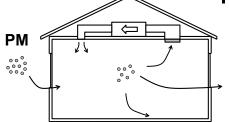
# Outdoor-to-Indoor Transport Mechanisms and Particle Penetration for Fine Particulate Matter

### **Brent Stephens, PhD**

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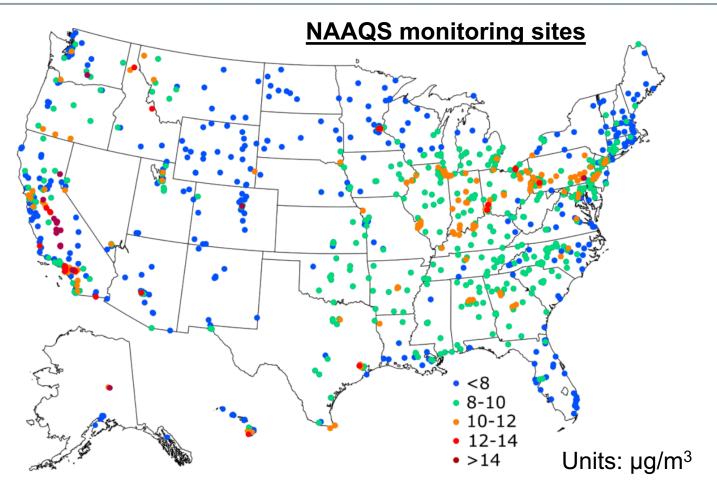
# The Built Environment Research Group

advancing energy, environmental, and sustainability research within the built environment at Illinois Institute of Technology



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### Outdoor $PM_{2.5}$ monitoring stations in the U.S.



avg = average;  $PM_{2.5}$  = particulate matter with a nominal mean aerodynamic diameter less than or equal to 2.5 µm. Source: U.S. EPA analysis of Air Quality System network data 2013–2015, prepared in 2016.

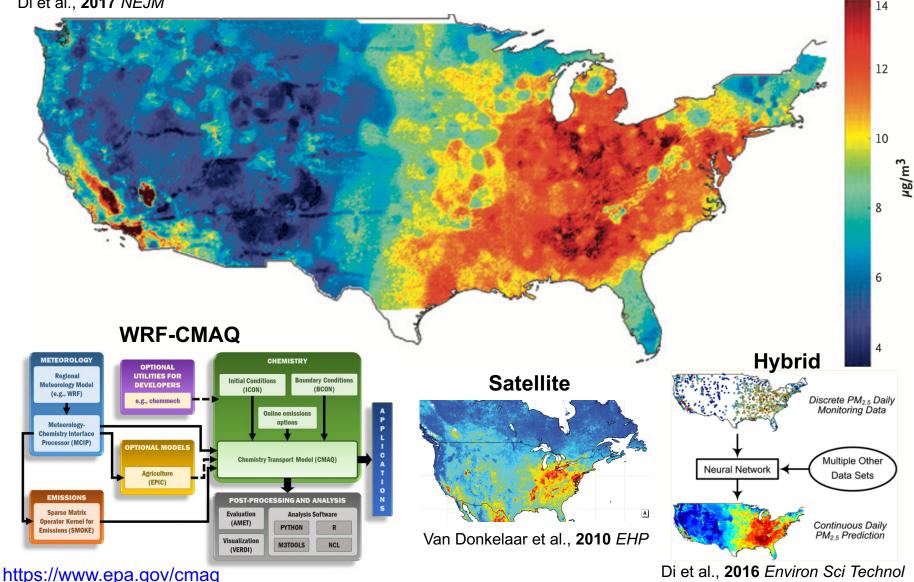
#### Figure 2-13 Three-year avg PM<sub>2.5</sub> concentrations 2013–2015.

