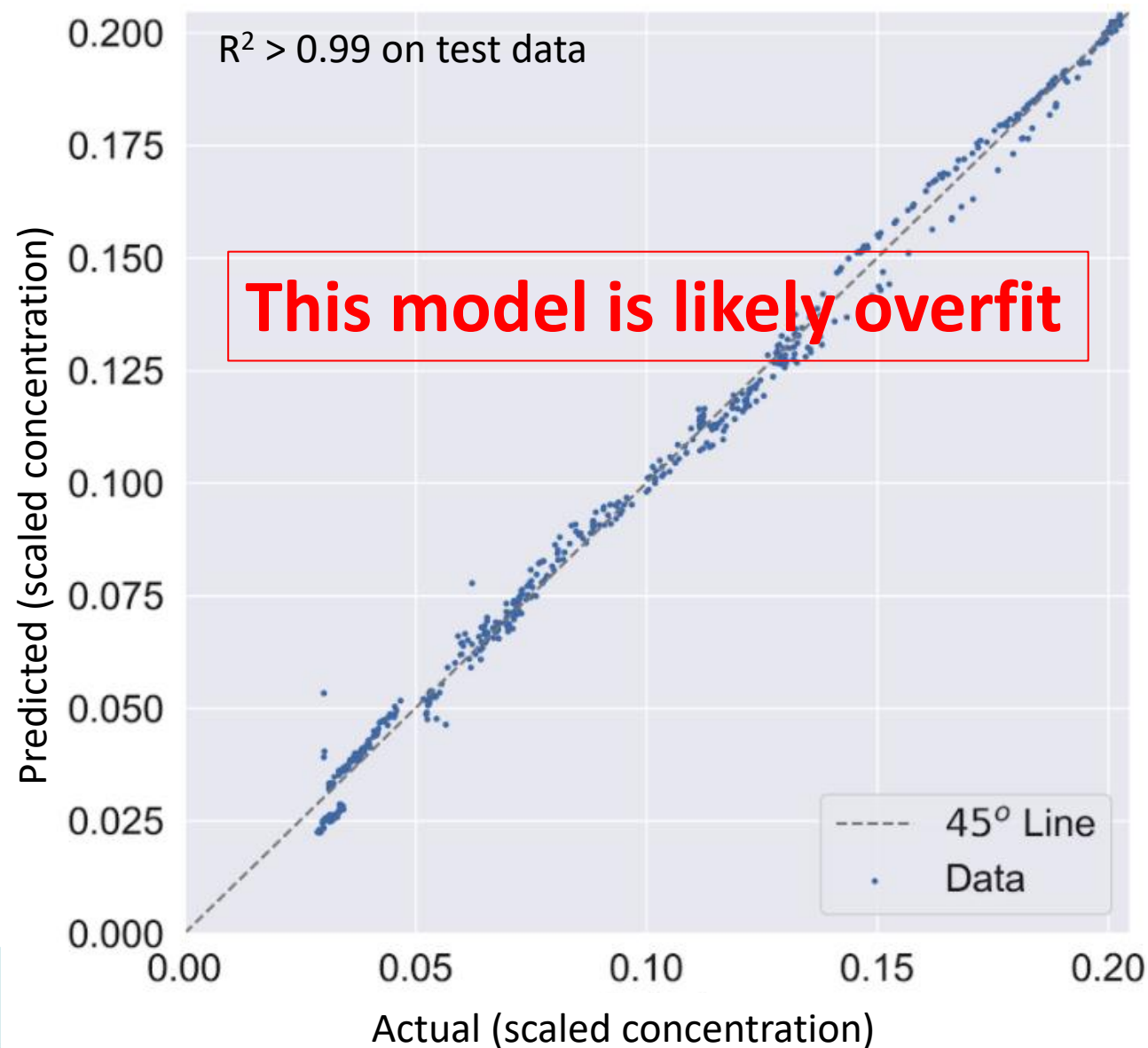
CH4  
F01  
F02  
F03  
F11  
F12  
F13  
MQ1  
MQ2  
MQ3



