

12 September 2018 • Indoor Air Quality • Air Sensors Int'l Conference

# USING LOWER COST SENSORS TO UNDERSTAND HOUSEHOLD ENERGY USE AND ITS IMPLICATIONS ON POLLUTION EXPOSURE AND HEALTH

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*on behalf of*

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and Berkeley Air Monitoring Group, Kirk R. Smith, and the Household Energy, Health,  
and Climate Research Group*



**HOUSEHOLD ENERGY, HEALTH, & CLIMATE RESEARCH GROUP**  
UNIVERSITY OF CALIFORNIA, BERKELEY

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By the numbers

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# ~3 billion people use solid fuels for cooking

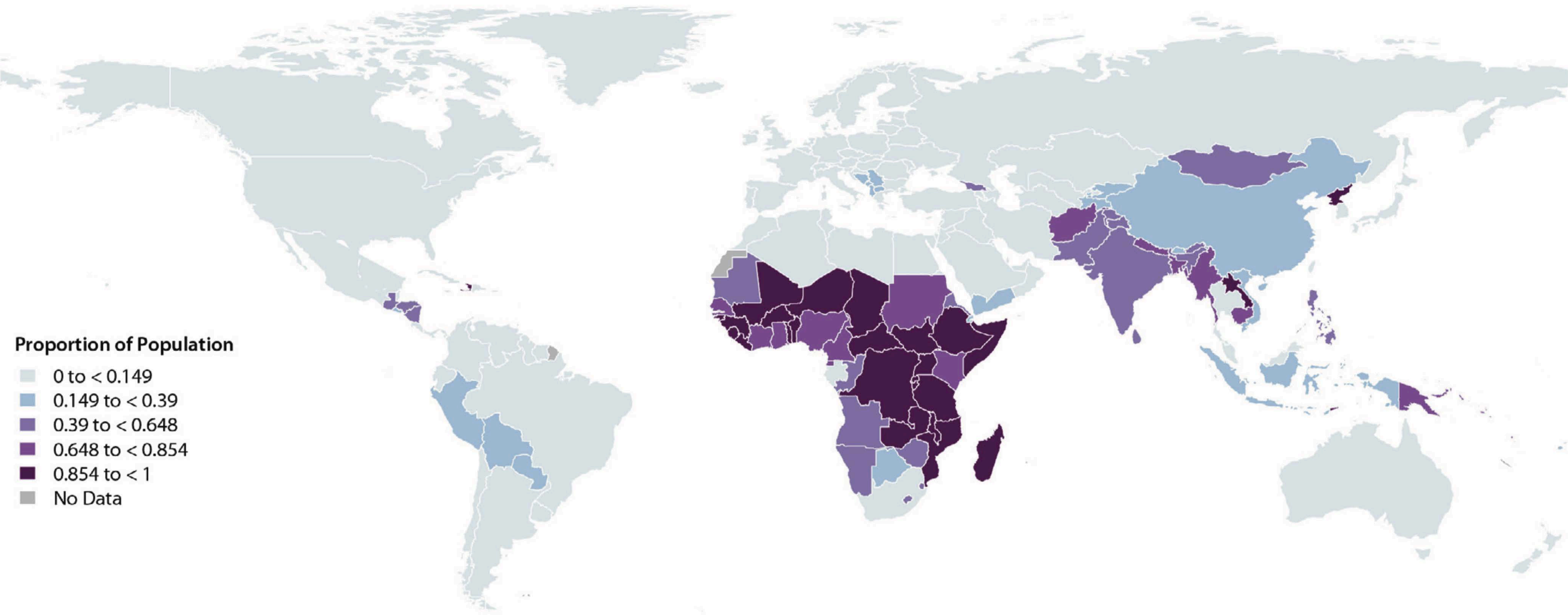


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While the proportion of the population using these fuels is decreasing, the absolute number has remained relatively constant over the past 30 years



# Global distribution of solid fuel use





**PALWAL**  
Haryana, India













**KHARELTHOK**

Nepal





**ADDIS ABABA**

Ethiopia





# KHARGIAKH

Ladakh, India





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By the numbers

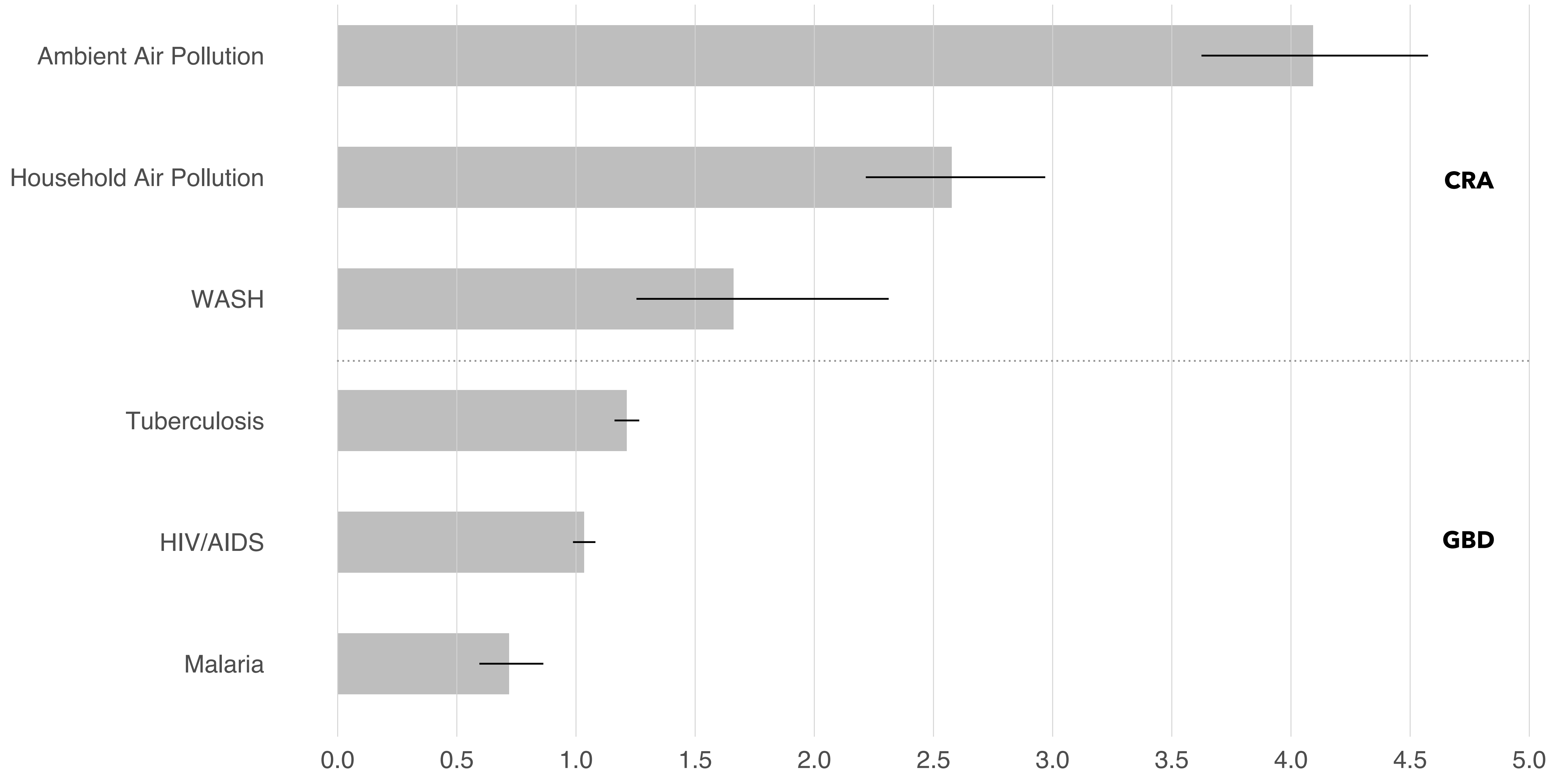
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3-4 million deaths yearly from exposure  
to PM<sub>2.5</sub> arising from the combustion of solid fuels

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# IHME Global Burden of Disease 2016