2019 EPA Integrated Science Assessment on PM

https://www.epa.gov/isa/integrated-science-assessment-isa-particulate-matter

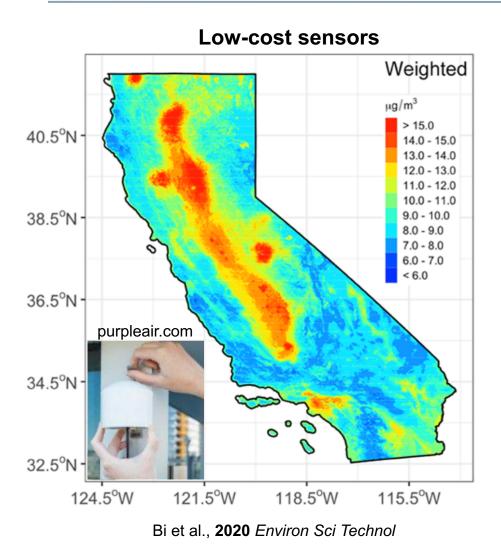
### Modeling & remote sensing fill regional PM<sub>2.5</sub> gaps

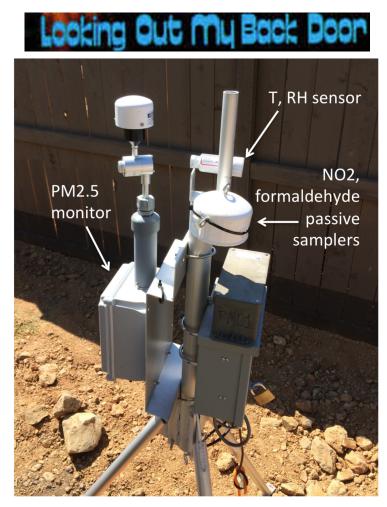
Di et al., 2017 NEJM



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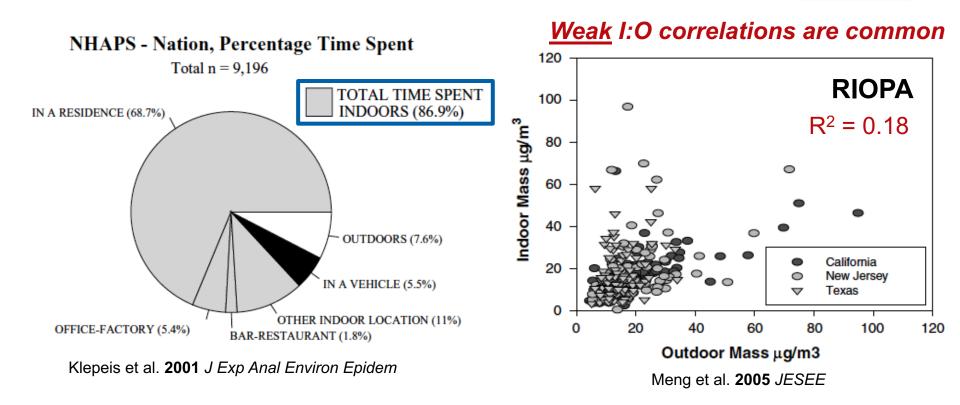
### Modeling & local measurements fill local PM<sub>2.5</sub> gaps