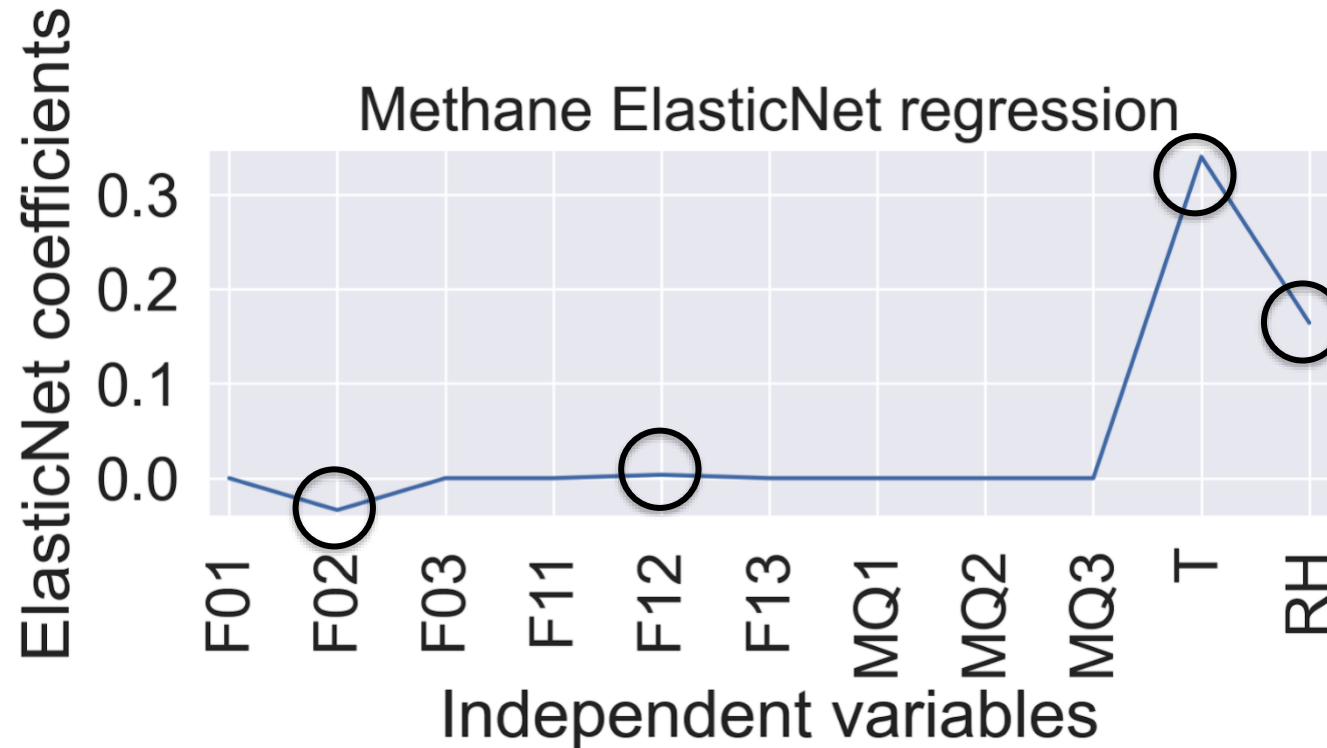
# We built calibration models with all available data



