# 63rd annual Yankee Conference: Hands -On Environmental Health

# Fresher Air - Smarter Schools Novel Methods to Monitor Indoor Air Quality in Boston Public Schools

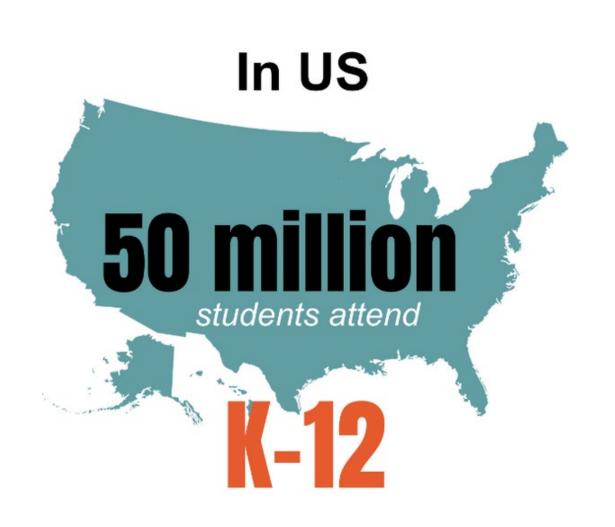
### M. Patricia Fabian

Associate Professor of Environmental Health Associate Director for the Institute for Global Sustainability Boston University

September 11, 2025



# If you know a school-age child in the US...



School students spend

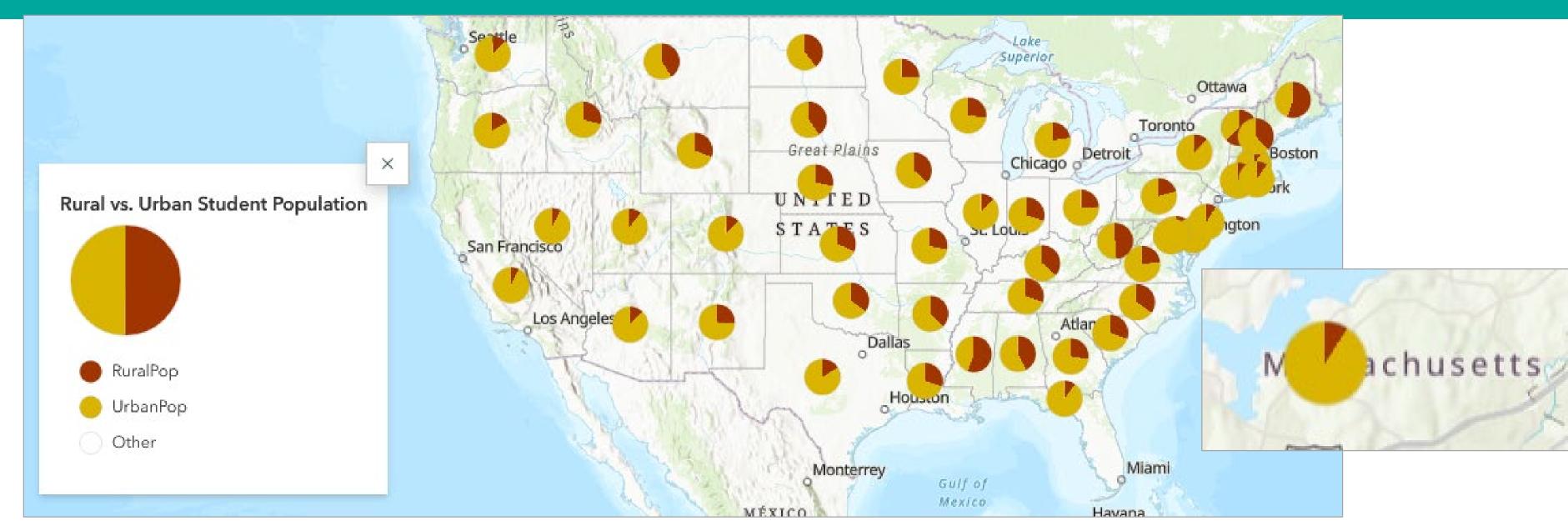


about 3 years
of a student life...

"School age is a vulnerable time for students.

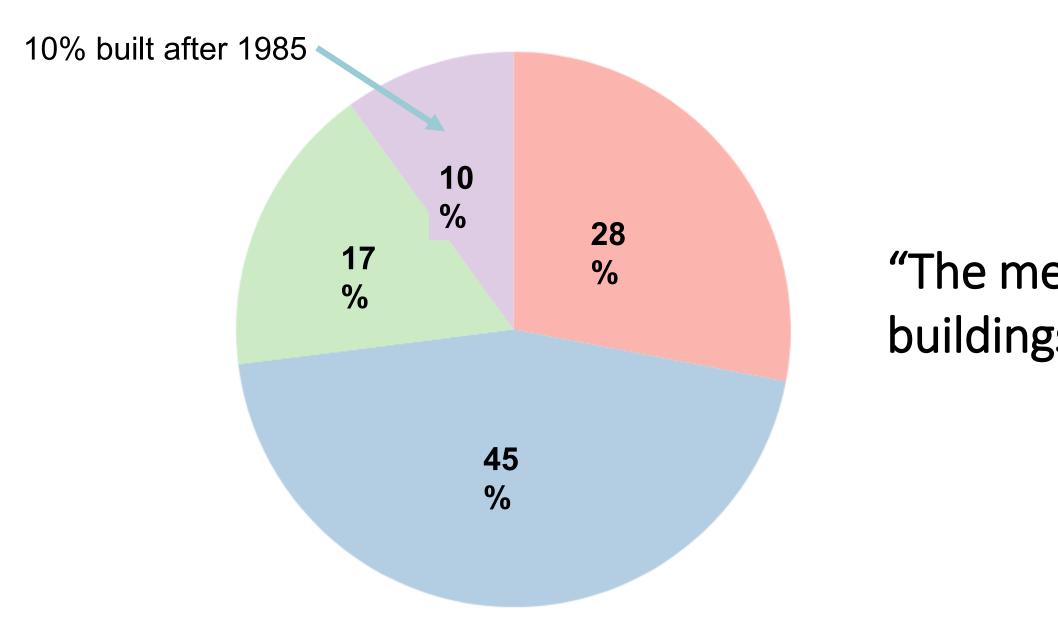
It is a unique period of rapid growth and development"

## Most likely the child attends an urban school



https://arcg.is/1rG58m1

## ...and are most likely learning in an old building

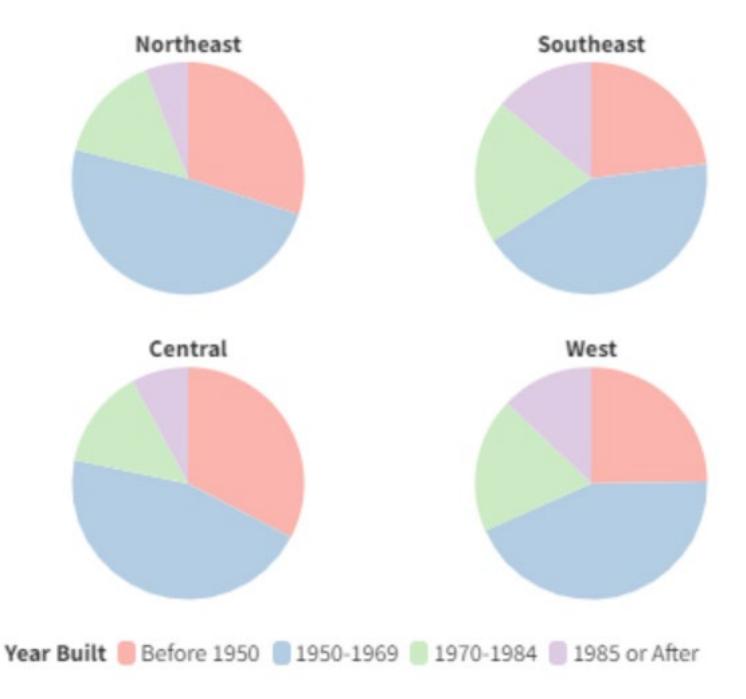


"The mean age of US school buildings is 65 years"

Boston University Sustainable Built Environment Lab

## ...and are most likely learning in an old building

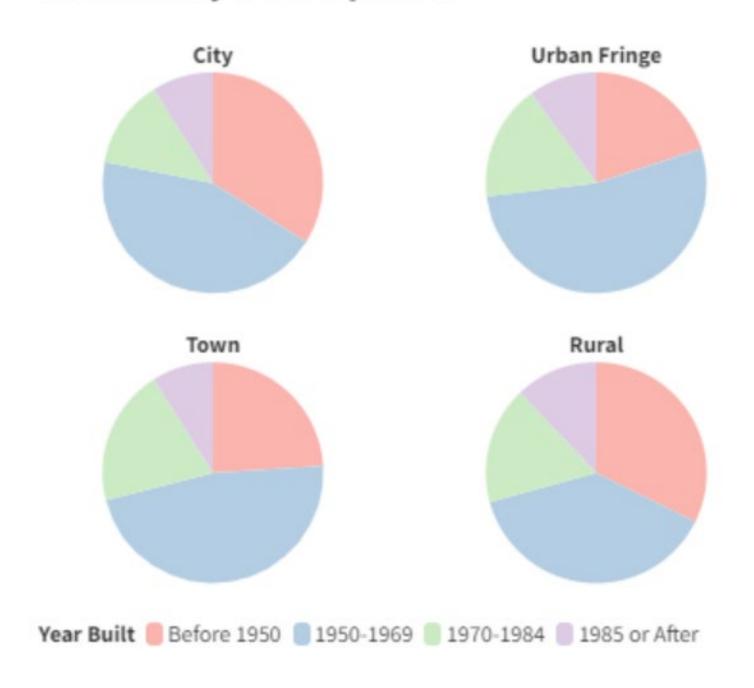
### Year Built of Public School Buildings by US Region



True for all regions

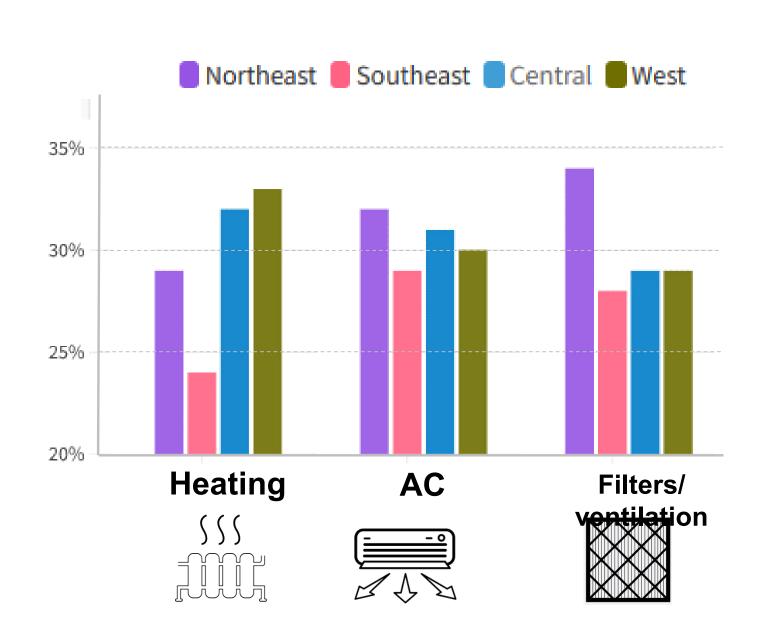
## ...and are most likely learning in an old building