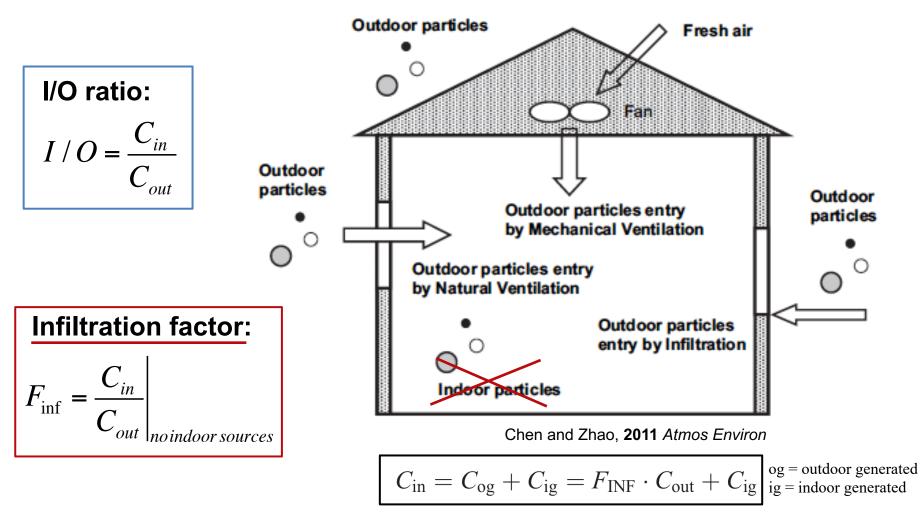
Chan et al., 2020 CEC-500-2020-023

### Weak correlations between indoor and outdoor PM<sub>2.5</sub>



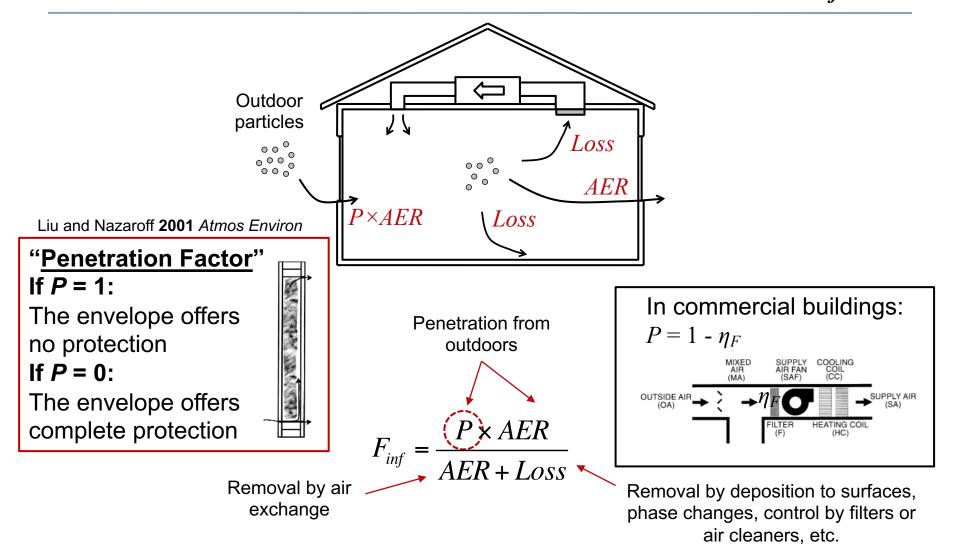
Nearly all outdoor air pollution epidemiology studies don't account for an important point... We spend most of our time indoors! Which leads to 'exposure misclassification'

### Indoor sources of outdoor PM and key definitions



See presentation from 2016 NAS Workshop on Indoor PM: http://built-envi.com/wp-content/uploads/stephens-IOM-presentation-feb-2016.pdf

### Underlying mechanisms that govern $F_{inf}$



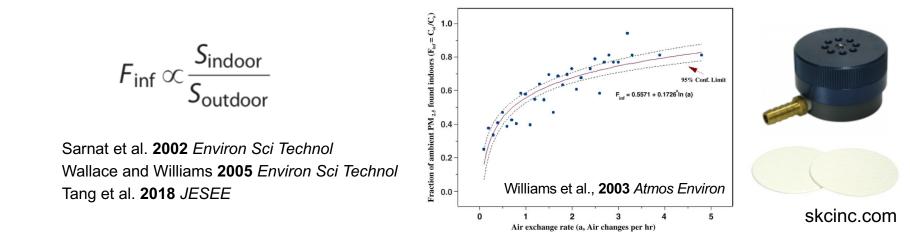
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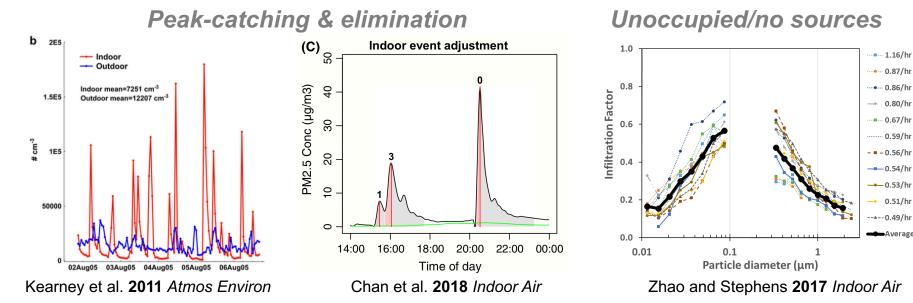
# **INFILTRATION FACTORS**