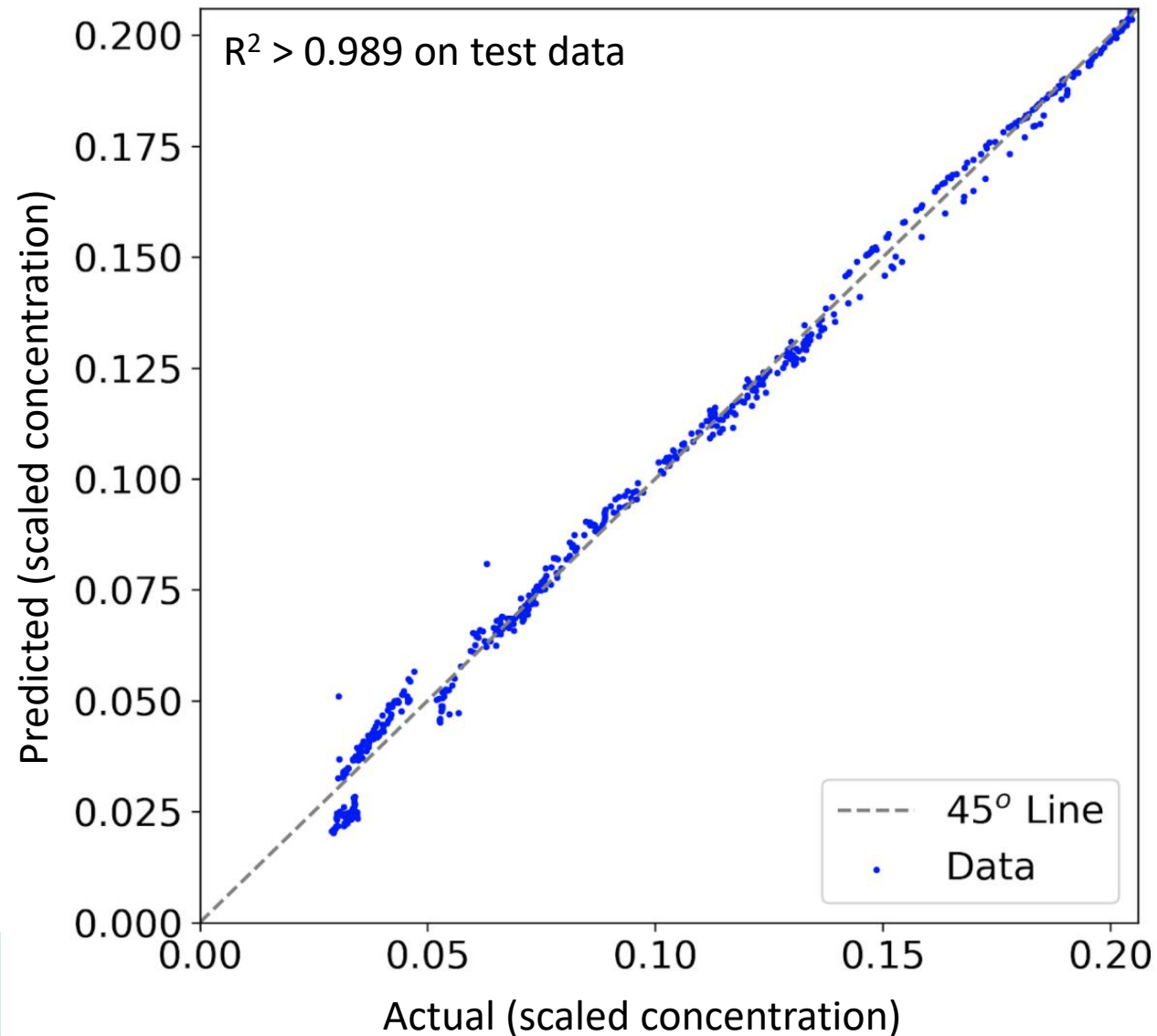
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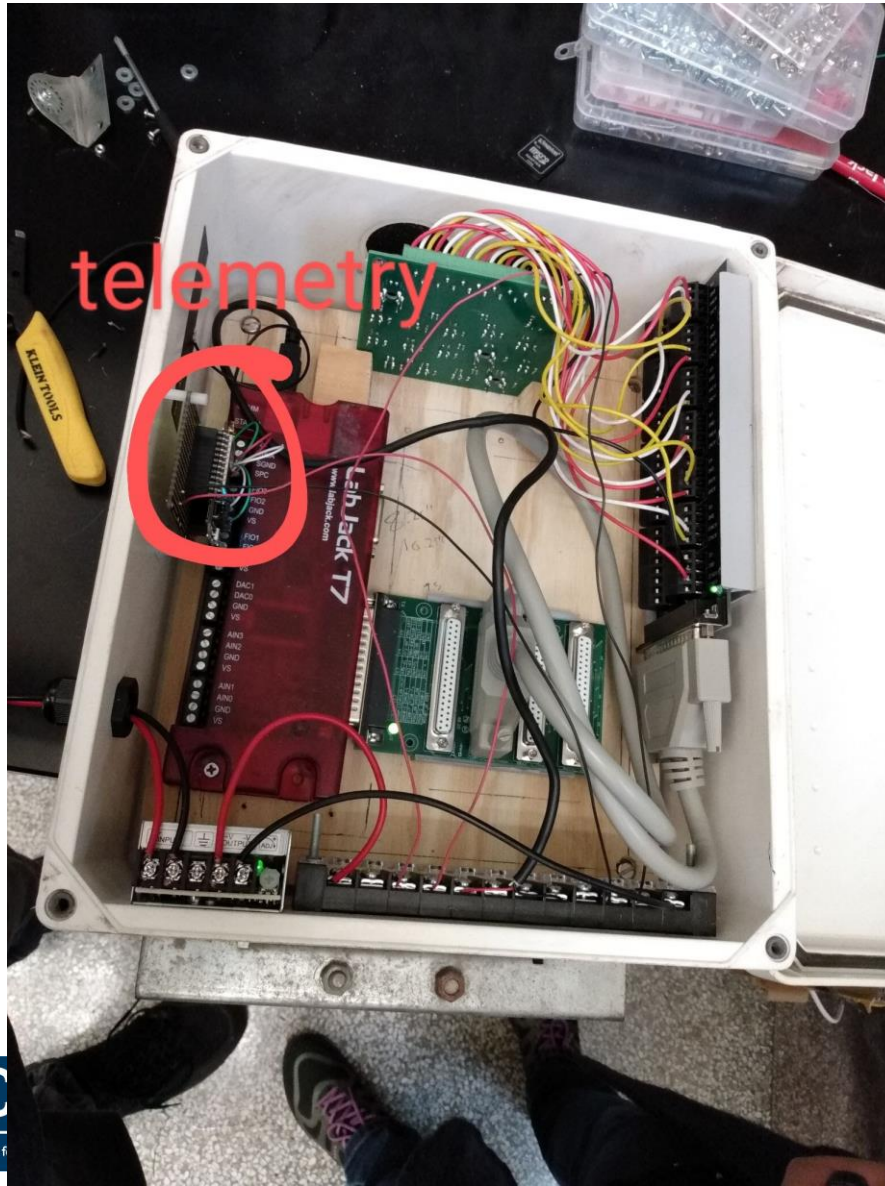
# We used Elastic Net regression to perform variable selection