### Year Built of Public School Buildings by Community Development



True for all types of neighborhoods

## ... with aging building systems in fair or poor condition



Nationally, "41% of districts need to update or replace heating, ventilation, and air conditioning (HVAC) systems in at least half of their schools" 2020 GAO-Report

"\$85 billion funding gap needed to maintain school buildings and equipment"

2021 State of our Schools Report

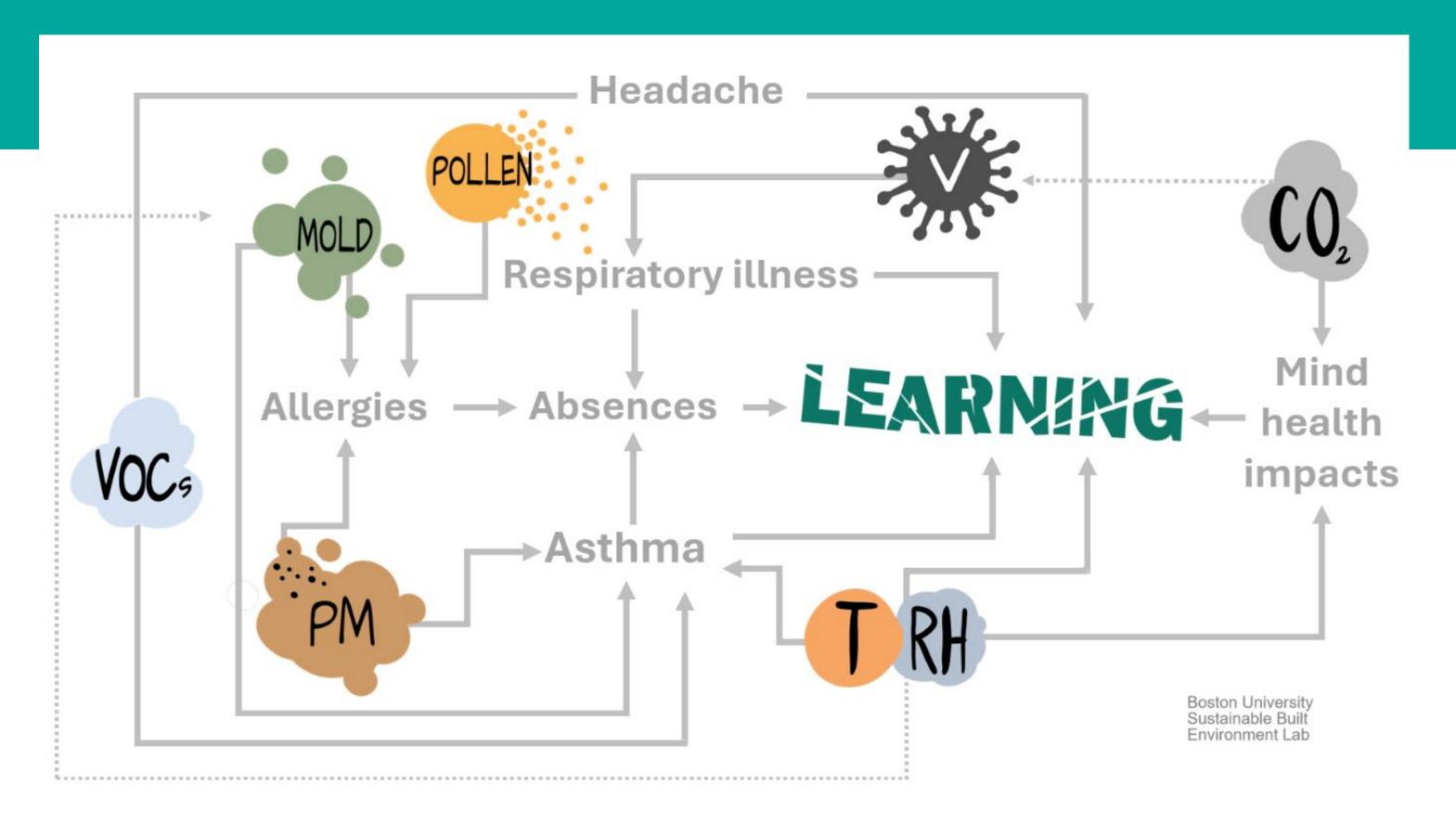
"K-12 school districts spend nearly \$8 billion annually on energy costs, the second largest expense after teacher salaries."

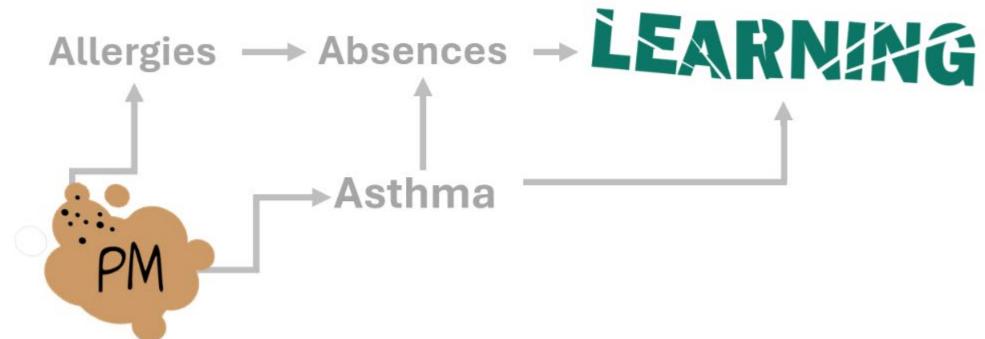
**US DOE** 

Percent of systems in fair or poor https://arcg.is/1rG58m1 condition

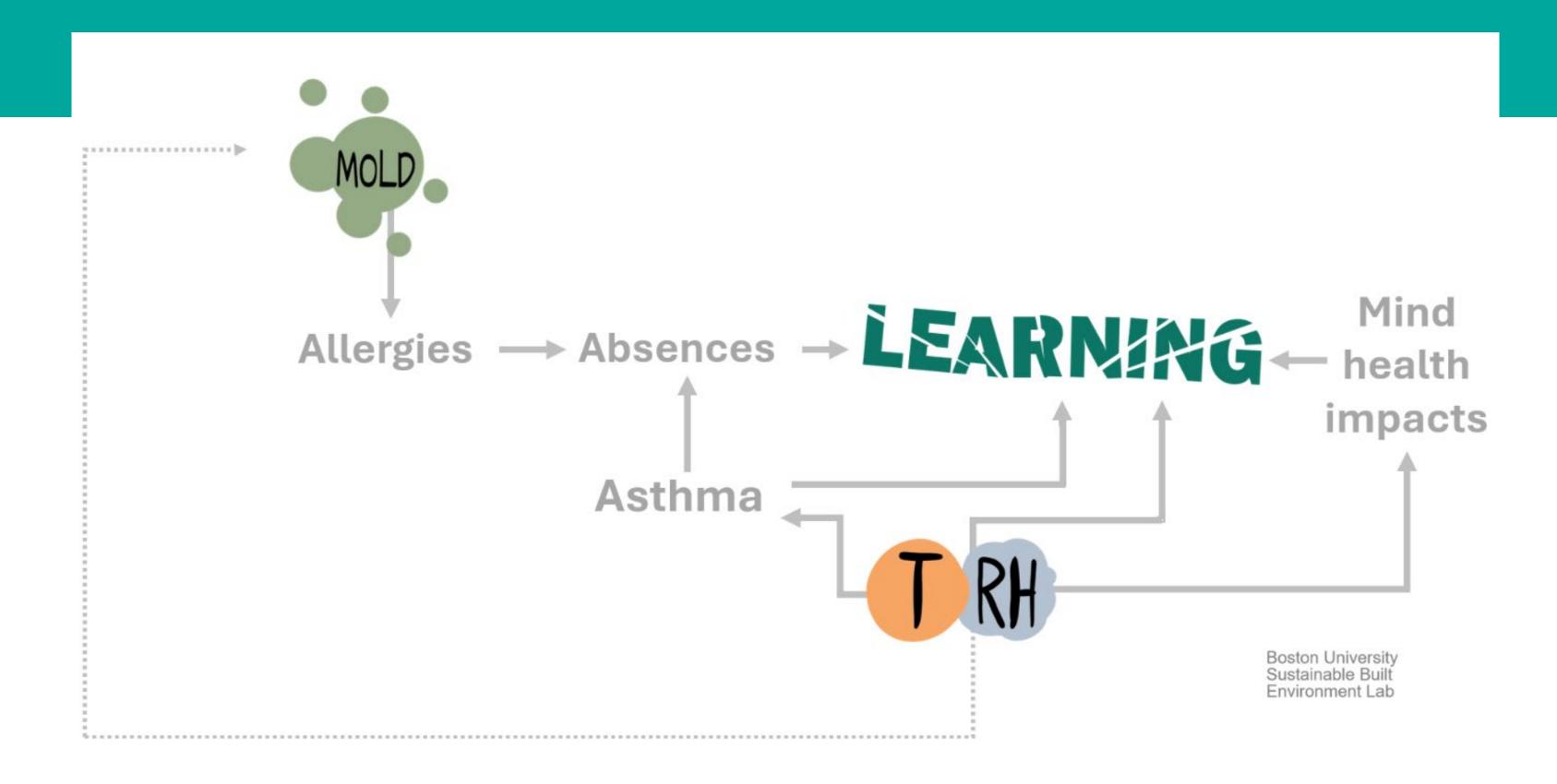
Boston University Sustainable Built Environment Lab

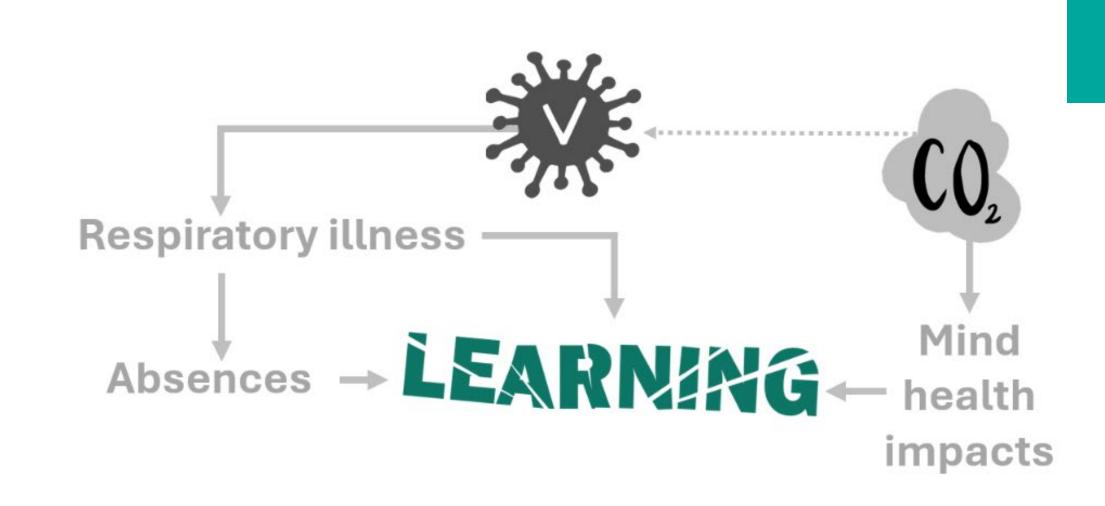
### ... which can result in exposure to indoor contaminants