### Methods to measure PM <u>infiltration factors</u> ( $F_{inf}$ )

#### Chemical surrogate (e.g., sulfur/sulfate) of gravimetric PM samples

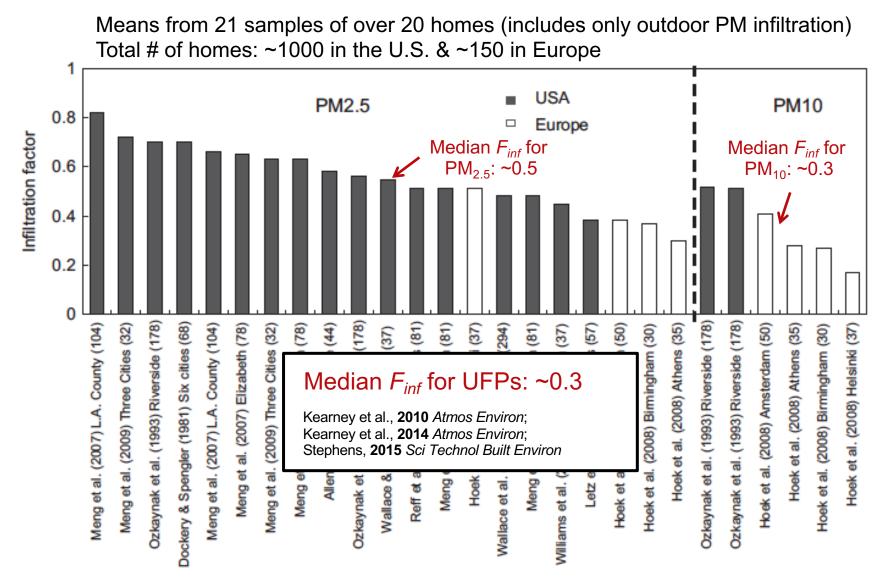


#### Time-resolved monitoring and data processing



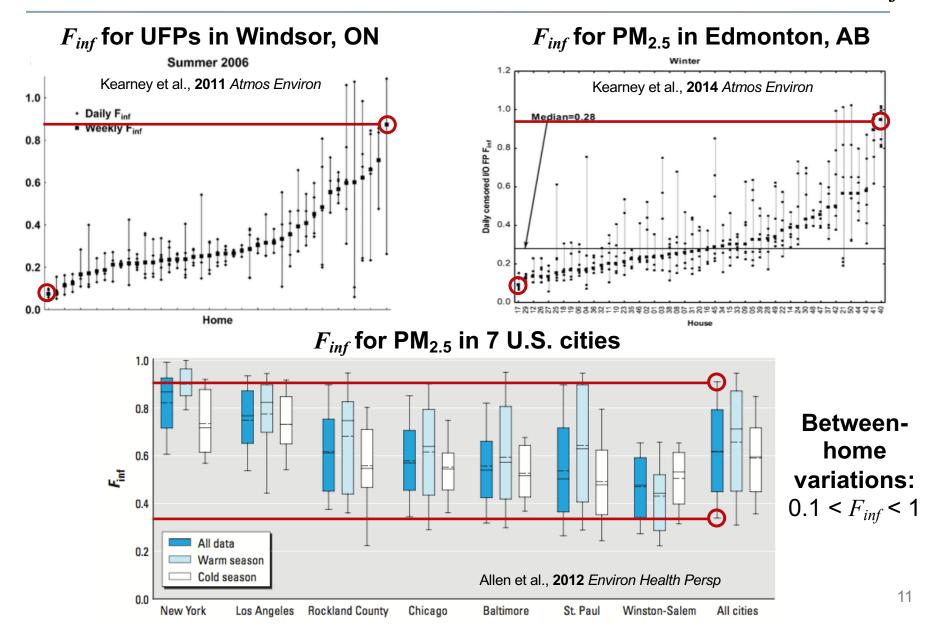
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### Large surveys of PM infiltration factors $(F_{inf})$