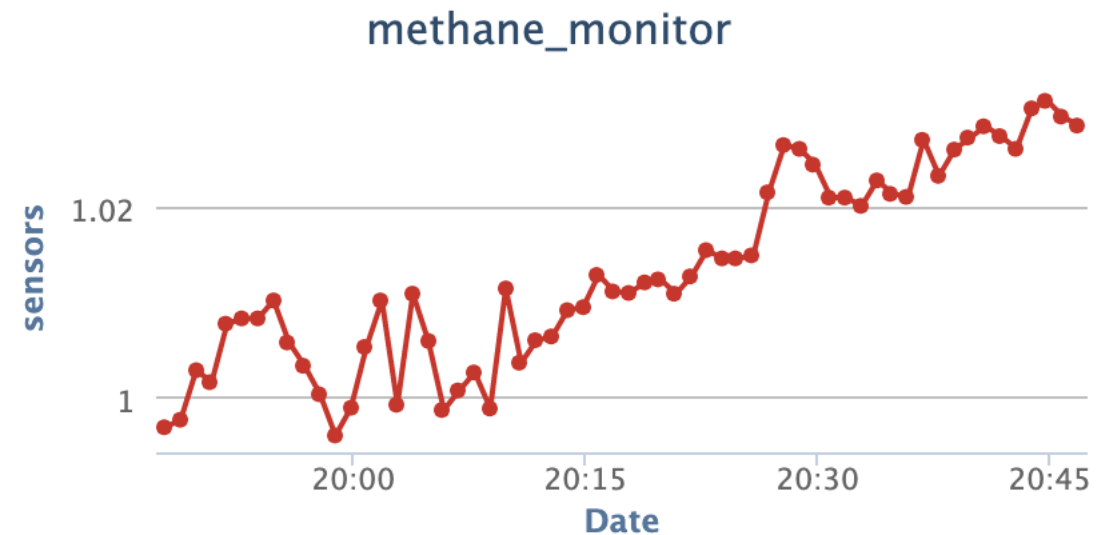
# The final model shows strong performance on holdout data