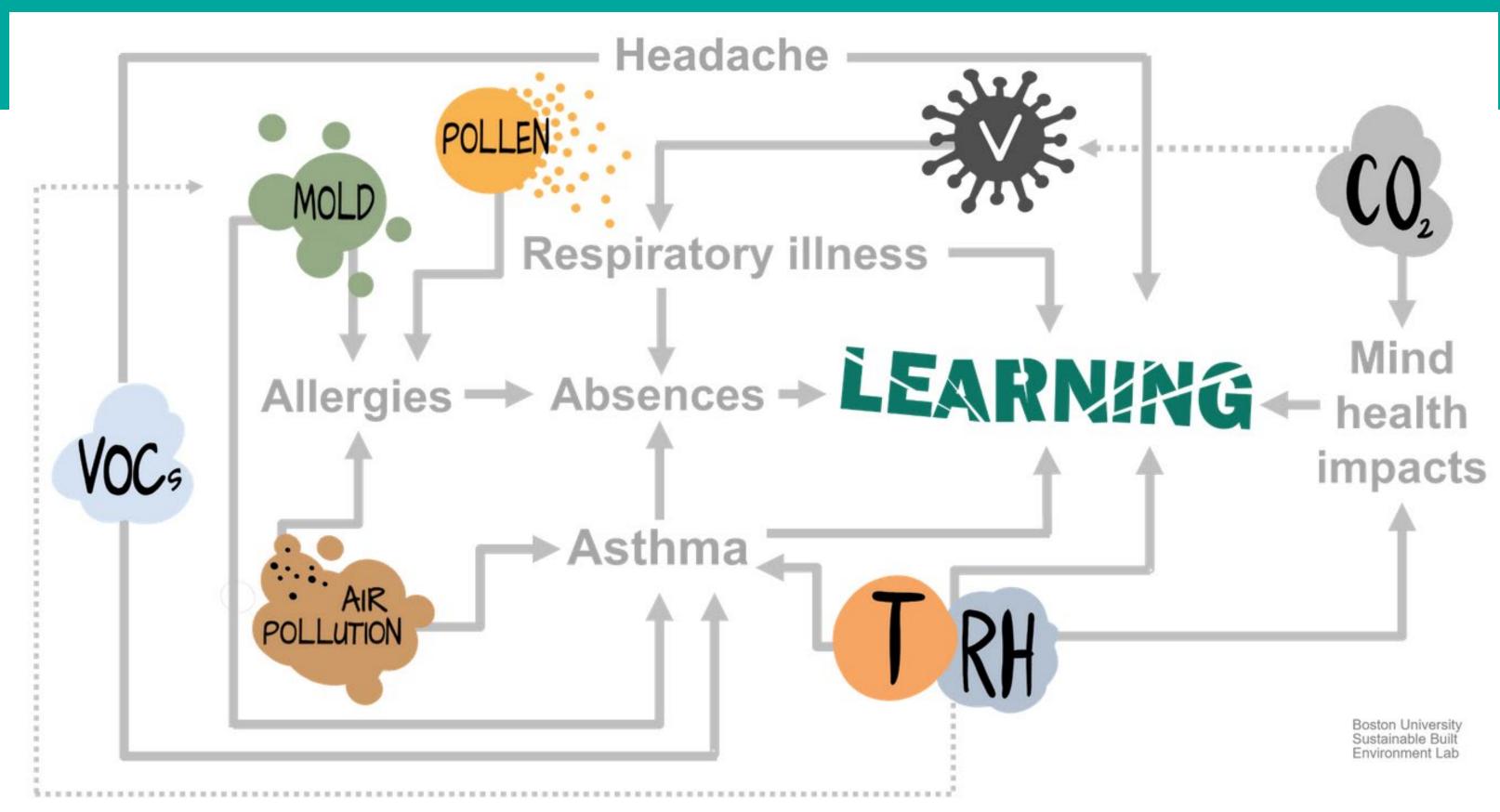


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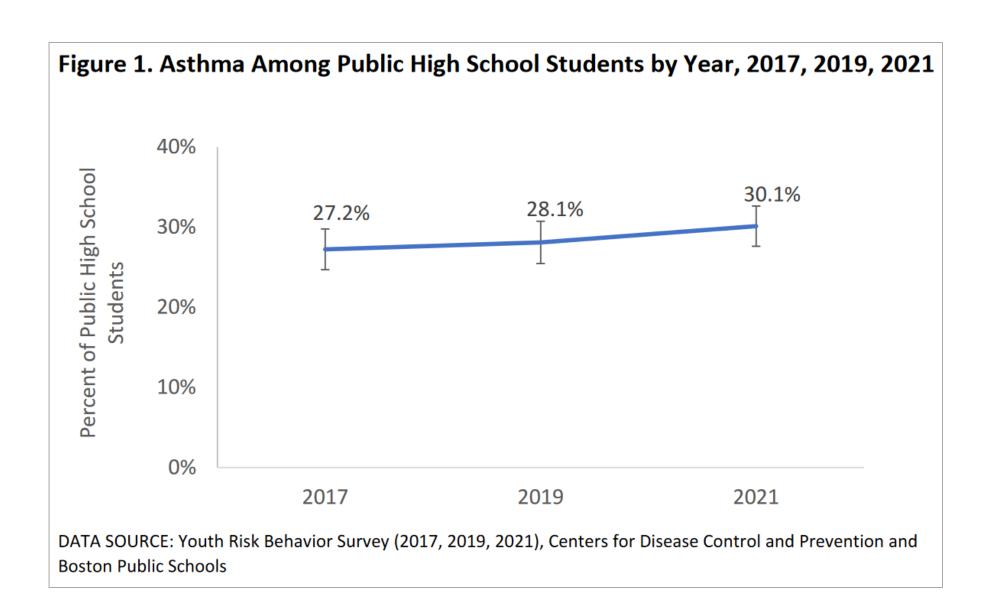


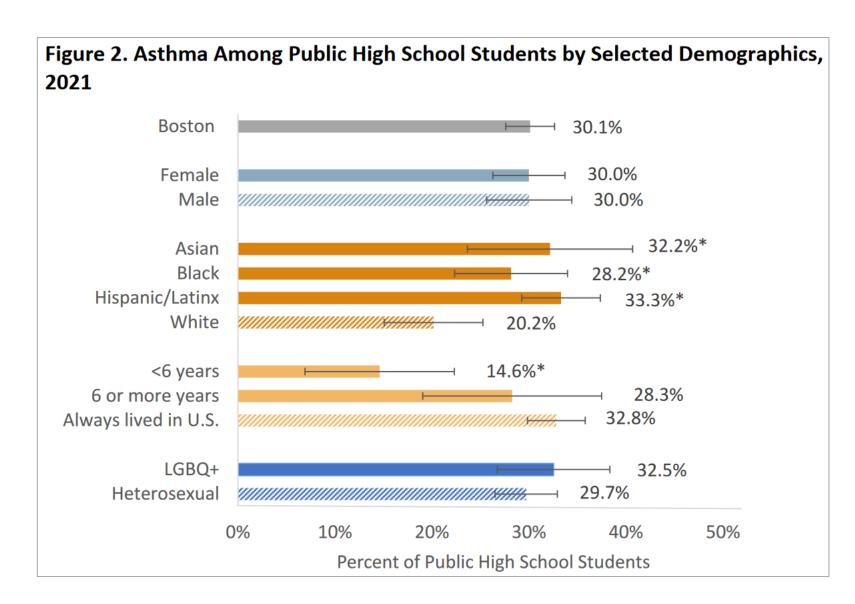


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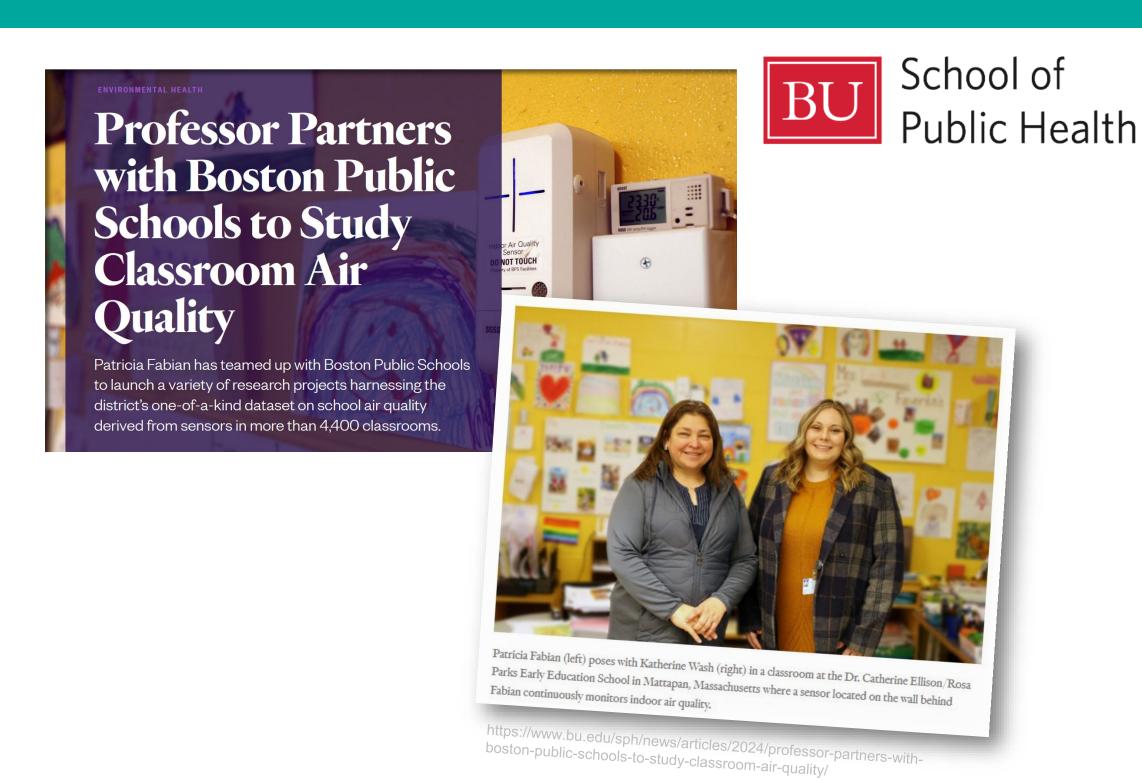