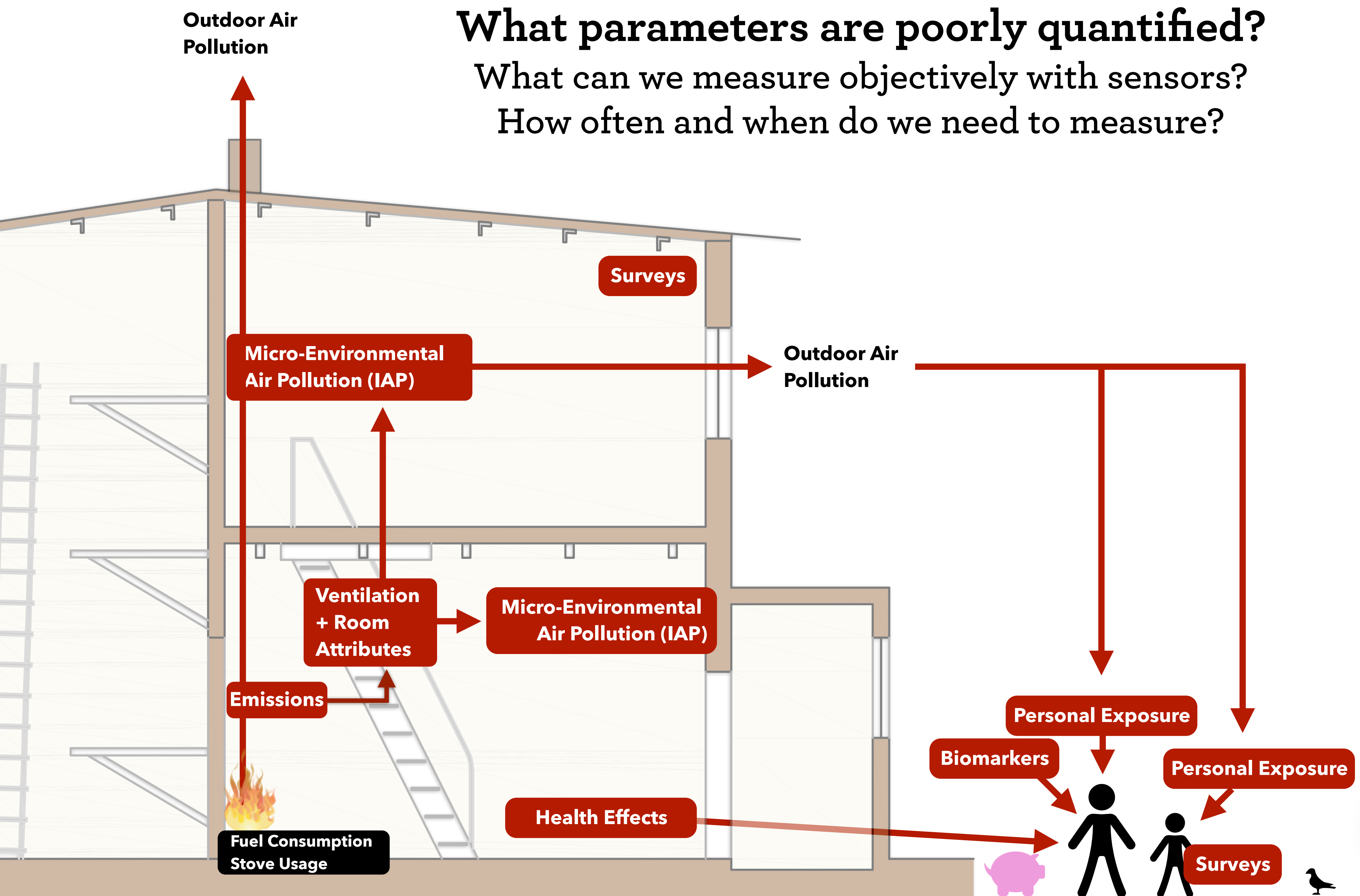




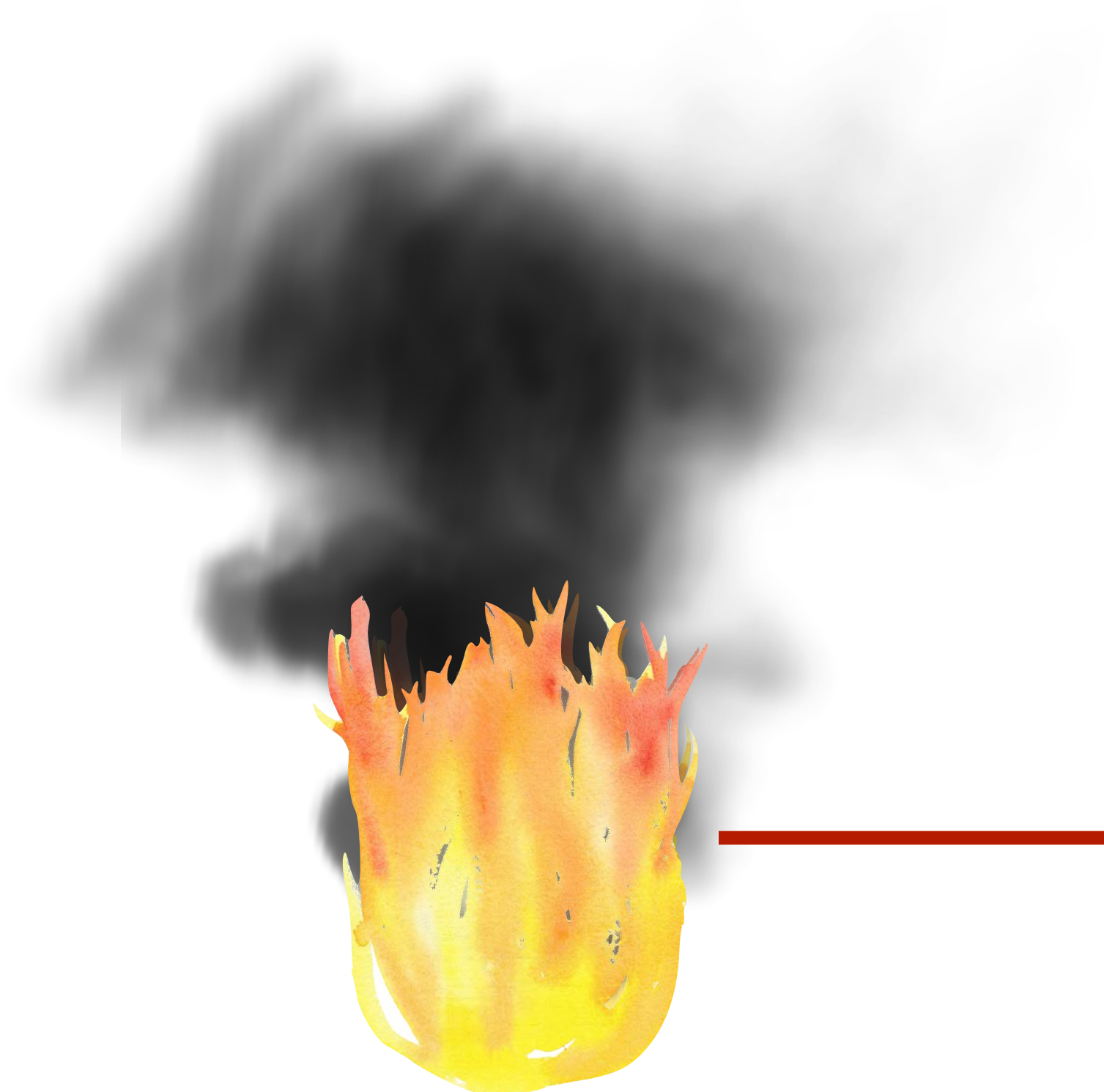
# What parameters are poorly quantified?

What can we measure objectively with sensors?

How often and when do we need to measure?







Ventilation

Stove Use

Time-Activity

Proximity

Location

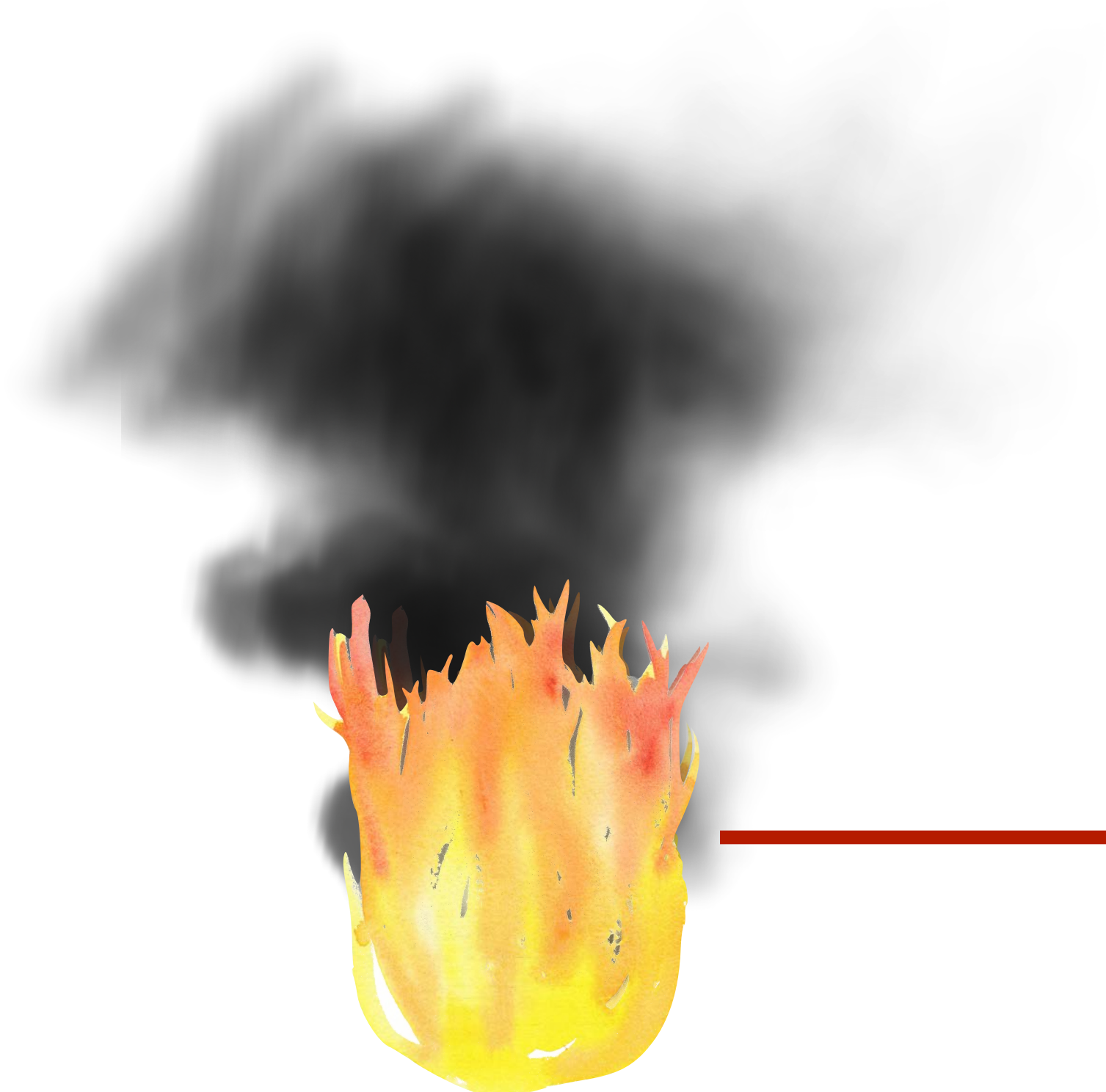
Season

Fuel

Other sources

Concentrations  
Exposures





Ventilation

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## The challenge of sensing in LMICs