# Next step: Field deployments

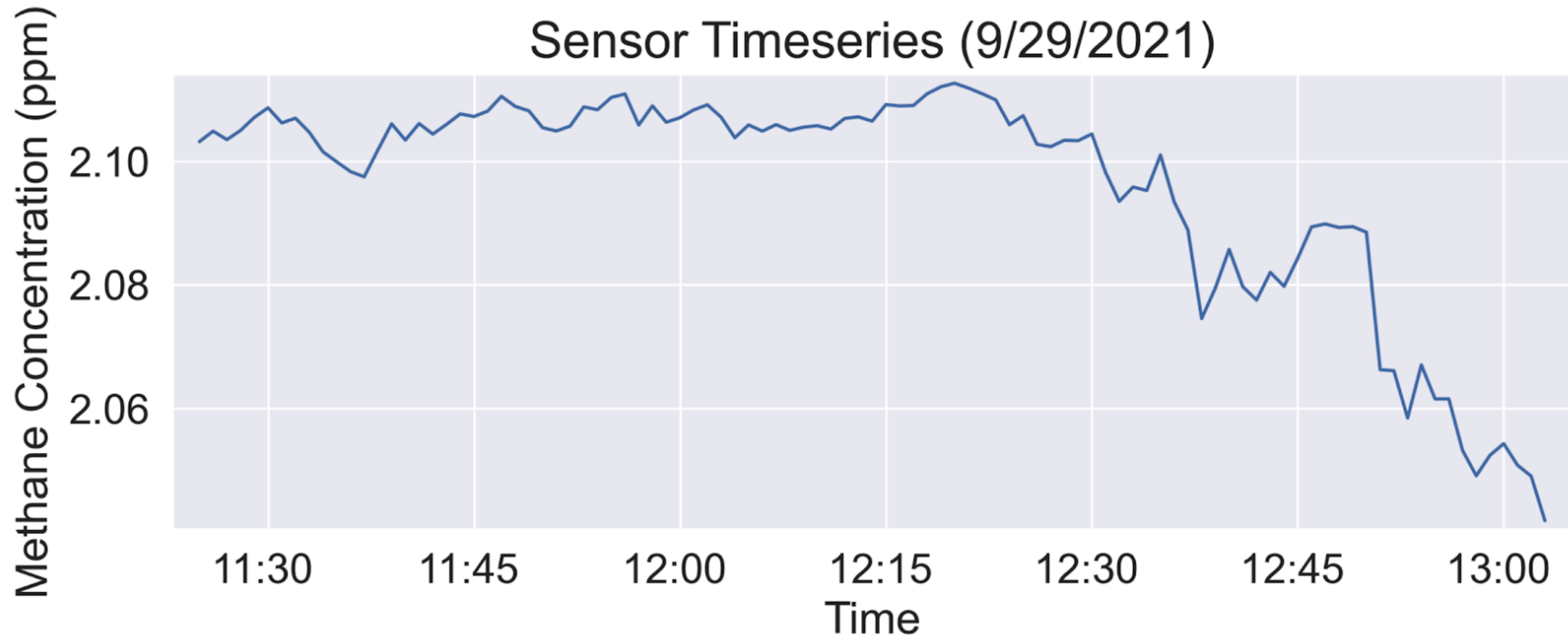


Field 1 Chart

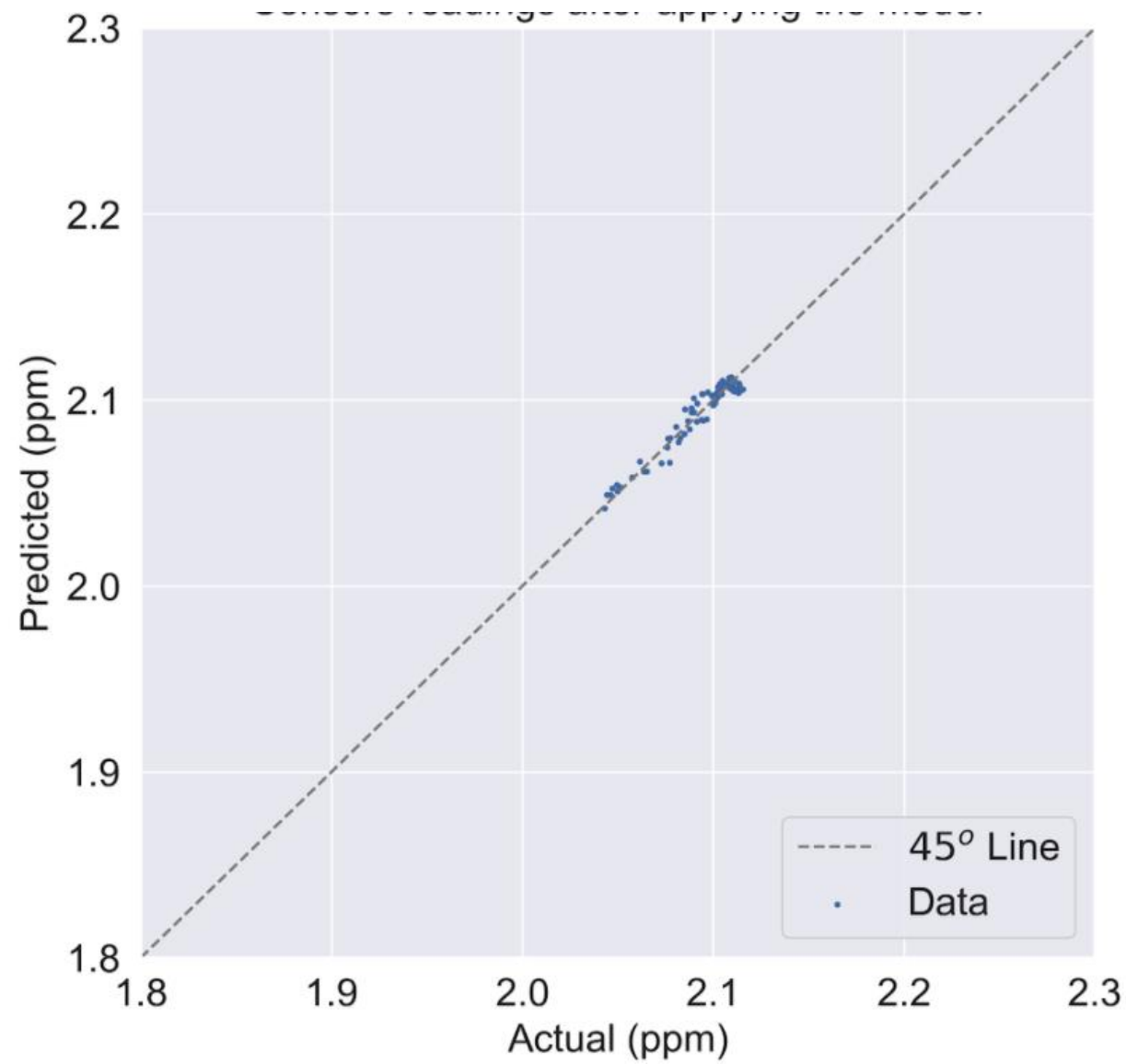


ThingSpeak.com

The sensor suite shows good performance under ambient conditions



# The sensor suite shows good performance under ambient conditions



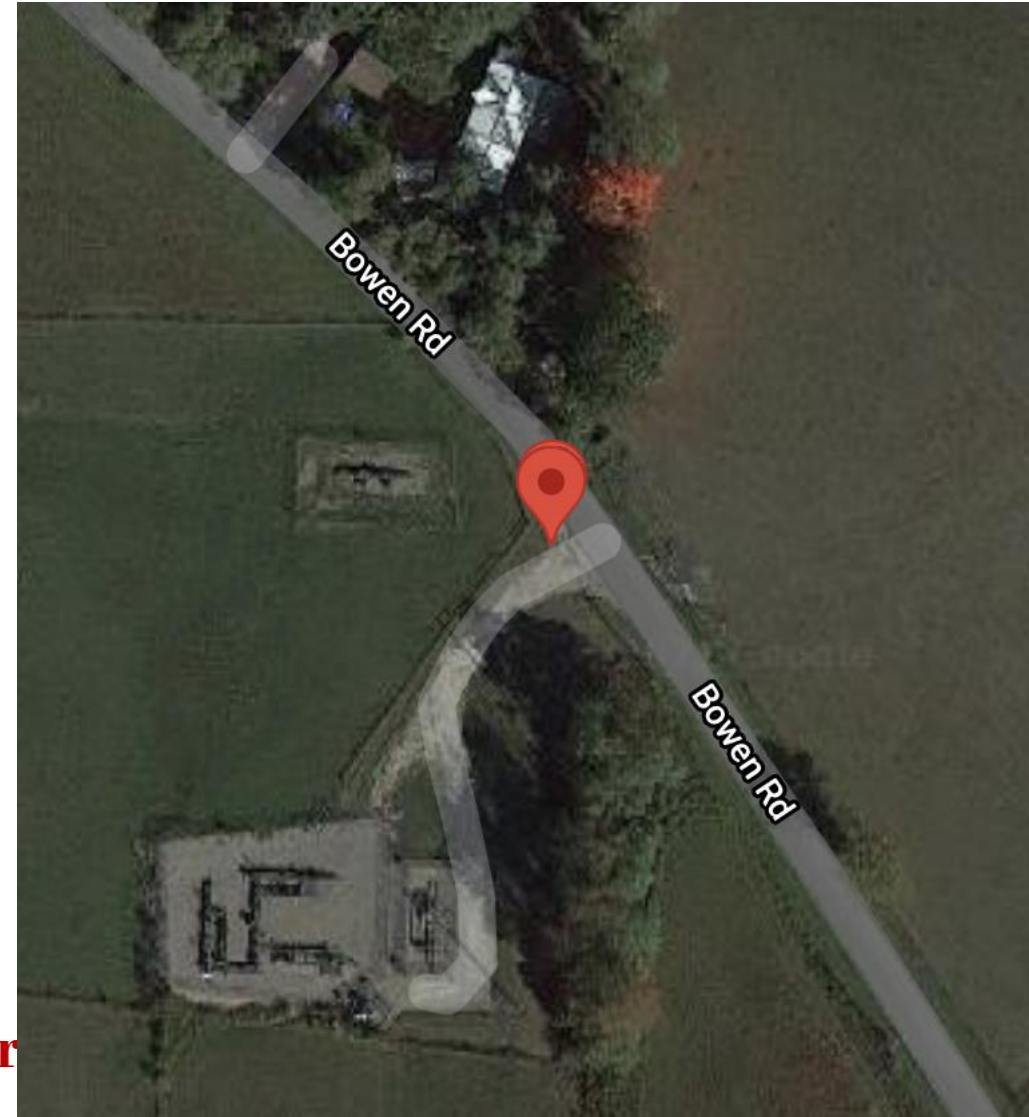
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- Our NETL partners (Dr. Natalie Pekney) have not found any significant leaks along gathering pipelines

# We proposed to measure emissions along pipelines and near pig launchers

- Our NETL partners (Dr. Natalie Pekney) have not found any significant leaks along gathering pipelines
- We are working to identify locations near pig launchers