### Asthma in Boston Public Schools

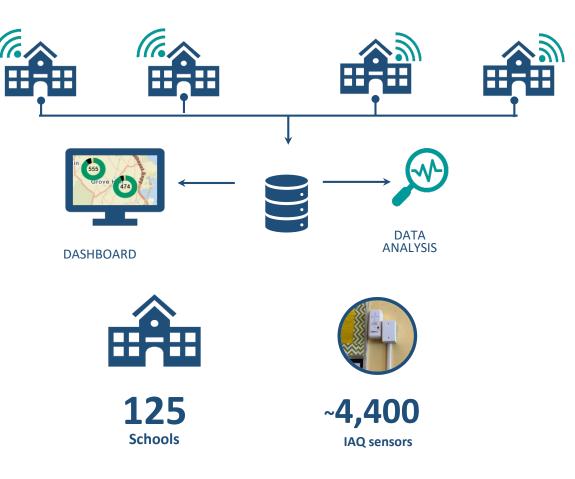




# Solutions through collaboration & research







= billions of data points

You can't fix what you don't measure - Katherine Walsh, BPS

### **Boston Public Schools**

- Oldest public school system in the U.S.
- Serves ~48,000 students and ~11,700 staff in 119 schools from pre-kindergarten to 12<sup>th</sup> grade
- Student demographics:
  - 43% Latinx, 29% African American/Black, 15% not Hispanic White, 9% Asian, 3.5% multi-race and 0.5% Native American or Native Hawaiian/Pacific Islander
  - o 71% low-income
  - O 48% first language not English
- 11.6 million sq. ft, 132 Buildings:
  - o 50% built before 1950, and 73% built before 1970
  - O 30% percent of the school buildings use HVAC for heating and cooling; 70% use steam heat with limited or no ventilation or cooling



Boston Arts Academy

### Similar to many school districts across the US...



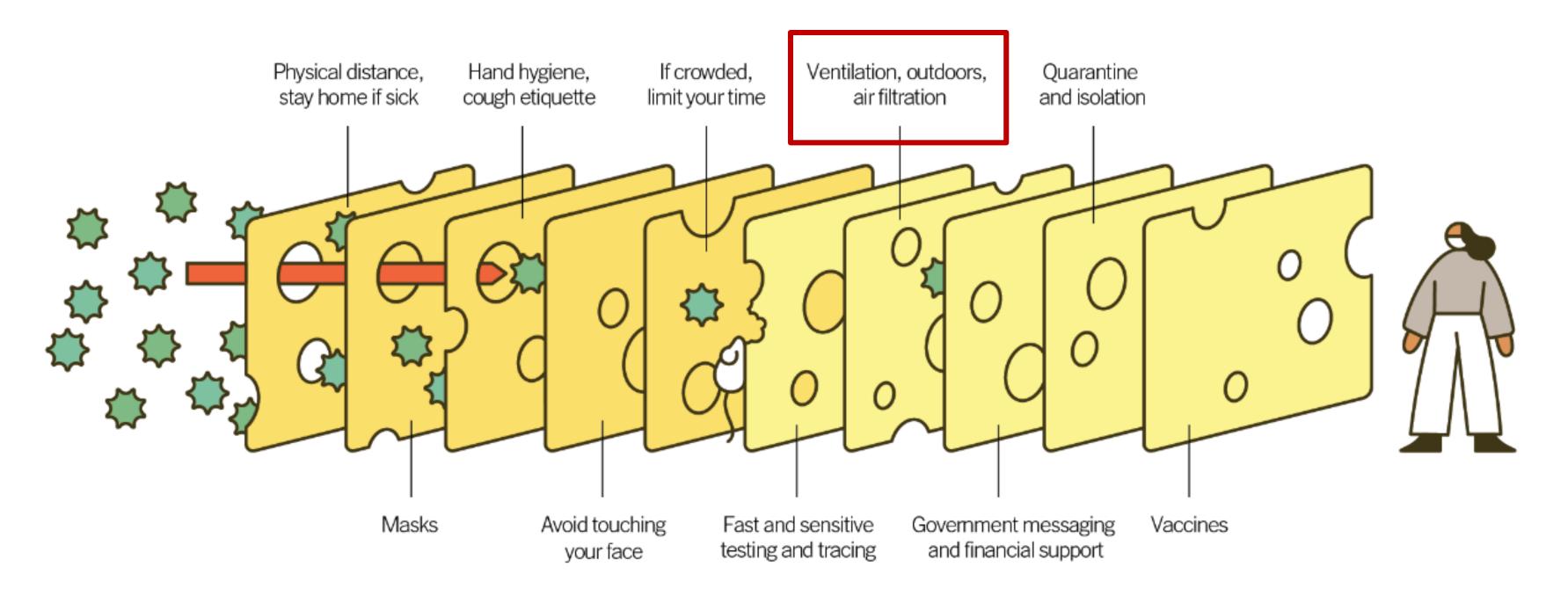
Average age of school buildings in cities in the US



**≯BOSTON PUBLIC SCHOOLS** 

# 07.30.21 - ESSER II Submission to DESE

#### Why Monitor IAQ?



New York Times, December 2020

https://www.nytimes.com/2020/12/05/health/coronavirus-swiss-cheese-infection-mackay.html

# **BPS IAQ Monitoring System**



# ~4,500 IAQ sensors launched Fall 2021















Indoor



**Outdoor** 

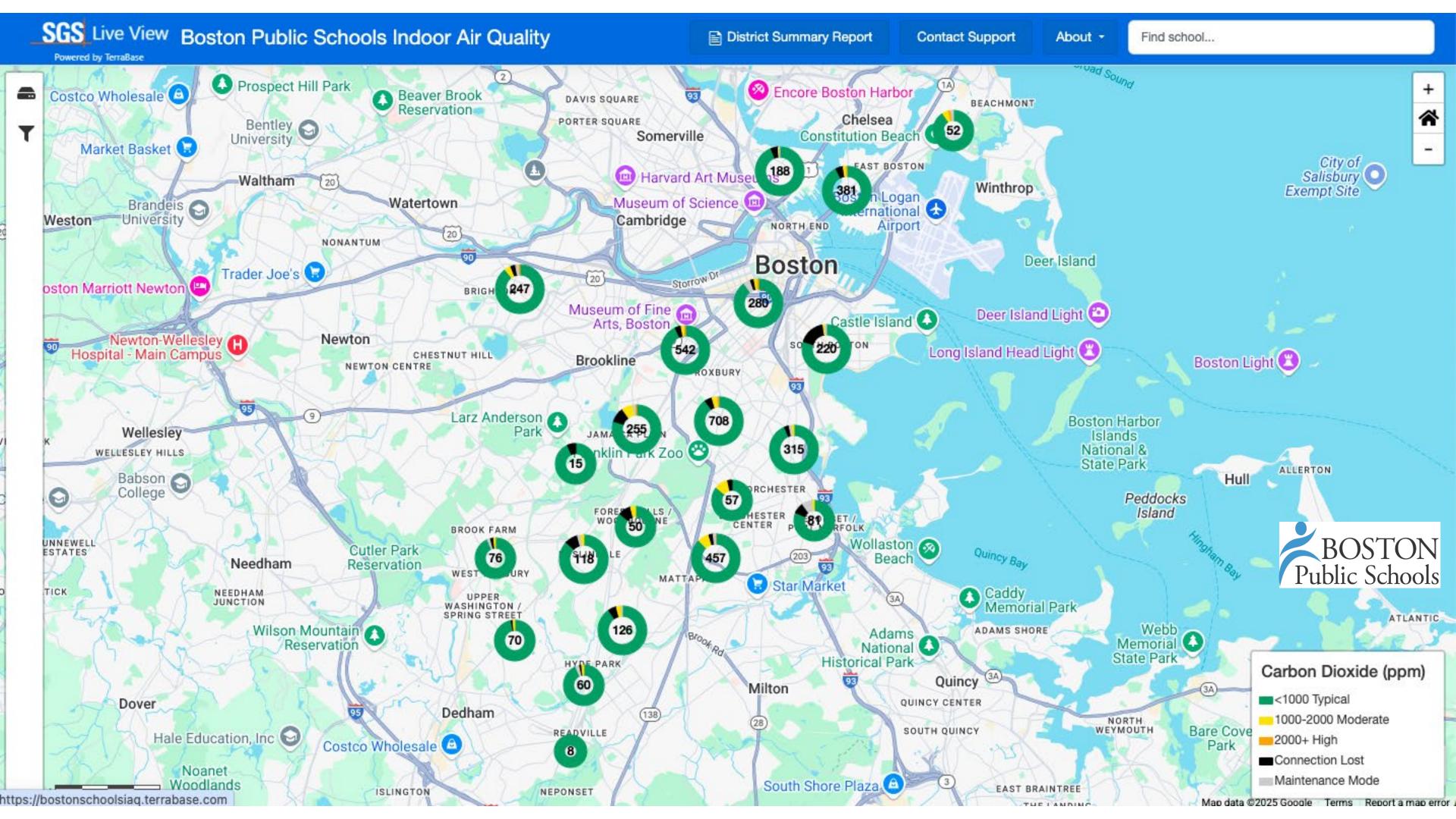
# BPS IAQ MONITORING SYSTEM

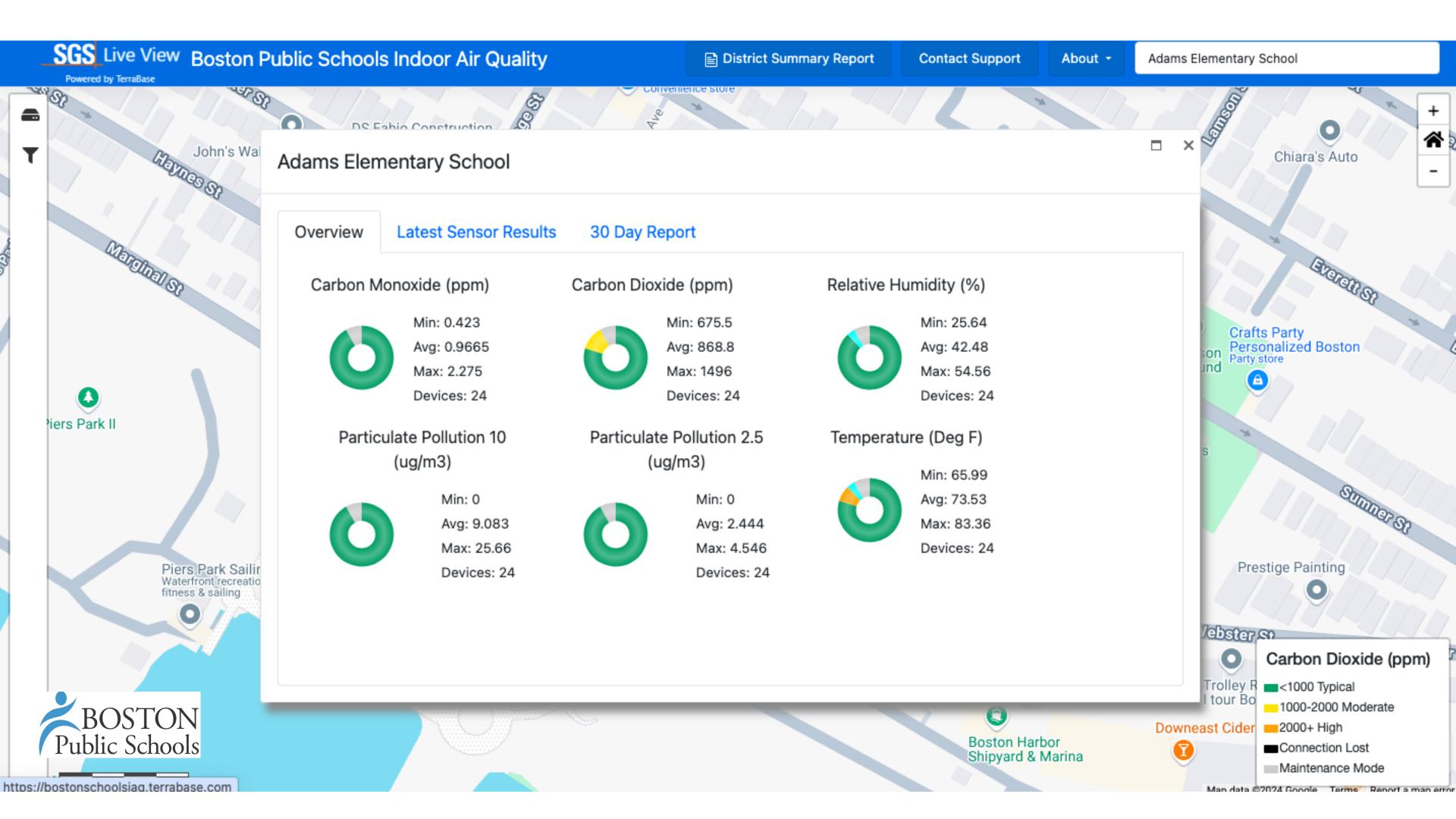
# Why did BPS install Indoor Air Quality Sensors?