Off-the-grid — batteries required

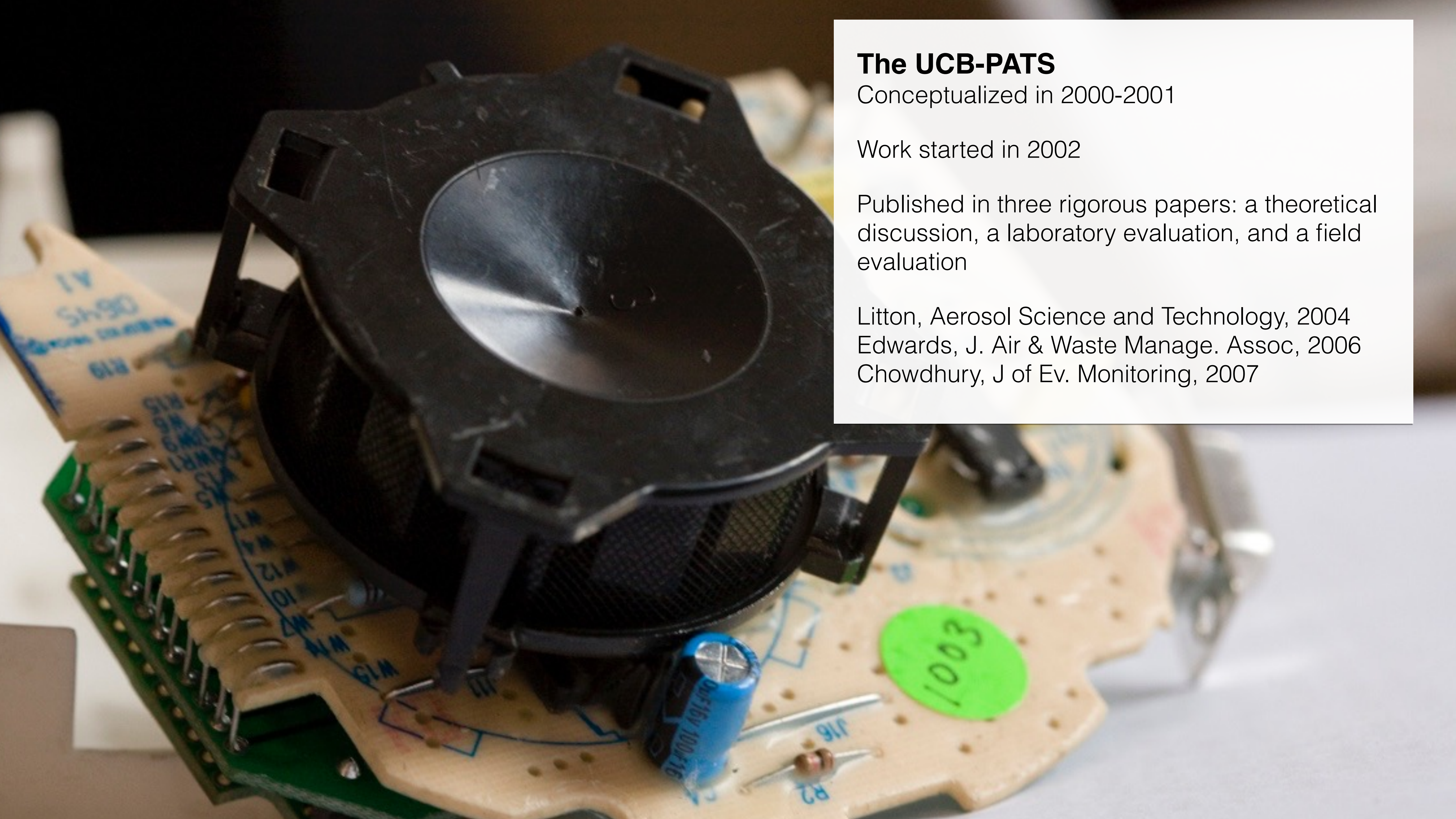
Robust to harsh conditions, toxic and corrosive gases

Wide-sensing range – very clean to very dirty (peaks at  $120 \text{ mg/m}^3$  not uncommon)

Easy-to-service clean







## The UCB-PATS

Conceptualized in 2000-2001

Work started in 2002

Published in three rigorous papers: a theoretical discussion, a laboratory evaluation, and a field evaluation

Litton, Aerosol Science and Technology, 2004  
Edwards, J. Air & Waste Manage. Assoc, 2006  
Chowdhury, J of Ev. Monitoring, 2007