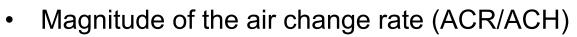
Chen and Zhao, 2011 Atmos Environ; also Diapouli et al. 2013 JAWMA

### <u>Between-home variability</u> in infiltration factors ( $F_{inf}$ )

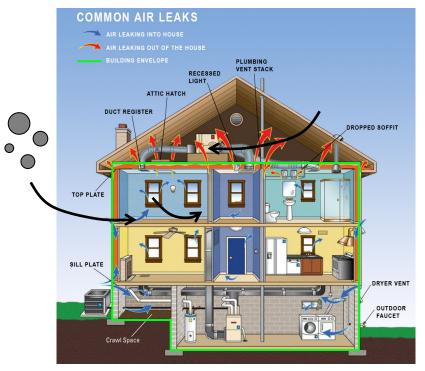


# Key drivers of variability in infiltration factors

- Pollutant characteristics
  - Sizes/classes/components of PM
- Source of ventilation air
  - Infiltration (envelope leaks)
  - Mechanical ventilation
  - Natural ventilation (open windows)
- Human behaviors
  - Window opening frequencies
  - Portable air cleaners



- Meteorological driving forces (e.g., I/O temperatures, wind speed/direction)
- Building envelope characteristics (e.g., airtightness)
- HVAC system runtime and filtration efficiency



# **PENETRATION FACTORS**

### Methods to indirectly measure penetration factors (P)

- Accuracy challenges w/ integrated gravimetric  $PM_{2.5}$  samples
  - Usually estimated via regression analysis across homes

					mong	
State	N	Boundary condition <sup>a</sup>	Р	95% CI of P	$k (h^{-1})$	95% CI of $k$ (h <sup>-1</sup> )
Overall	268	Y N	0.91 0.91	(0.71, 1.12) (0.71, 1.12)	0.79 0.79	(0.18, 1.41) (0.18, 1.41)
California	112	Y N	1.00 1.04	(1.00, 1.00) (0.75, 1.33)	0.90 0.98	(0.53, 1.28) (0.28, 1.69)
New Jersey	80	Y N	0.73 0.73	(0.42, 1.05) (0.42, 1.05)	0.46 0.46	(-0.44, 1.36) (-0.44, 1.36)
Texas	76	Y N	1.00 1.35	(1.00, 1.00) (0.46, 2.23)	0.99 1.18	(-1.38, 3.35) (-1.57, 3.92)

Table 3. Parameter estimation by NLIN regression.

Meng et al. 2005 JESEE

<sup>a</sup>means parameters are estimated with boundary condition  $P \in [0,1]$ ; N means no boundary conditions for parameter estimation.