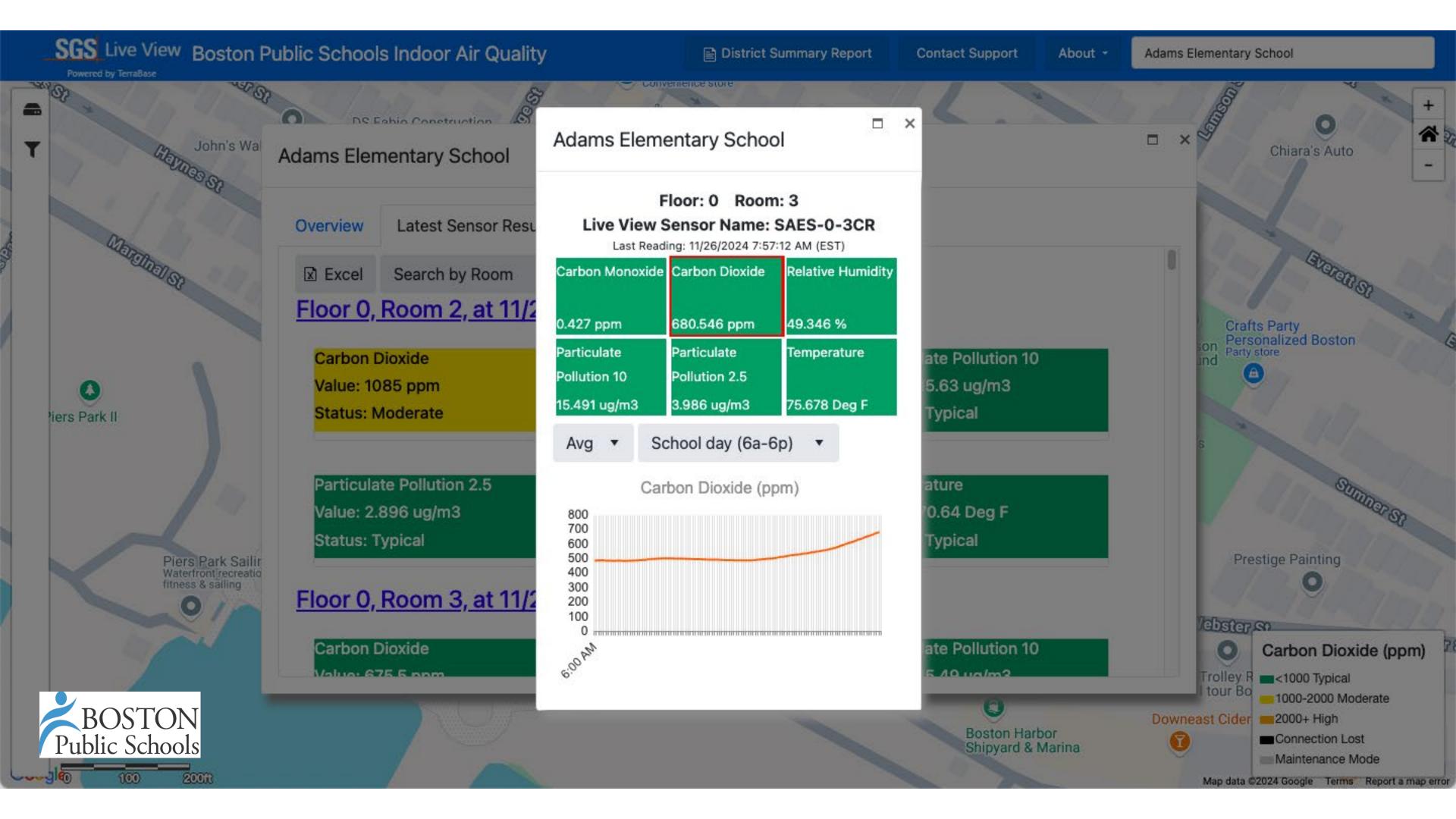
Monitoring & Reporting Risk Reduction Layer
Collect, monitor, measure, and evaluate IAQ data in order to:

- Prioritize decision-making.
- Take appropriate action, such as implementing IAQ interventions or adjusting ventilation rates.
- Develop IAQ standards and secure investments that improve IAQ and ventilation.
- Communicate and educate about IAQ.
- Develop community agency, collaboration, and trust around BPS schools' indoor environmental quality.

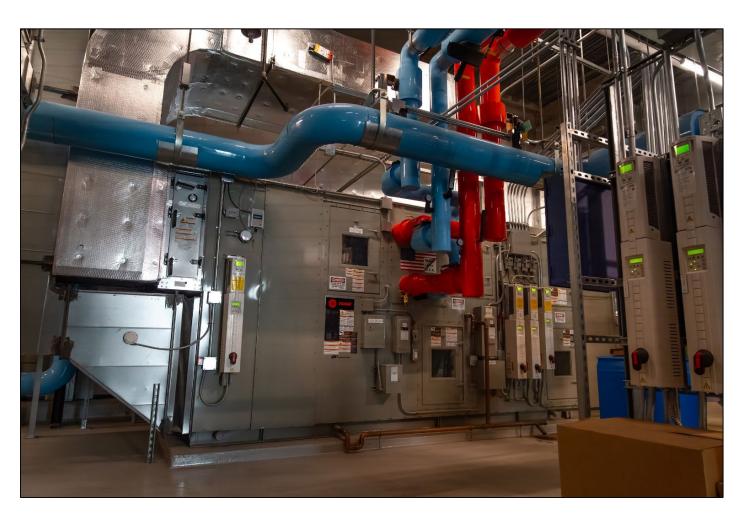








# Using IAQ data in BPS operations



- Monitor and make timely temperature and ventilation adjustments in classrooms. Identify and make repairs with existing HVAC systems.
- Monitor and respond to issues of concern like reentrainment of CO from co-gen, elevated PM from nearby construction or house fire, elevated CO2 due to poor ventilation.
- Make decisions about school and program closures during extreme heat and cold events.
- Update policies and practices within the BPS IAQ
   Management Plan and HVAC Maintenance Protocols.
- Enforce district anti-idling and green cleaner policies.
- Educate BPS community about IAQ in their schools.



# **BPS IAQ Monitoring System**



~4,500 IAQ sensors launched Fall 2021

= billions of data points















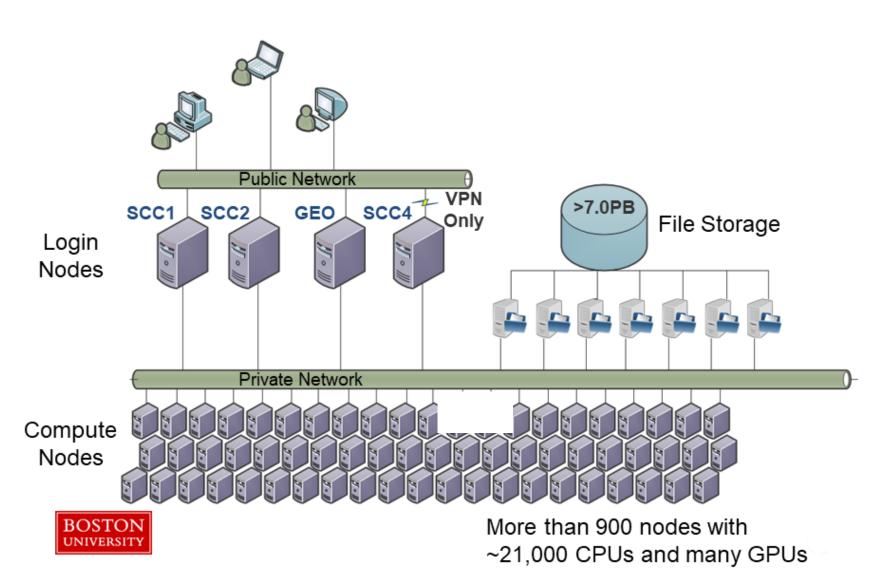
Indoor



Outdoor

# Storage and handling billions of data points

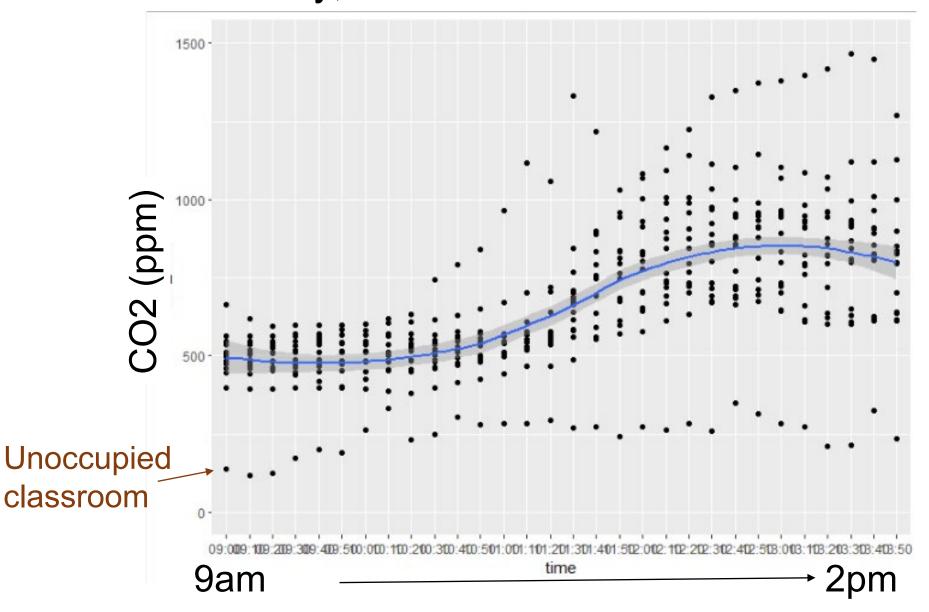
- Raw data
  - 1 minute capture
  - Calibrated
  - Year (08/202x-08/202x)
    - ~2.4 billion data points
    - ~1.2 million csv files
- Storage & processing
  - Amazon S3
  - BU's Shared Computing Cluster
- Flags
  - School, classroom/roof, level
  - Time stamps: weekday, school hours
  - Occupancy status
- Create analytical datasets