## **Ideal for HAP field studies**

Low-power consumption

50  $\mu\text{g}/\text{m}^3$  - 120  $\text{mg}/\text{m}^3$

Robust, easy to clean and service

UCB-PATS used in dozens to hundreds of studies around the world

~500 USD







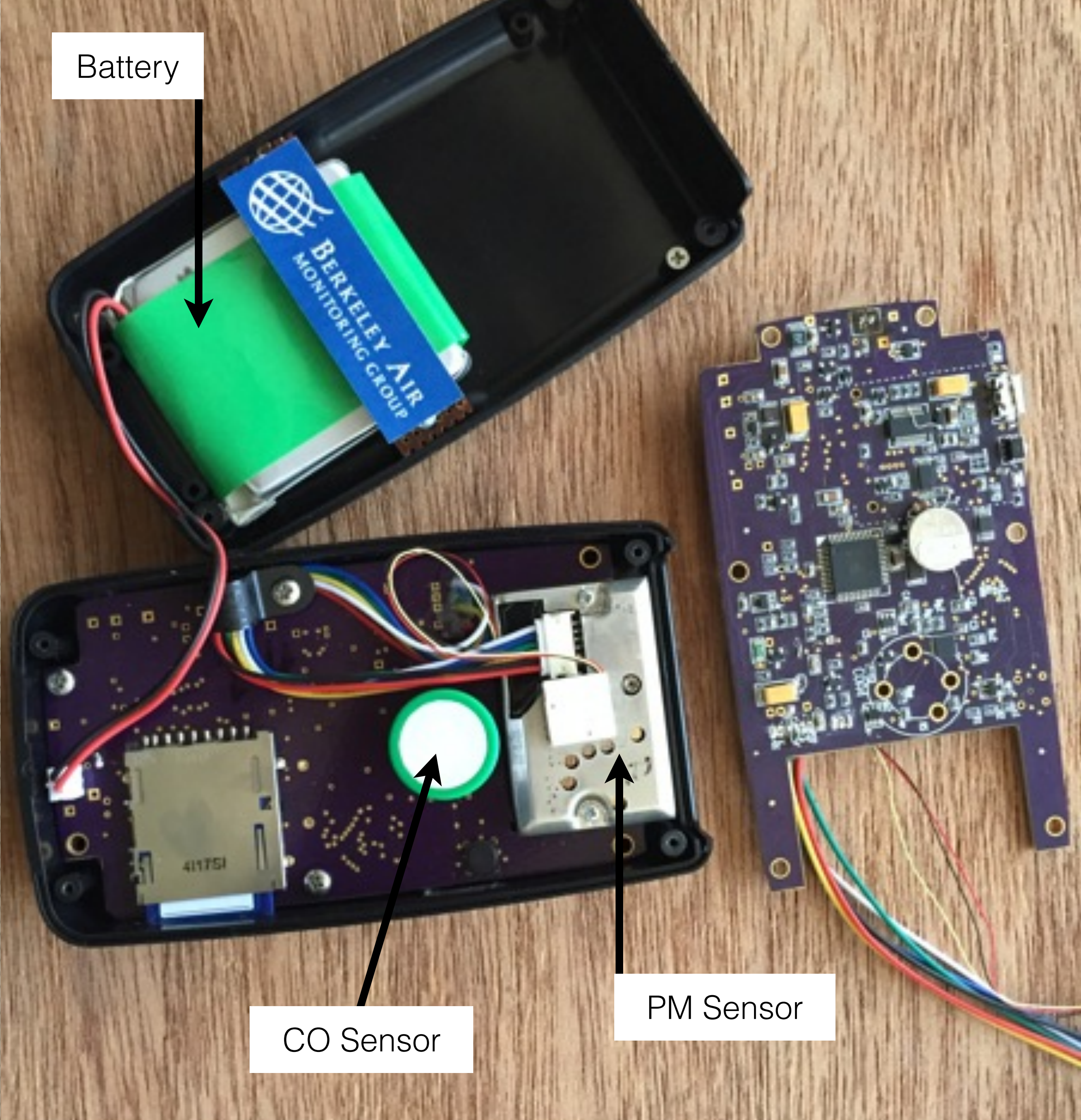
## **PATS+**

Wide dynamic range  
 $10\mu\text{g}/\text{m}^3$  to  $50\text{mg}/\text{m}^3$

Modern microelectronics  
USB, SD card

Long-battery life - ~48h as pictured; 72+h  
with new design





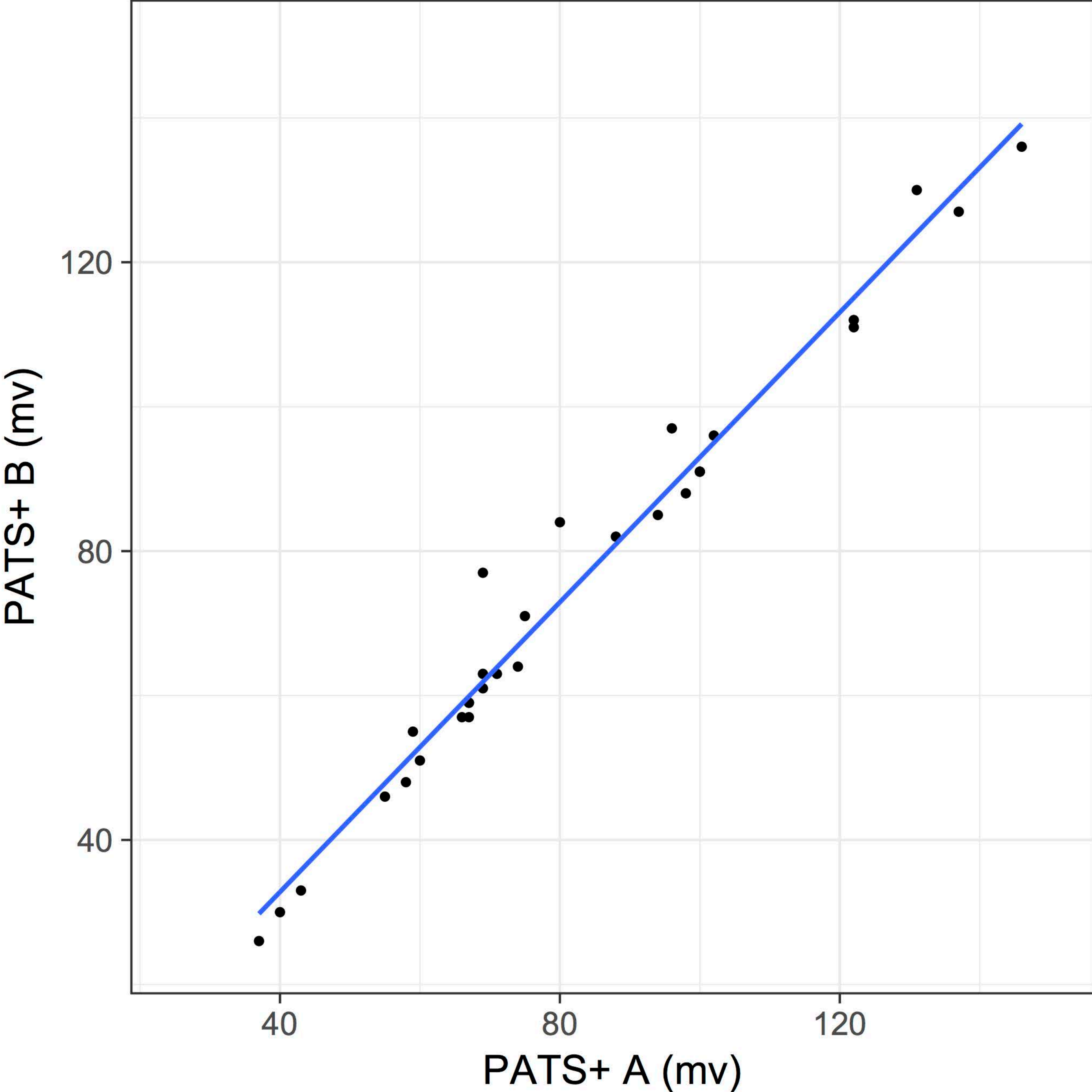
Battery

CO Sensor

PM Sensor

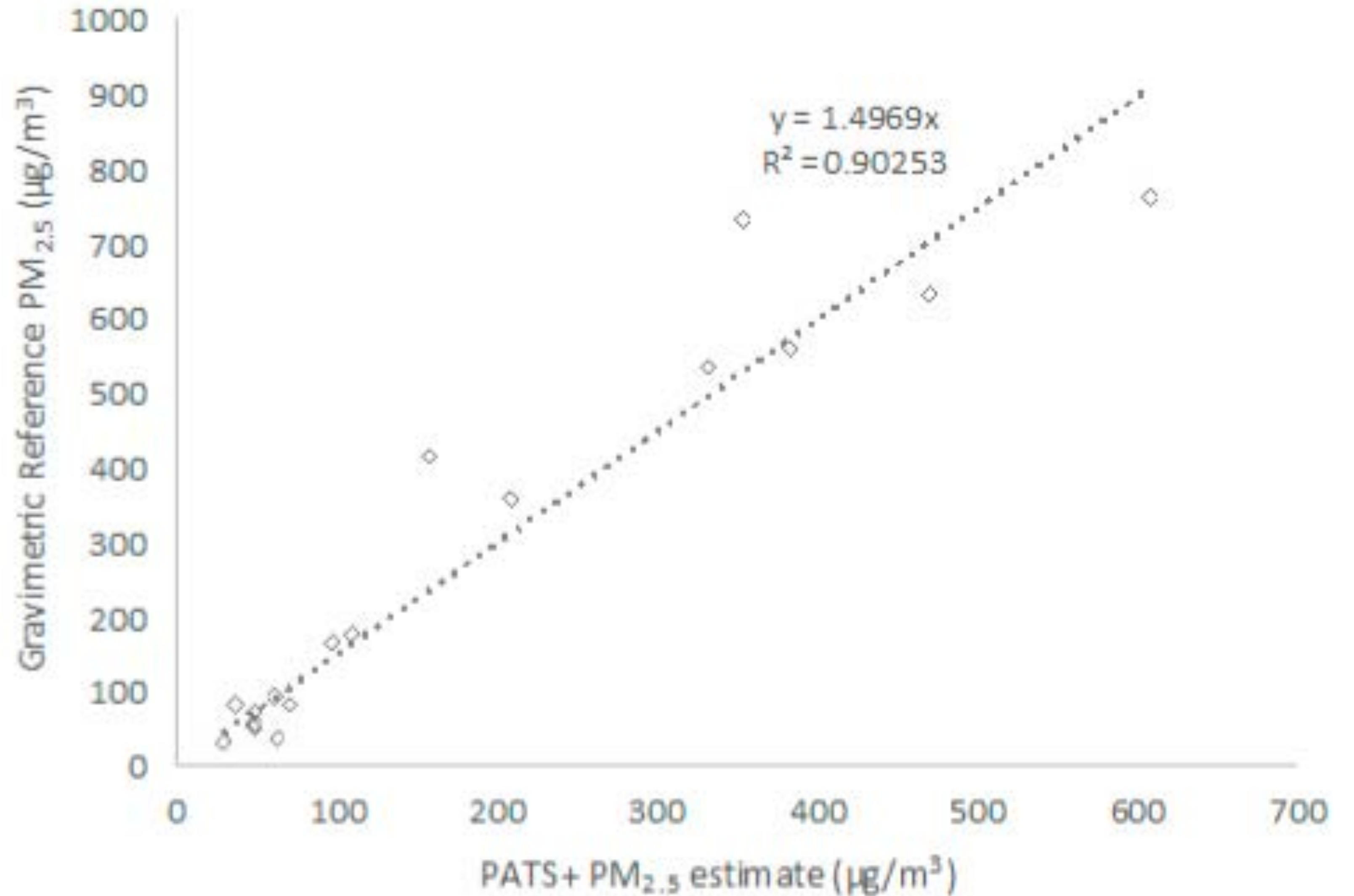