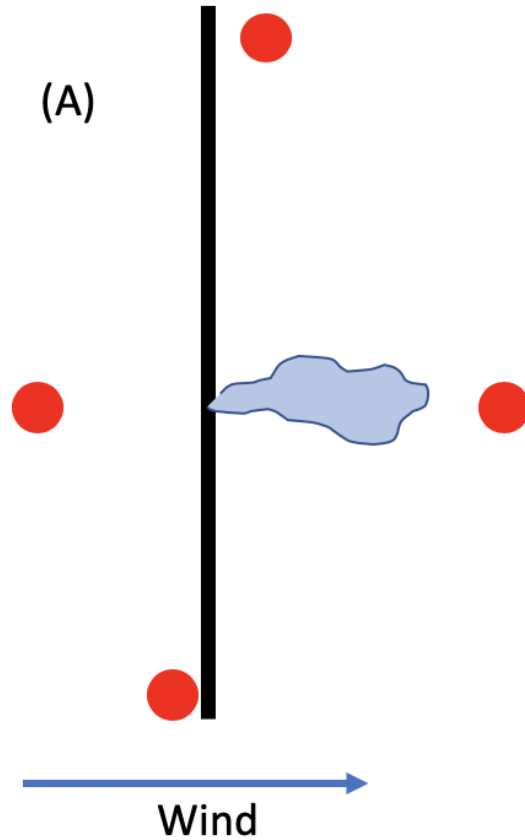
# Summary and Next Steps

- Identified a suite of sensors capable of measuring ambient methane concentrations
- Developed calibration models to invert raw signal to methane concentration
- We will soon deploy near pig launchers to quantify emissions