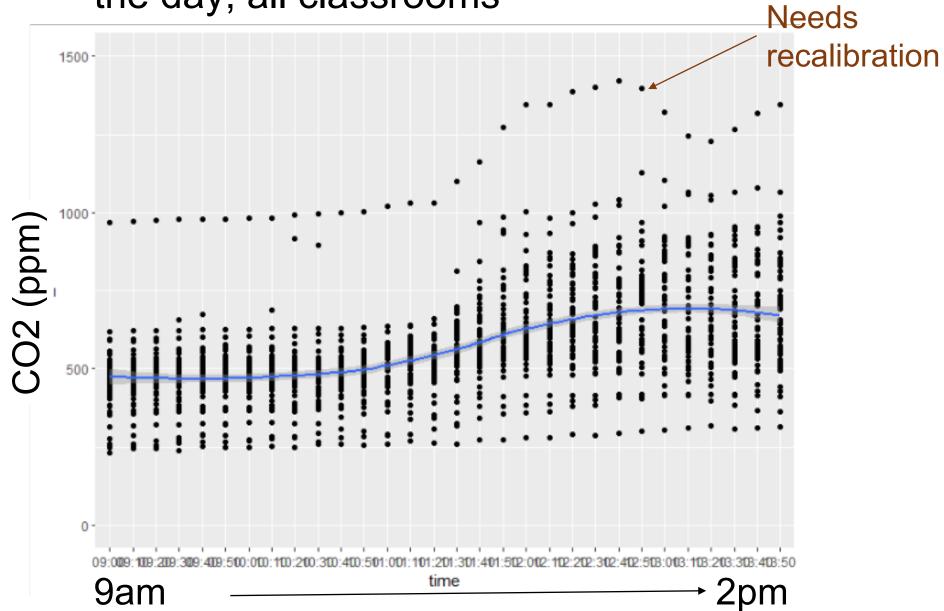
https://www.bu.edu/tech/files/2021/07/scclayout.png

### Quality control – is this real?

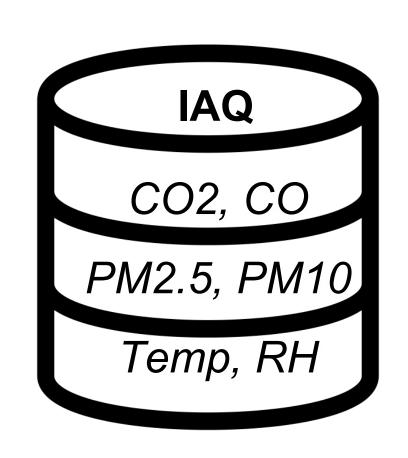
School A 4/13 Smooth of 10-min average CO<sub>2</sub> over the day, all classrooms



School B 4/13Smooth of 10-min average  $CO_2$  over the day, all classrooms



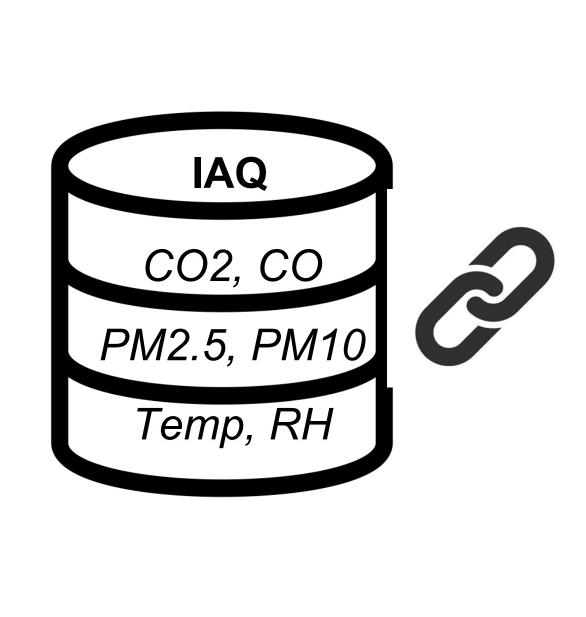
# It starts with IAQ data, plus quality control, plus linking more data



# It starts with IAQ data, plus quality control, plus linking more data

#### **Researcher tools:**

- Computing infrastructure
- Data science
- Geographic Information
   Systems (GIS)
- Environmental health
- Building science
- Statistics







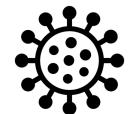
Meteorology



**HVAC** 



**Energy** 



**Covid interventions** 

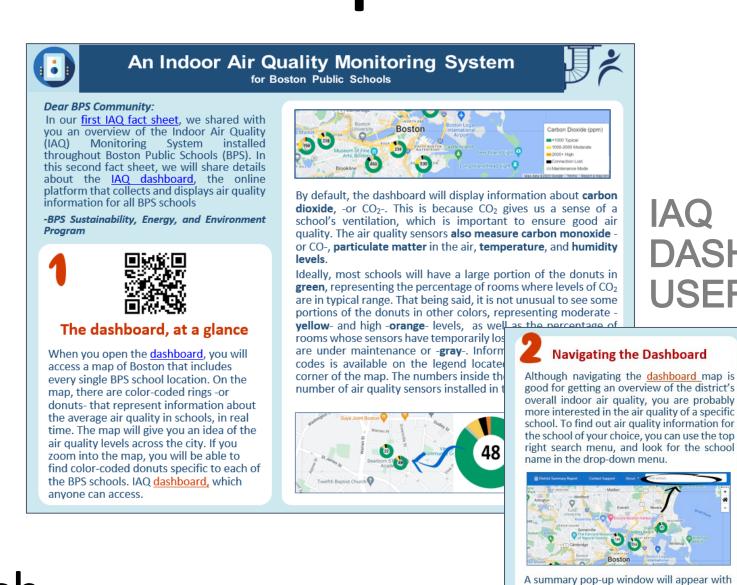


Neighborhood

- Air pollution
- Greenspace
- Demographics
  - ...

# Boston Public Schools – Boston University collaboration impacts

- Communications
- Workshops
- Presentations
- Grants
- Education
  - School operations
  - Environmental health
- IAQ analysis and research



IAQ DASHBOARD USER GUIDE

color-coded donuts that provide you with

information about average values for all the air quality parameters measured with the air

quality sensors for the whole school (see

"overview" screen capture below).

In the pop-up window from the screen capture, we can see how for this school, the donuts are mostly **green**, which means that for most of the rooms, air quality levels are typical. For some parameters, the donut may have a portion in **yellow**, or **orange** - indicating that some rooms have higher than typical levels-,or in **blue**, indicating that levels are lower than expected. It is normal that some rooms could be above or below typical thresholds temporarily, and BPS building management is monitoring these to make adjustments in the

Even if BPS is actively taking care of levels beyond thresholds, you may be curious to know which rooms are the ones that have higher than desired levels, or if these high levels lasted long, or if this happens frequently. To get that information, you can click on "Latest Sensor Results" within the popup menu, and you will see a spreadsheet with the latest readings from the sensors, for each of all the air quality parameters measured for every room in the school. The spreadsheet uses the same color codes as the donuts, so it is easy to visually spot any room that has parameters too high or too low. If interested, you can download this data to your device.

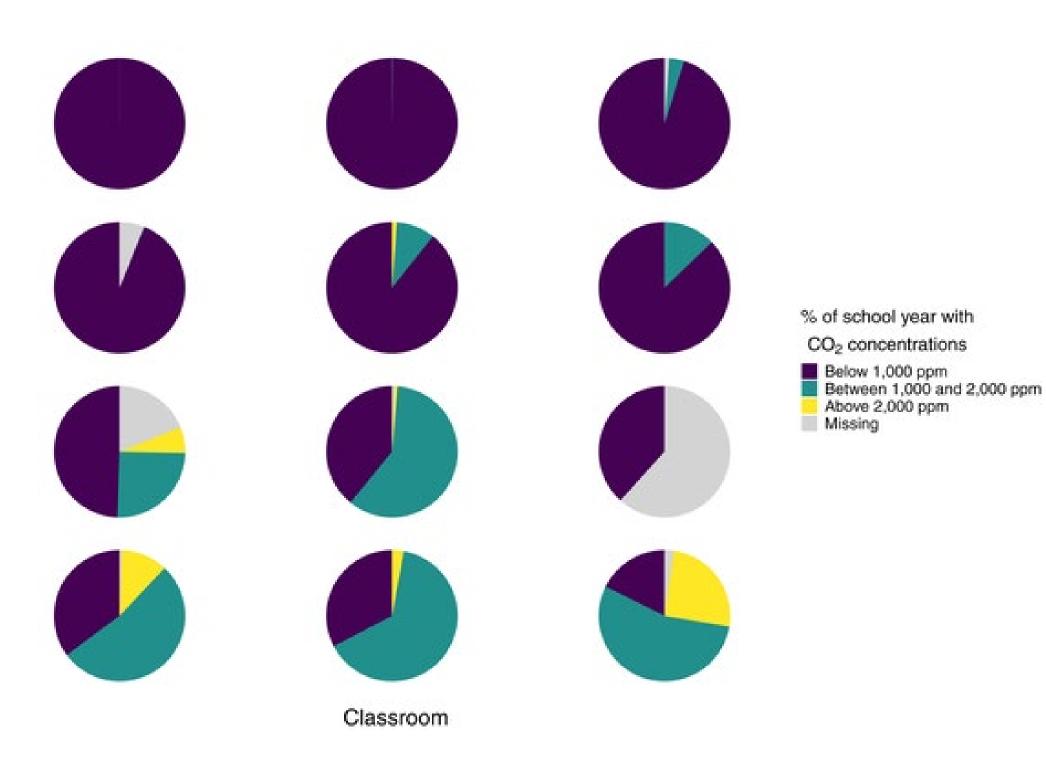
If you are interested into a longer period, you could click on "30 Day Report" and download that data as well. This is especially interesting if you want to see trends of any of these pollutants across the whole month.