**Consistent response  
between devices**





**Strong correlation with gravimetric reference methods across a broad range of concentrations**





# Measuring temperature as a proxy for appliance usage

## The Stove Use Monitoring System (SUMS)





## Data-logging thermometers

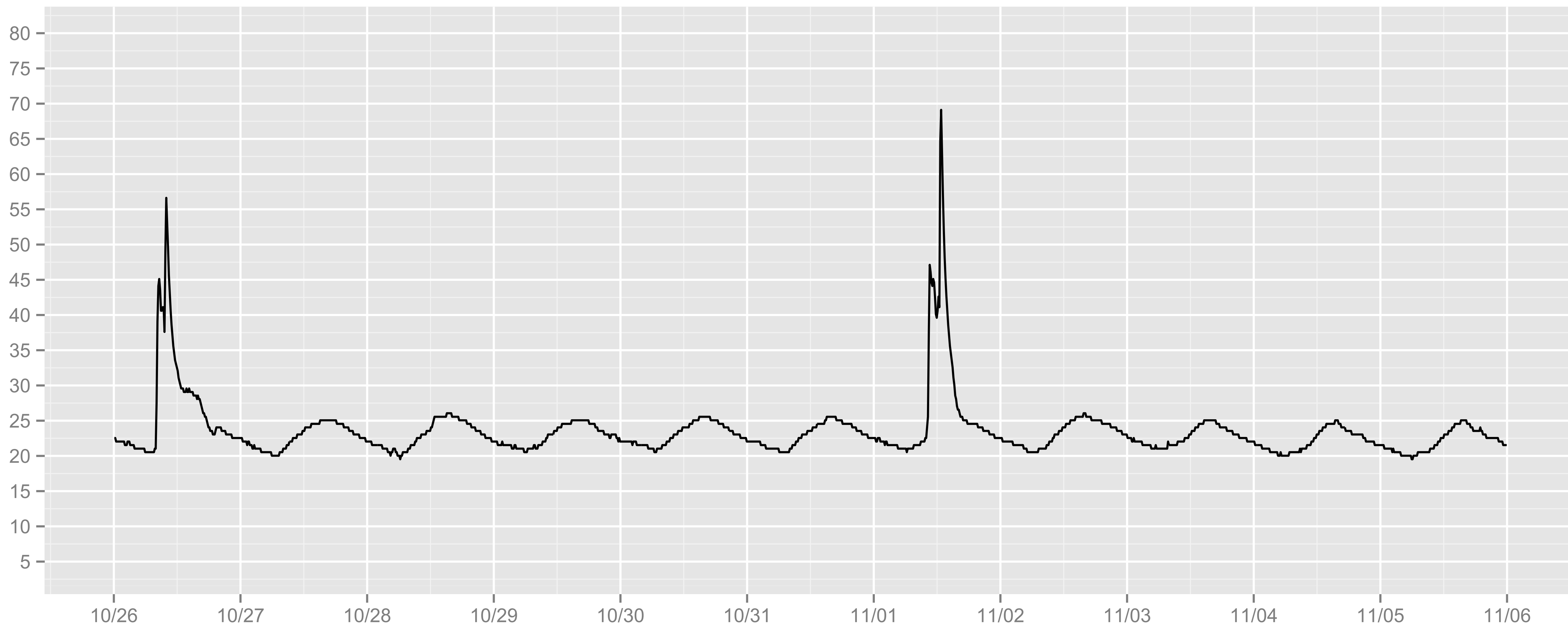
Variety of “flavors” — the one pictured here is a Maxim iButton

More recently, use of small, bluetooth enabled thermocouples — Geocene Dots

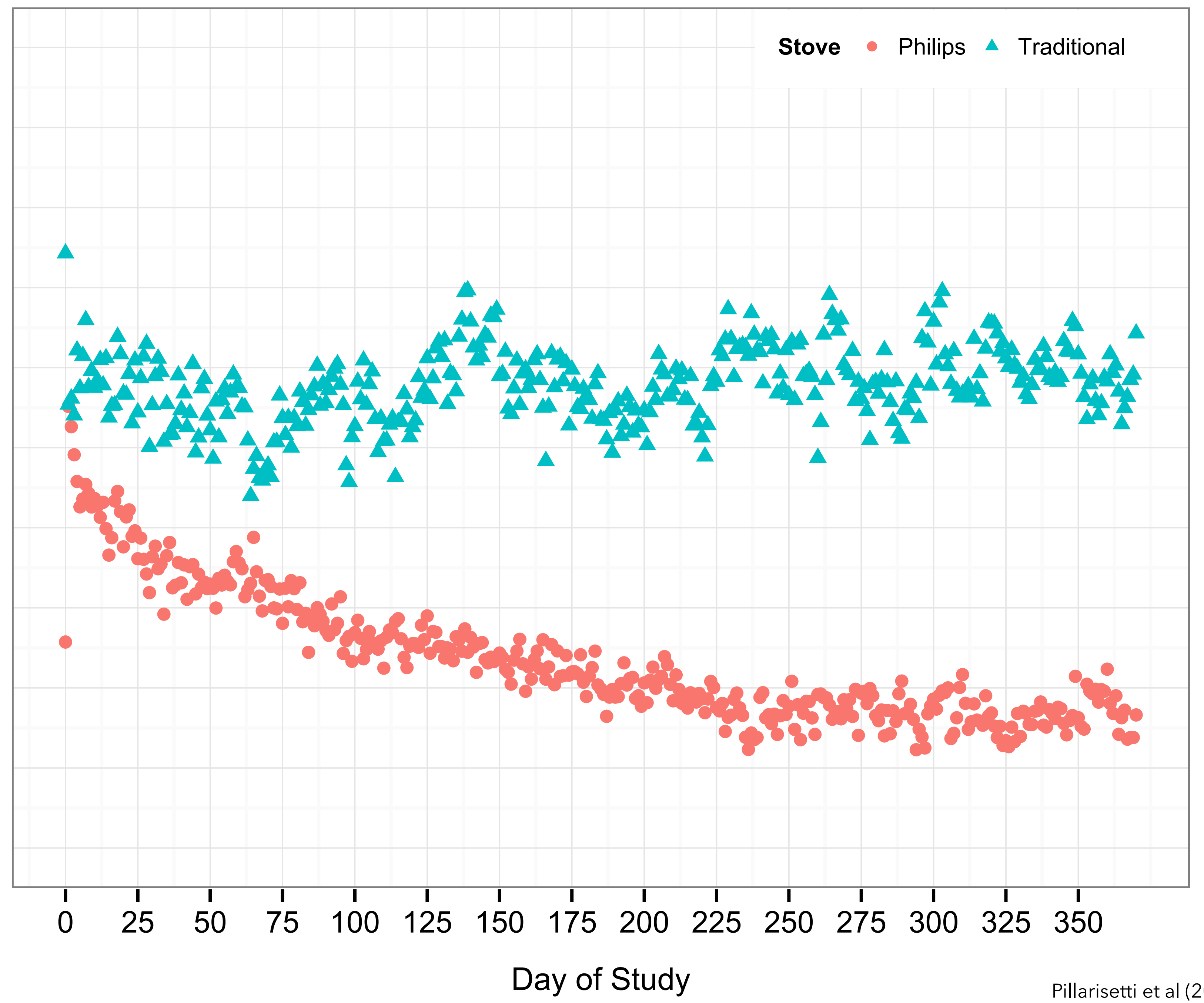
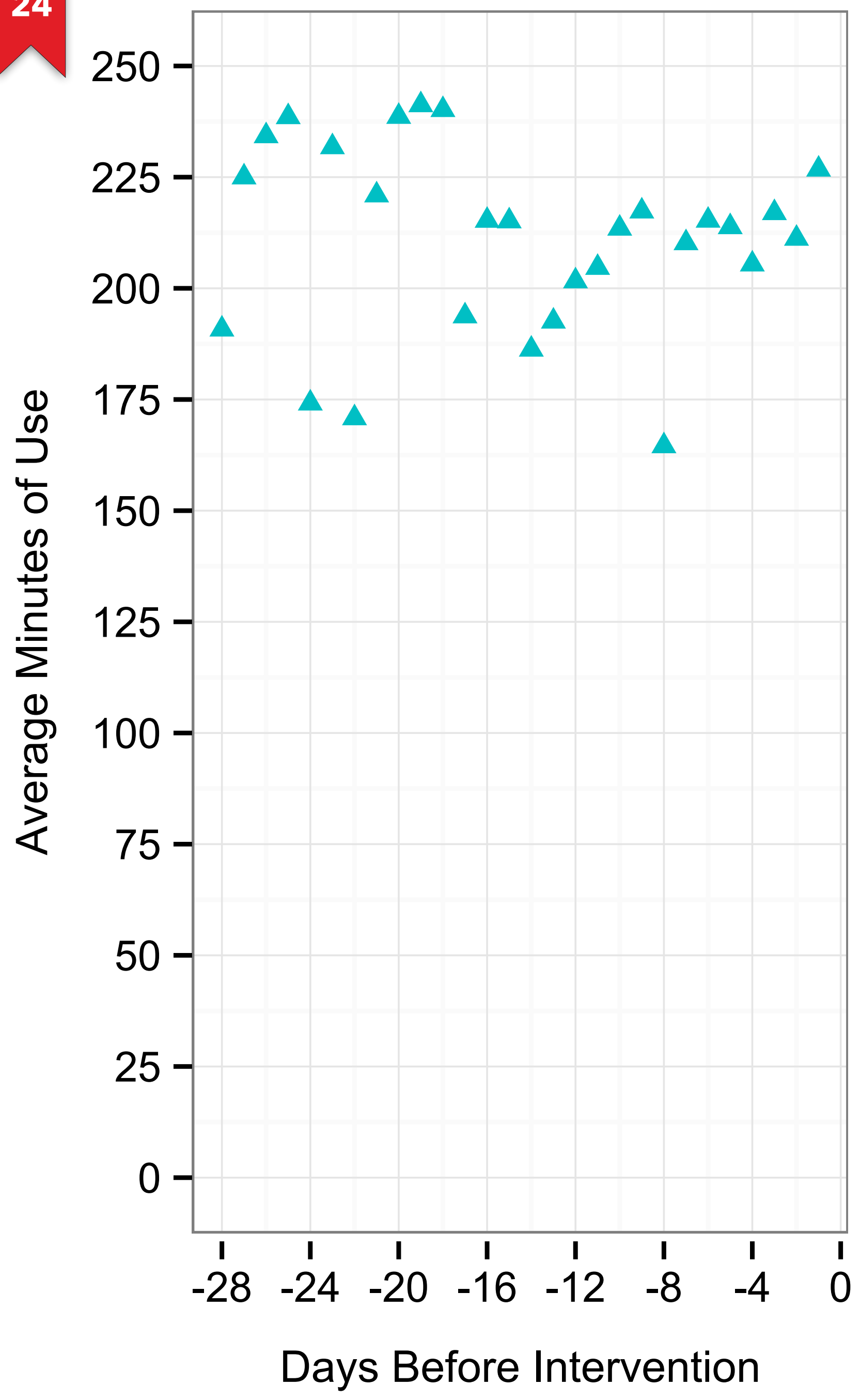