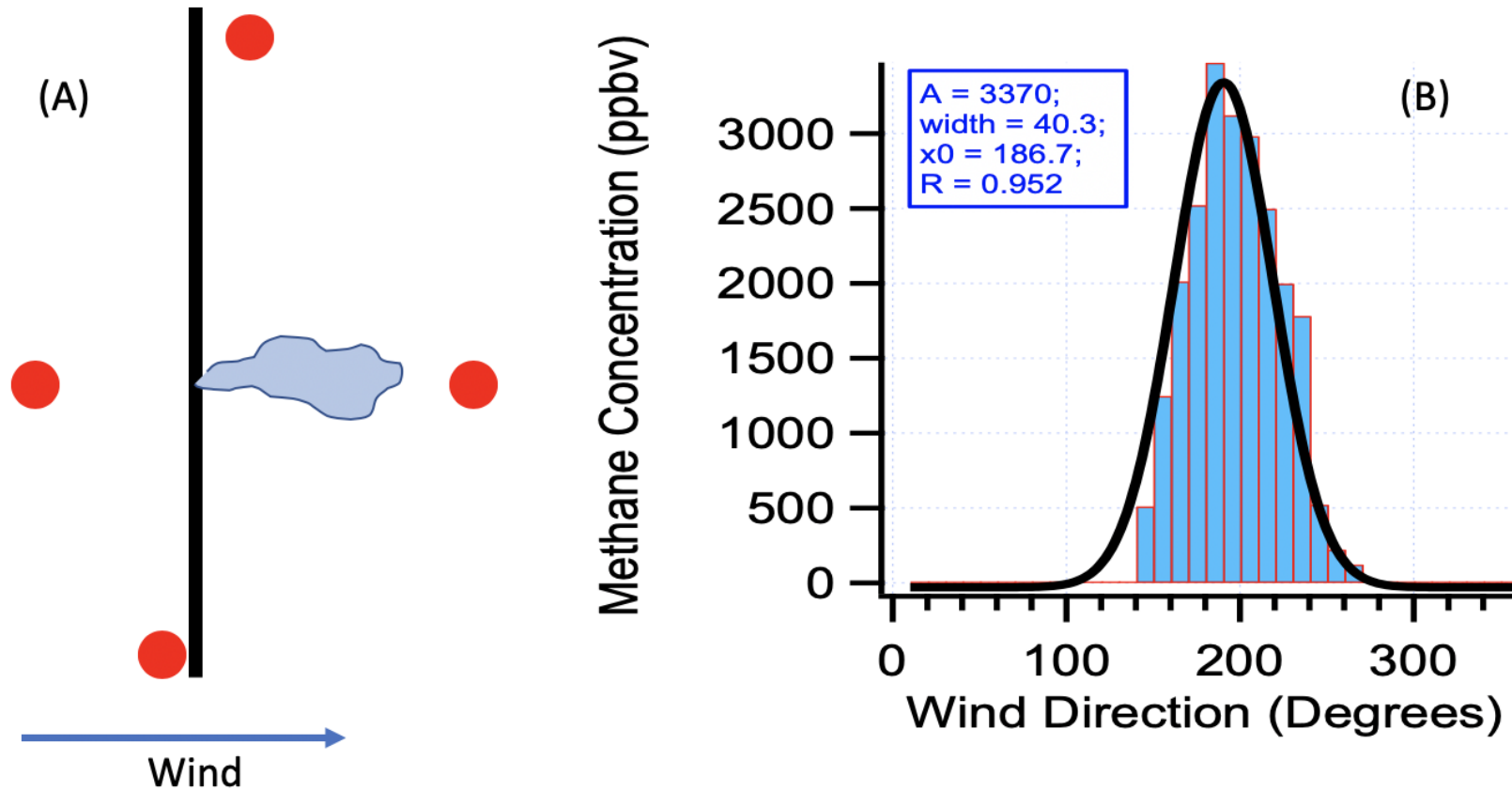


**Carnegie Mellon University**

# Tasks 3 and 5: Detect leaks along pipelines and from pig launchers

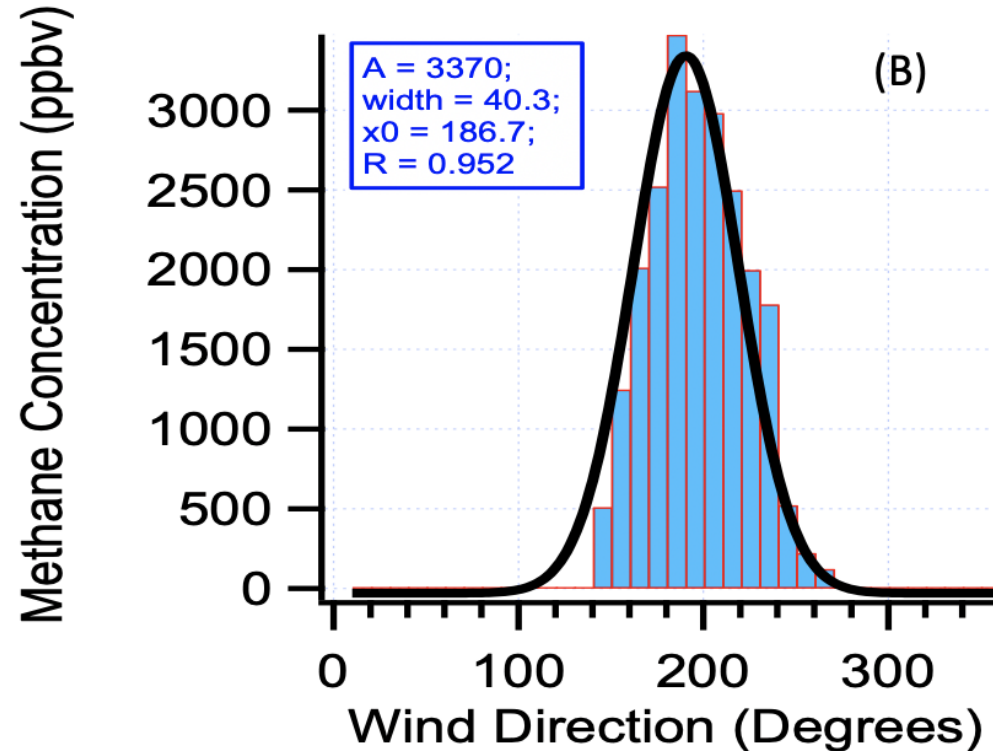


# Tasks 3 and 5: Detect leaks along pipelines and from pig launchers



# Task 4: Quantify emission rates based on Gaussian dispersion

$$Q = 2\pi \cdot C \cdot u \cdot \sigma_z \cdot \sigma_y$$



# Anticipated results and significance

- **Method Demonstration:** We will show that the RAMP+CH<sub>4</sub>, as well as similar sensor networks, can be used for robust long-term monitoring and quantification of methane leaks. Developing robust leak detection systems that are capable of unattended operation is critical for monitoring NG emissions, especially for infrastructure that is difficult to access (e.g., underground pipelines far from roadways).
- **Leak quantification – gathering system:** This project will quantify emissions from the natural gas gathering system, which has been understudied relative to other portions of the NG infrastructure.
- **Leak quantification – temporal variations:** RAMP+CH<sub>4</sub> sensors will operate continuously. This will enable us to quantify temporal variations in emissions over several months.
- **Improved methane mass closure:** This project will provide emissions data for the NG gathering system, which has been previously understudied relative to other parts of the NG infrastructure. The new data provided by this project will be available for incorporation into inventories (e.g., Greenhouse Gas Inventory) and to improve methane mass closure estimates.