# The value of installing IAQ sensors in every classroom - CO2

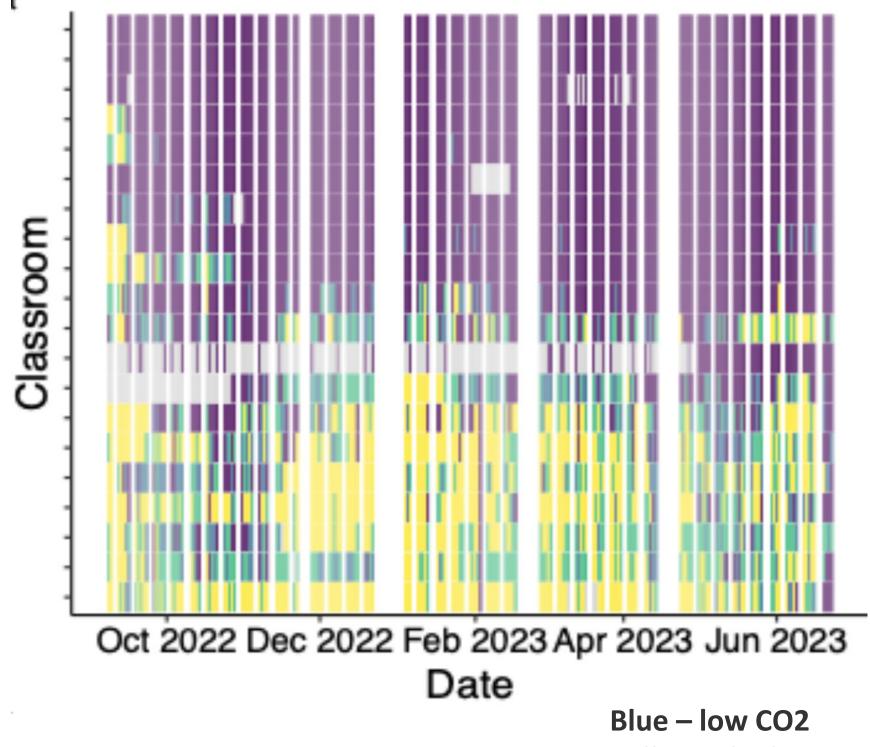


### **Key data takeaways:**

- •High CO2 variability at a classroom level within schools, across schools and over the school year (>1X)
- •Captured 98% of days per sensor over a school year (5%-100%)
- Processing of CO2 data enhances its value for decisions beyond real-time

- Prioritize classrooms and schools needing more ventilation
- Optimize building maintenance resources
- Create baseline metrics to evaluate interventions
- Identify seasonal or recurring patterns

# The value of installing IAQ sensors in every classroom - CO2



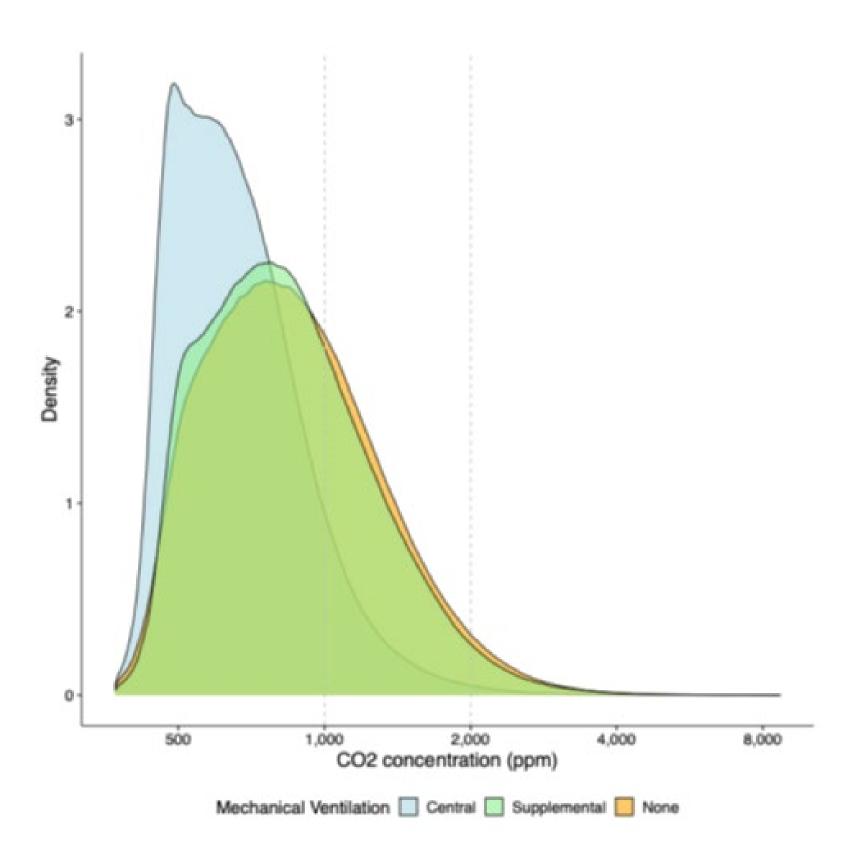
Blue – low CO2
Yellow – high CO2
Gray - missing
White - holiday

#### Key data takeaways:

- •High CO2 variability at a classroom level within schools, across schools and over teh school year (>1X)
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- Identify seasonal or recurring patterns

### Does ventilation reduce CO2 in classrooms?



### **Key data takeaways:**

- Lower CO2 in schools with mechanical vs natural ventilation (930 ppm vs 698 ppm on average)
- CO2 elevated at times in all schools
- Demand-control ventilation (DCV) most effective system (99% of CO2 measurements <1000 ppm)</li>

- Advocate for system upgrades
- Optimize HVAC system maintenance
- Identify schools to connect to building management systems (BMS)
- Improve vendor accountability

## How many IAQ sensors does a school need?

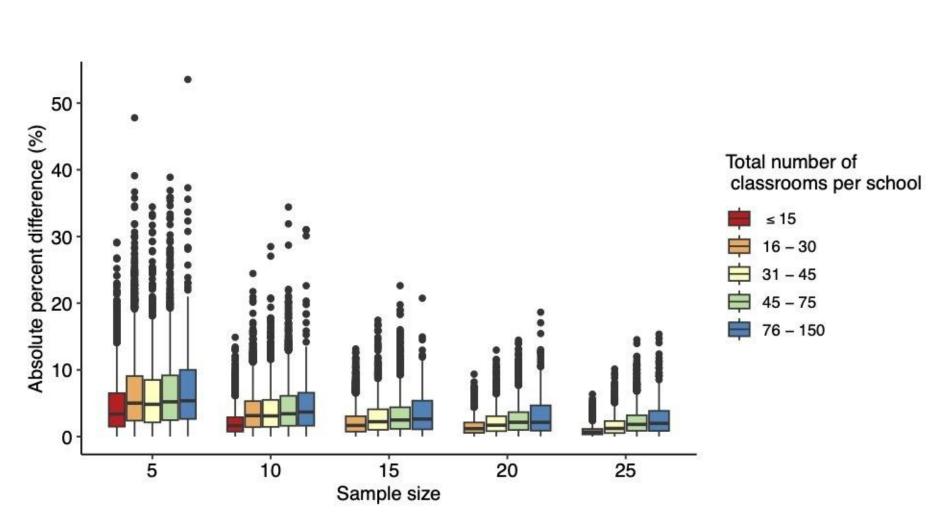


Figure S4. Box plots showing the absolute percent difference between the classroom sensor sample mean and the school building mean for different sizes of sensor samples, stratified by building size.

### **Key takeaway:**

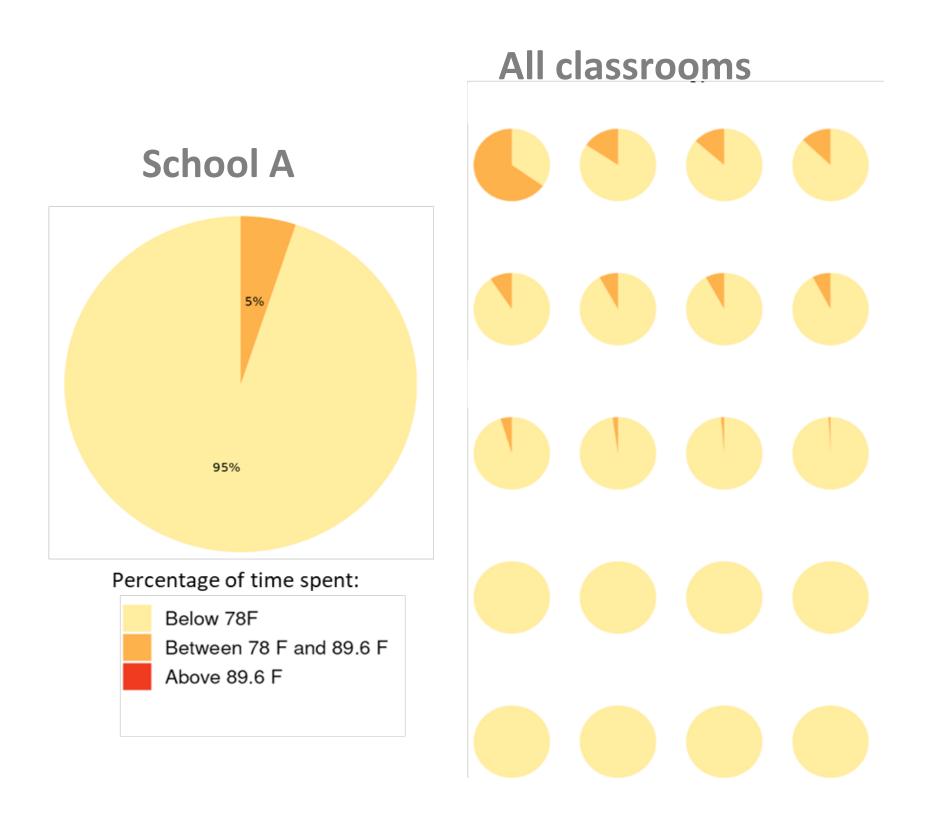
The larger the school the more sensors are needed

- •>5 for schools with ≤15 classrooms
- •15 for schools with 16–30 classrooms
- •20 for schools with 31–45 classrooms
- •25 for schools with 46–75 classrooms
- •>25 for schools with 76-150 classrooms

### **Utility:**

•Capture the IAQ landscape of a school with limited budget

# The value of installing IAQ sensors in every classroom - heat

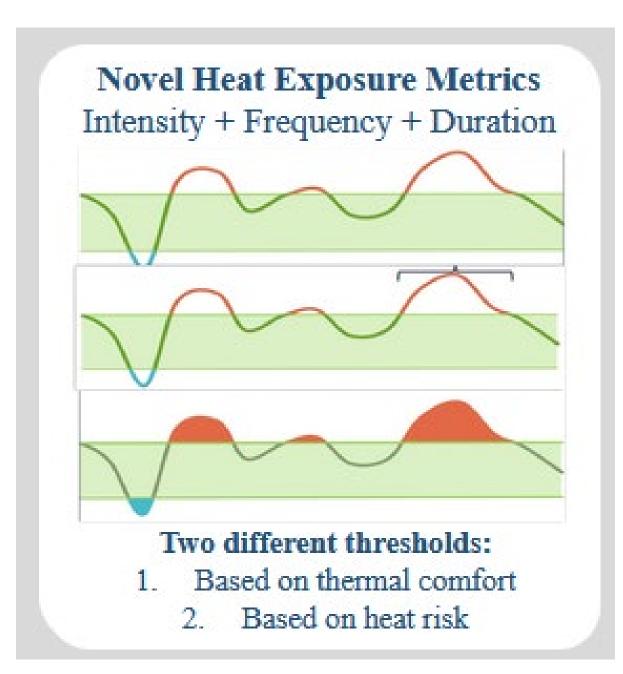


#### **Key takeaways:**

- Temperature variability between classrooms in the same building:
  - 2.3°C (3.6F) on average
  - 14.4°C (>20F) max difference in buildings without mechanical cooling
  - 6°C cooler at ground level compared to upper level in buildings without mechanical cooling
- Central and window AC maintained comfortable temperatures compared to buildings without mechanical cooling.
- Novel temperature metrics captured heat frequency, intensity and length - different from maximum temperature

- Identify cooling needs and prioritize investments
- Inform heat action plans
- Evaluate interventions
- Identify seasonal or recurring patterns
- Justify mechanical cooling investments in Northeast US

# Rethinking Heat Exposure In Classrooms Through Continuous Monitoring: Novel Metrics For Schools



Botana Martinez et al (2025), Indoor Environments, in press

### Some findings:

- Access to mechanical cooling critical in Northeast
- Central AC most effective but window AC also works (most of the time)
- On a hot day, classrooms on the ground floor were ~6°C cooler in schools without AC