# SUMs Data and Processing





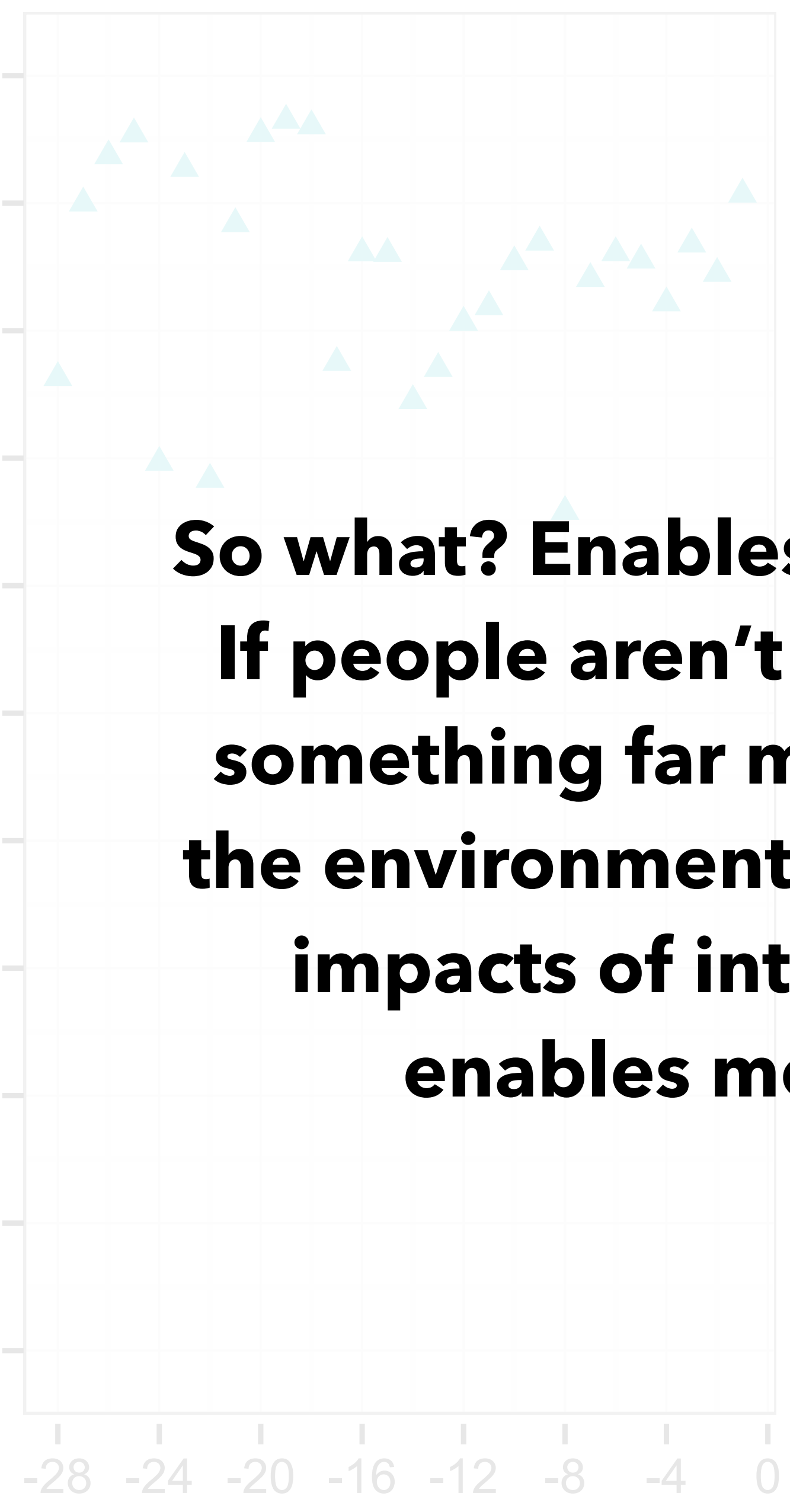




Average Minutes of Use

Stove Philips Traditional

**So what? Enables understanding of temporal usage patterns. If people aren't using their clean stove, they're likely using something far more polluting – bad for their health and for the environment. Allows better modeling of potential health impacts of interventions in real world conditions – and enables monitoring and evaluation of programs.**



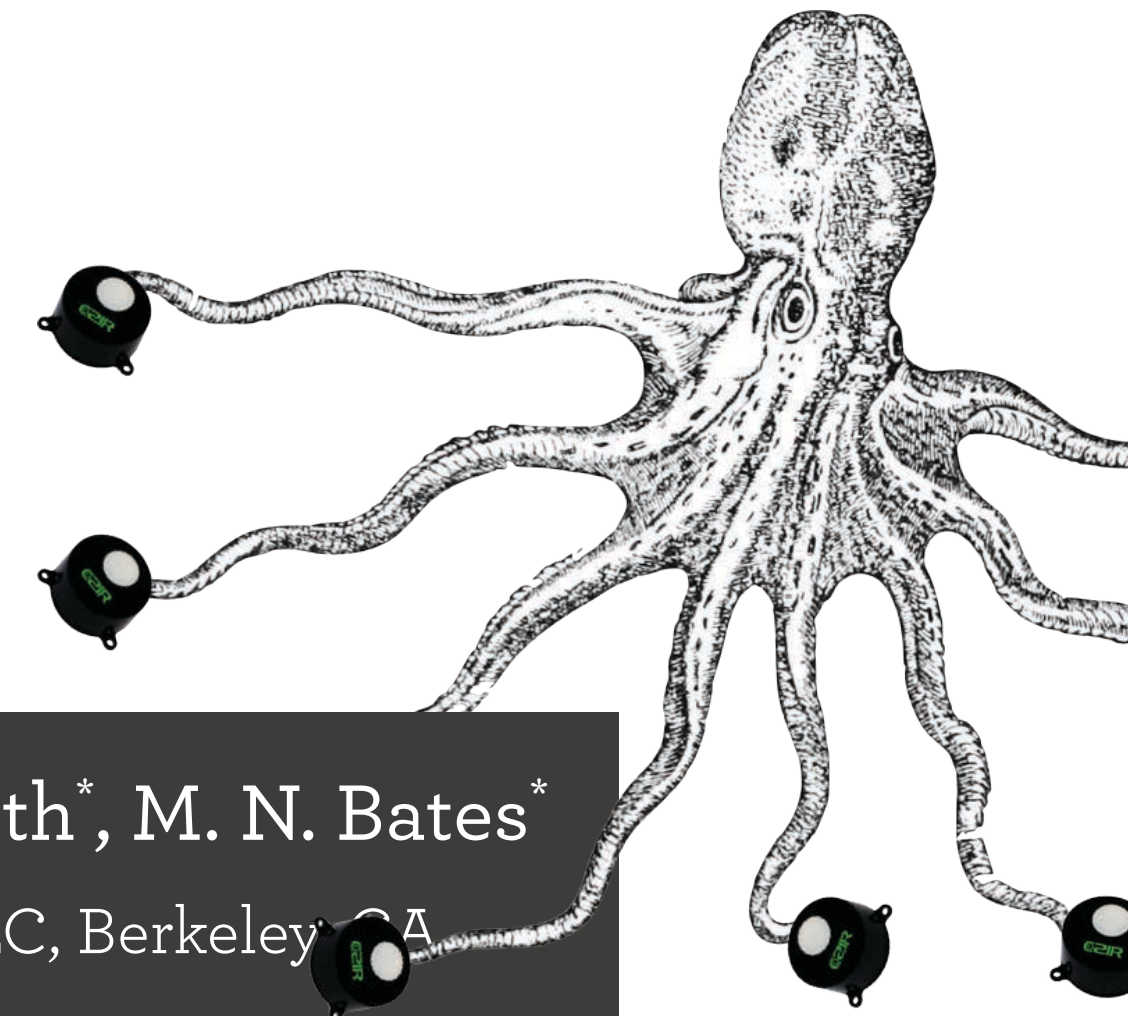
Days Before Intervention

Day of Study



# A LOW-COST, CARBON DIOXIDE MONITORING SYSTEM FOR ESTIMATING HOUSEHOLD AIR EXCHANGE RATES

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\*University of California, Berkeley, Berkeley, CA, °Institute for Social and Environmental Research-Nepal, Chitwan, Nepal, #EME Systems, LLC, Berkeley, CA



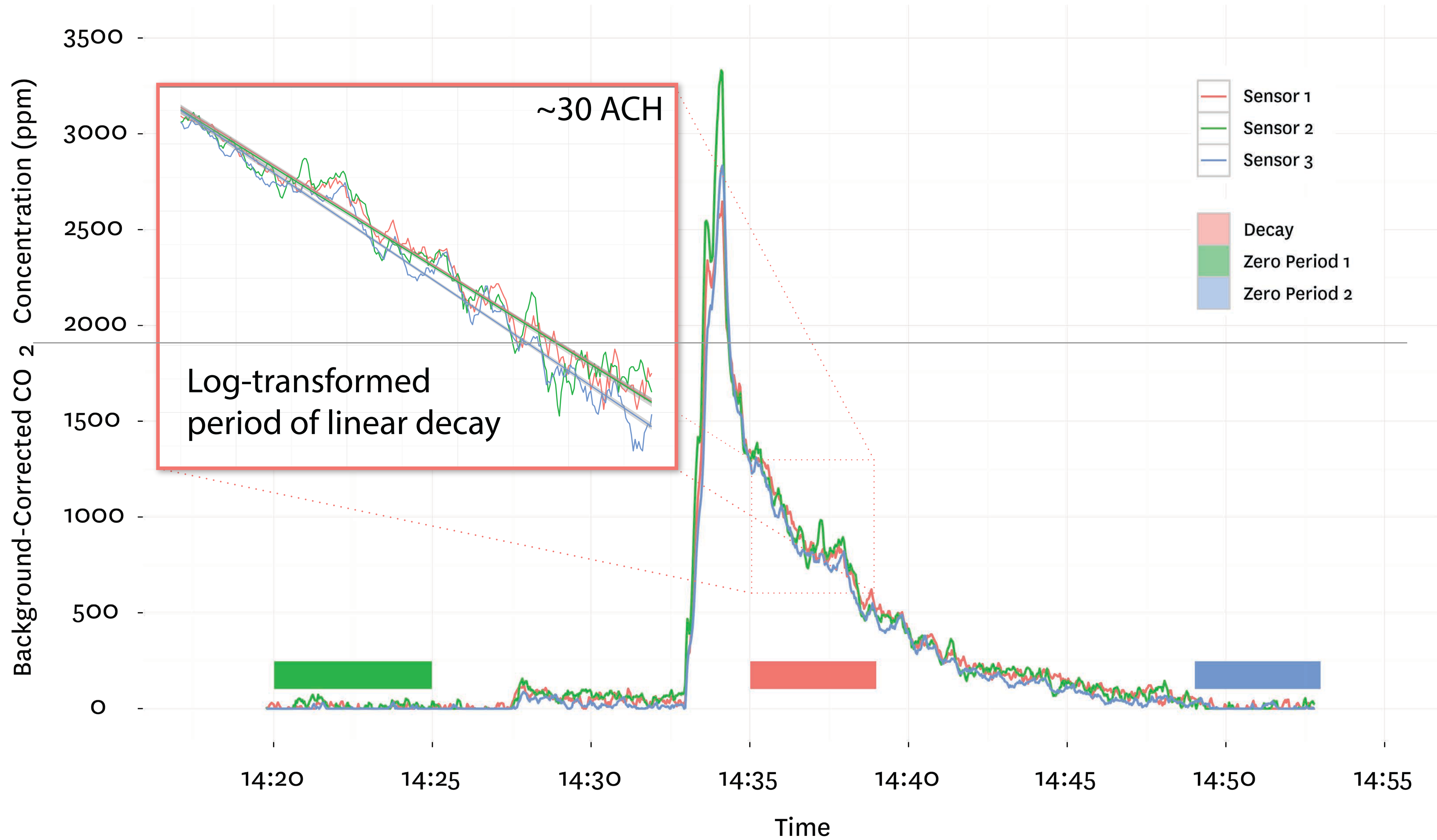


**ARMS consists of a data-logger, two to four non-dispersive infrared CO2 sensing arms, protocols for sensor placement and tracer gas release in households, and data analysis tools.**





# Sample ARMS trace from a single measurement period in a single kitchen

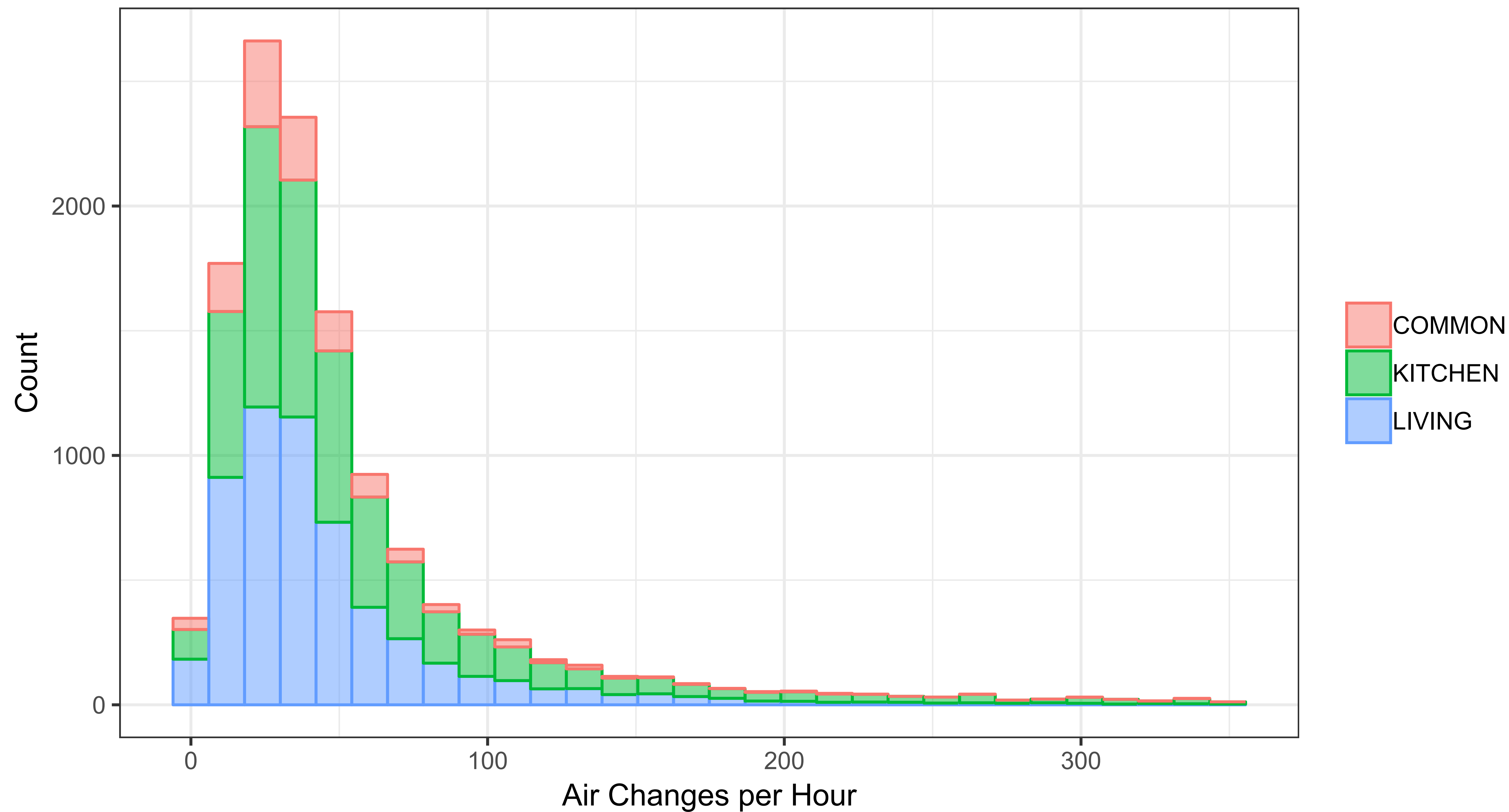




# Large dataset from Nepali Homes

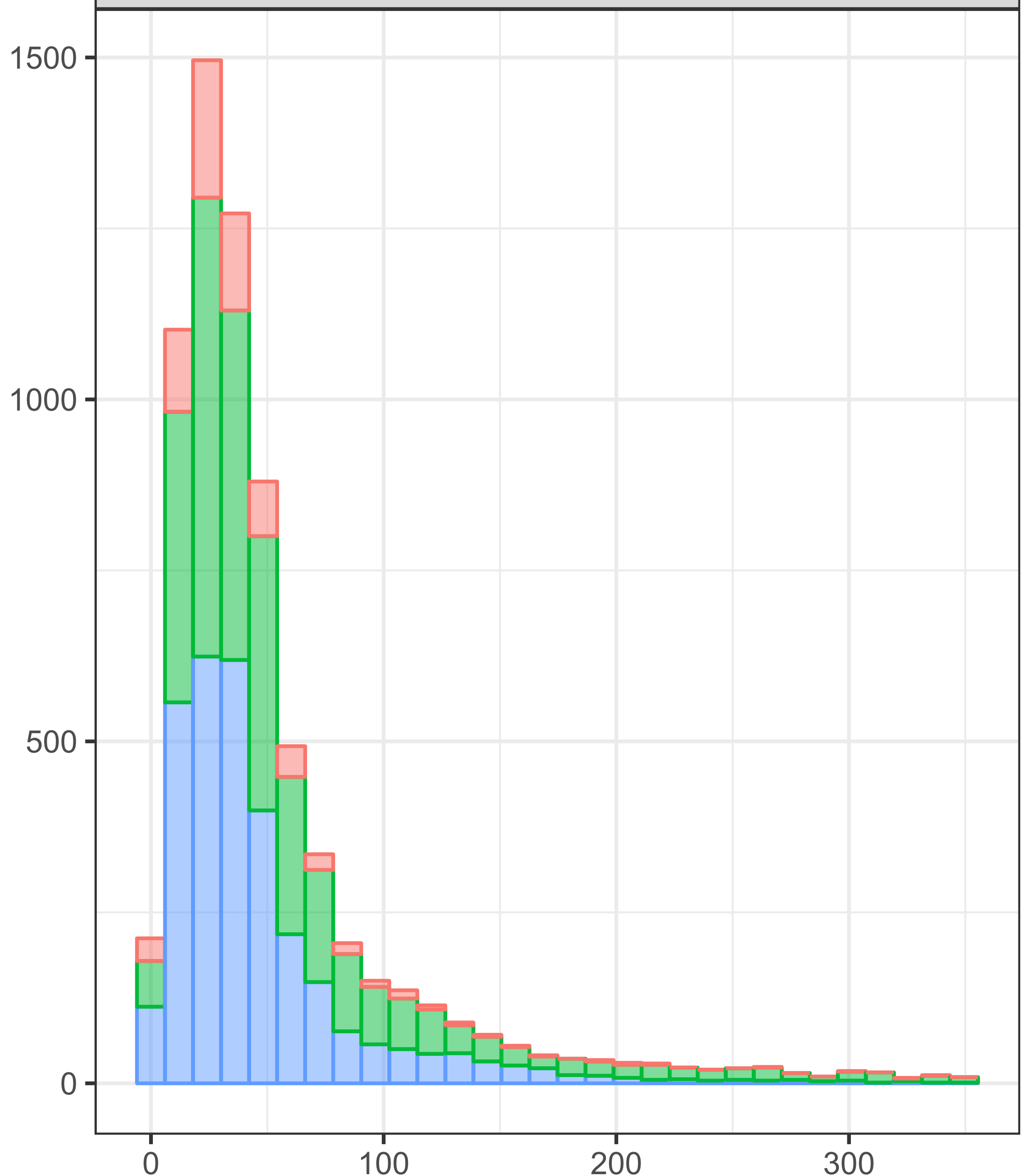
- 4300 samples in total
- Very reliable system – 0.5% failure rate due to either human or sensor error
- Final dataset now includes 4280 files, consisting of 12800 valid CO<sub>2</sub> measurements from 1745 homes (an average of 3 sensors/file)