Boston University Sustainable Built Environment Lab

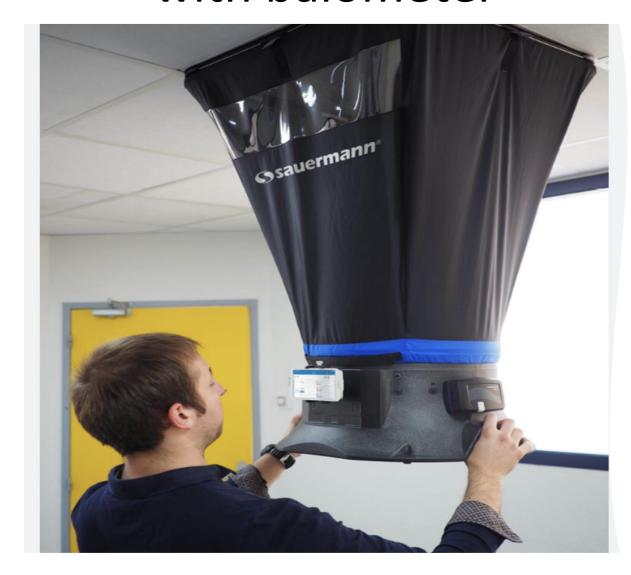
# Predicting mold growth with temperature and relative humidity



- Monitor classrooms during periods of school shut down (i.e., summer)
- Direct resources to prevent larger problems

# New methods to measure ventilation using CO2

Old method - spot check with balometer



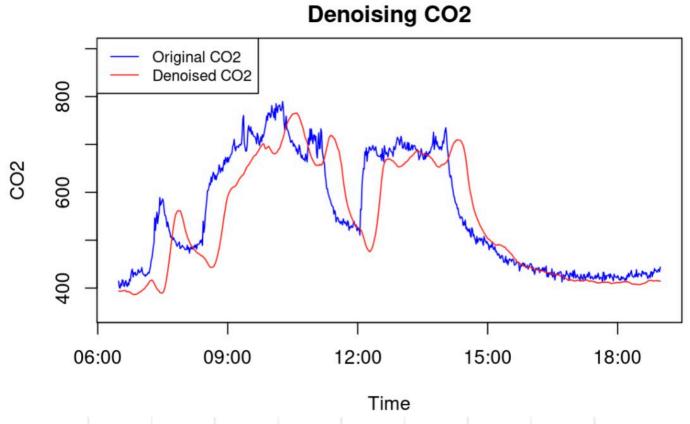
New method - daily AER estimate with IAQ sensors + machine learning

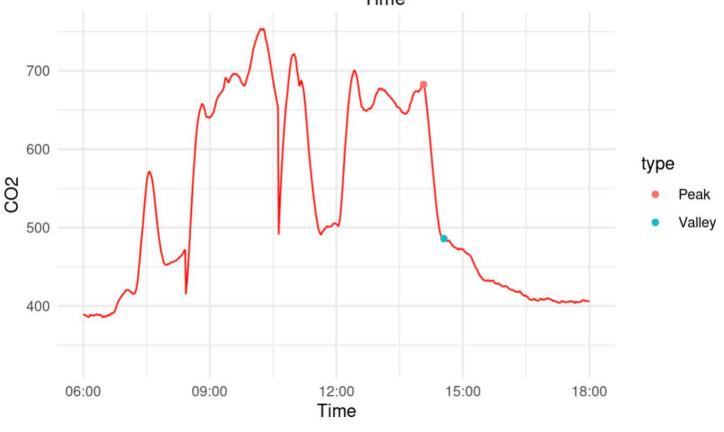


https://www.bu.edu/sph/news/articles/2025/fresher-air-smarter-schools-sph-researchers-share-novel-method-for-monitoring-indoor-air-quality/

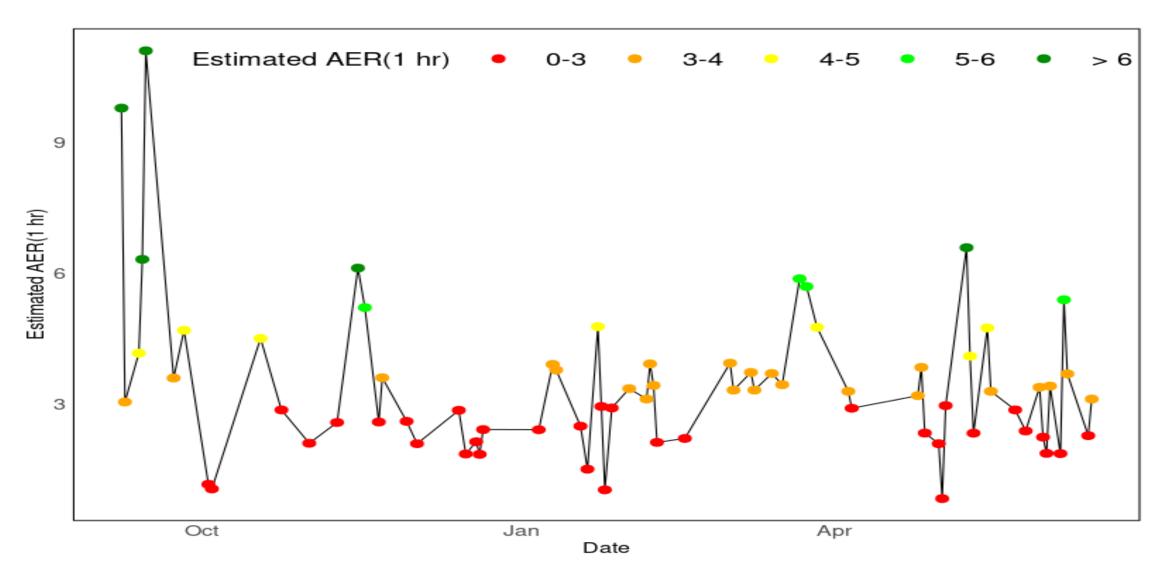
### Methods

- Data: 1-minute CO2 recordings over one school year
- Step 1: Smoothing the CO2 curve (i.e. denoising) to better track changes
- Step 2: Identify a peak and valley between 1 and 6 pm
- Step 3: Calculate air exchange rate every day over a school year
- Step 4: evaluate and validate



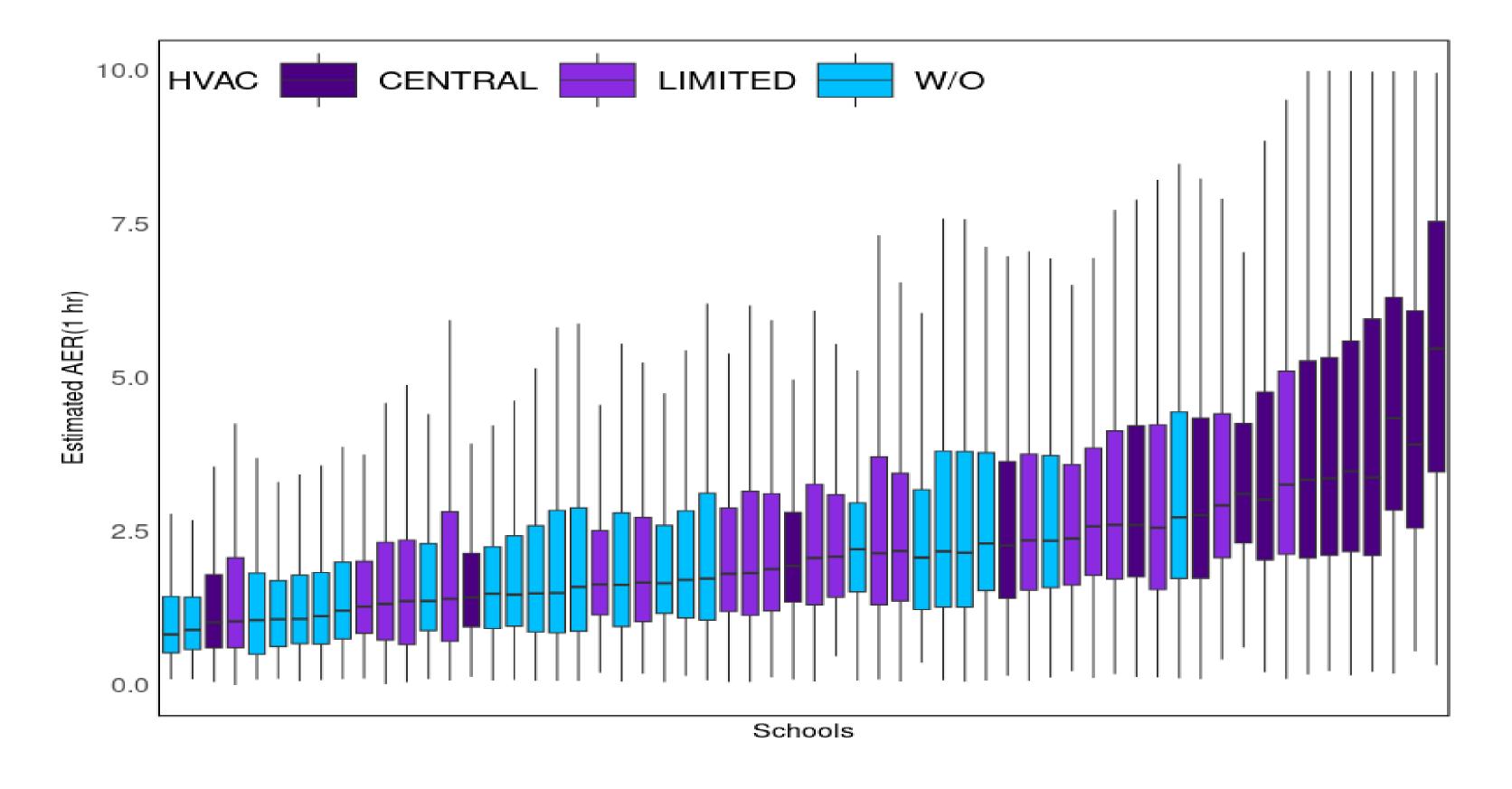


# Results: Example of calculated AER over a school year for a random classroom (n= 72 curves).



- ~163 CO<sub>2</sub> preliminary decay curves identified per classroom over 181 school days.
- ~84 final curves included after applying review criteria (15-minute and 200 ppm CO<sub>2</sub> concentration drop criteria)
- Average school district AER was  $3.0 h^{-1}$  (SD = 2.9), ranging from < $0.1 to 64 h^{-1}$ .

Results: Calculated air exchange rate (AER) distribution by mechanical ventilation types for 60 random schools throughout the school year. y-axis maximum limited to 10 1/h.



# Key takeaways about comprehensive IAQ monitoring in schools

- Pinpoint specific times, days and locations where there are problems
- Prioritize and optimize resources to improve IAQ
- Inform Action Plans (e.g., heat, mold, wildfire smoke, air pollution, IAQ management)
- Generate local data, sometimes necessary to drive action and investment
- Limitation needs technical resources to maximize utility
   (e.g., data science, environmental health, computing, statistics)
  - One solution: school-researcher partnerships





- Pilar Botana
- Beverly Ge
- Jinho Lee
- Yirong Yuan
- Priam Vyas
- Masanao Yajima
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- Muskaan Khemani
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of Health

# Questions?





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https://sites.bu.edu/fabian/research/