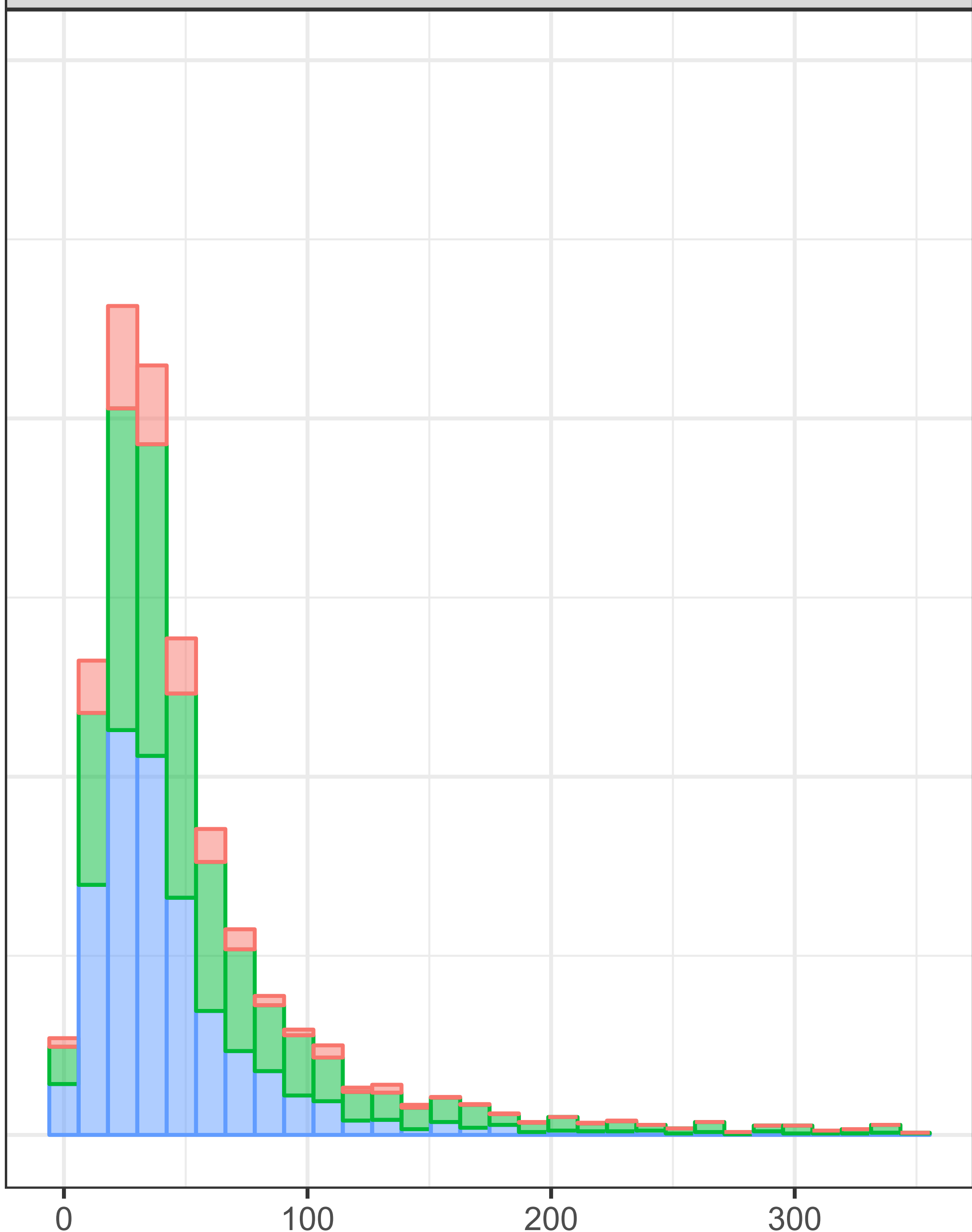




Morning



Afternoon



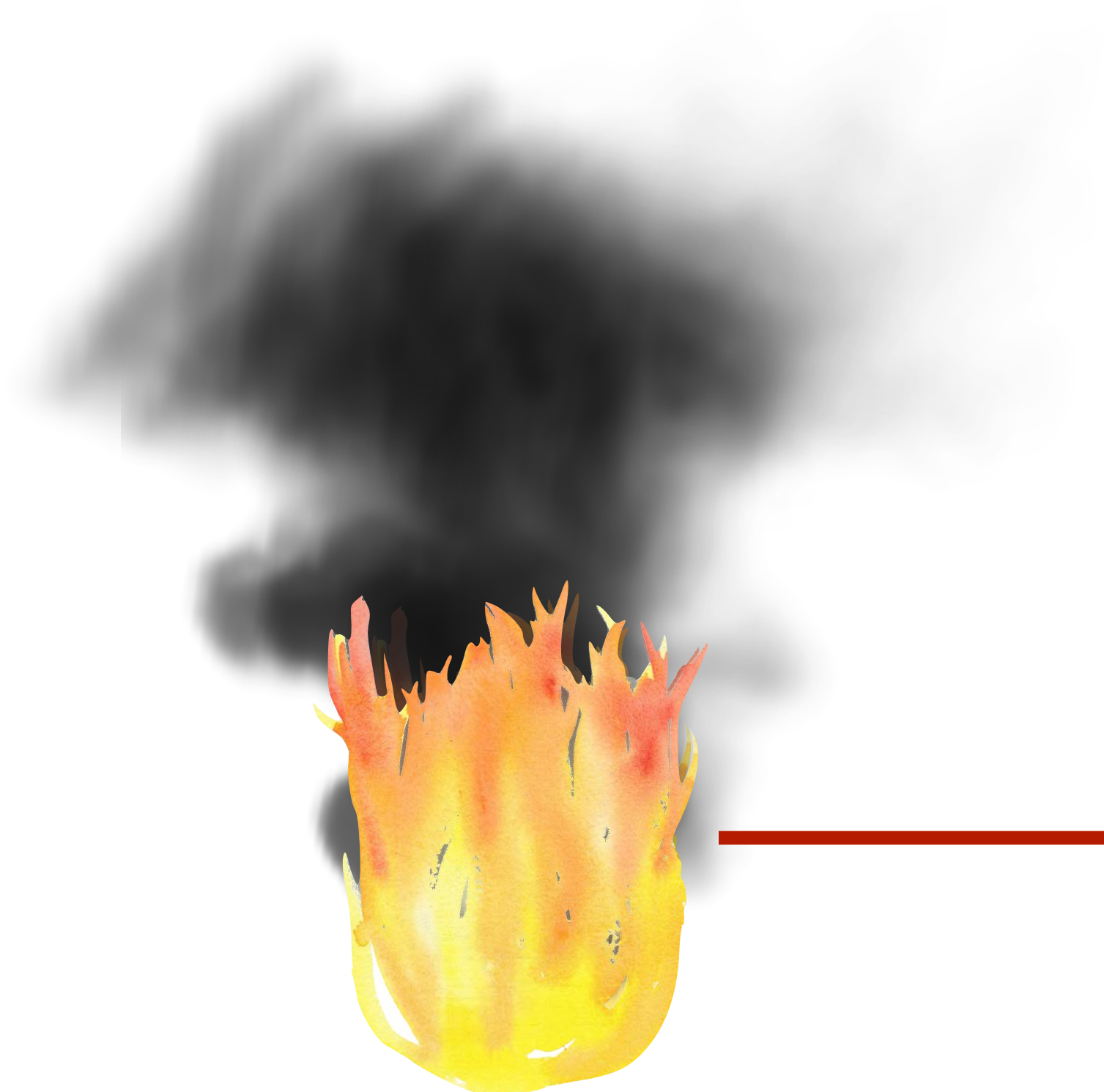
- COMMON
- KITCHEN
- LIVING



# Can we opportunistically measure ventilation rates?

- In a subset of the ~1800 households we measured ventilation in, we also placed 48 hour CO and PM sensors
- How well do ventilation rates estimated from the decays of these pollutants in the evening match ventilation rates from ARMS?
- What predicts our estimated ACHs? Room volume, occupancy, number of windows, doors, size of eaves, etc?
- How well do estimates of ACH explain variability in models of PM<sub>2.5</sub> concentration and exposure?





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