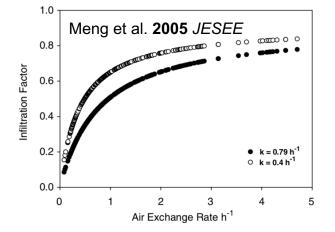
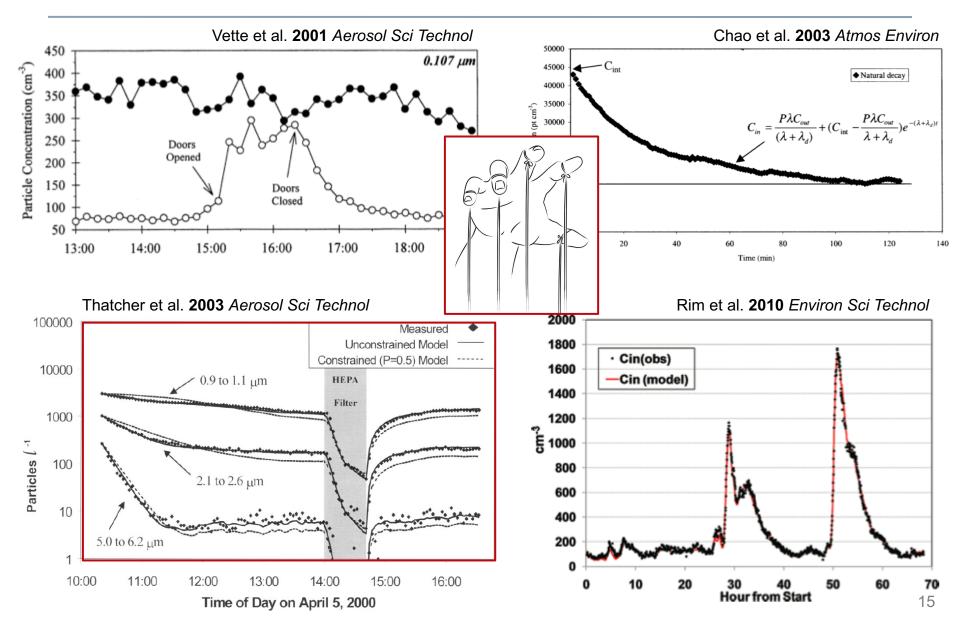


Table 7 Calculating	<i>P</i> 's and	1 <i>k</i> 's fo	r PM <sub>2.5</sub>	using n	nixed model	slopes
Variable	Min	Max	Mean	Std	PTEAM <sup>a</sup>	Seattle <sup>b</sup>
AER $(h^{-1})$	0.14	4.84	0.72	0.63	0.97	0.59
Р	0.11	1.00	0.72	0.21	1.00	0.97
$k (h^{-1})$	0.10	0.80	0.42	0.19	0.39	0.15
$F_{ m inf}$	0.05	0.94	0.45	0.21	0.71	0.78

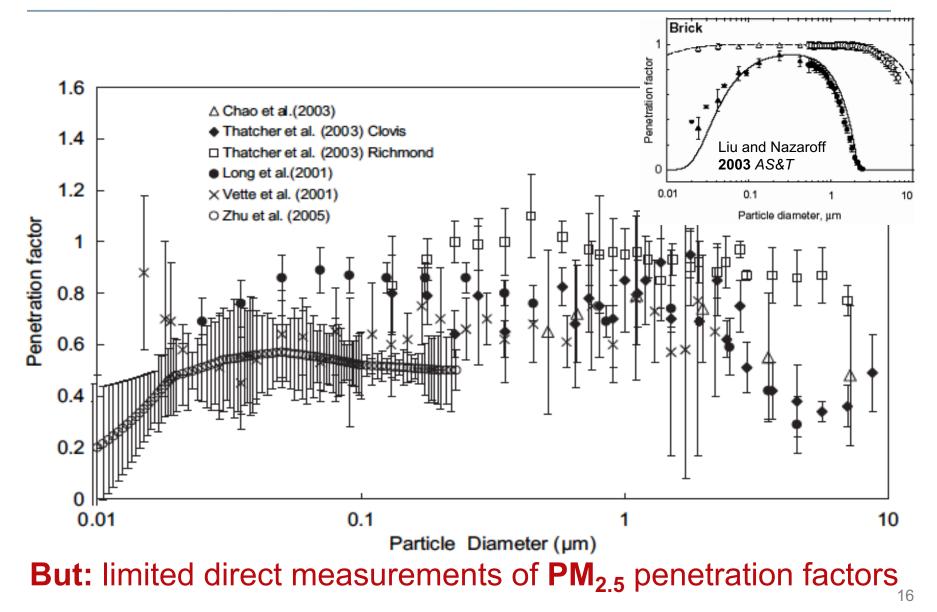
#### Williams et al. 2003 Atmos Environ

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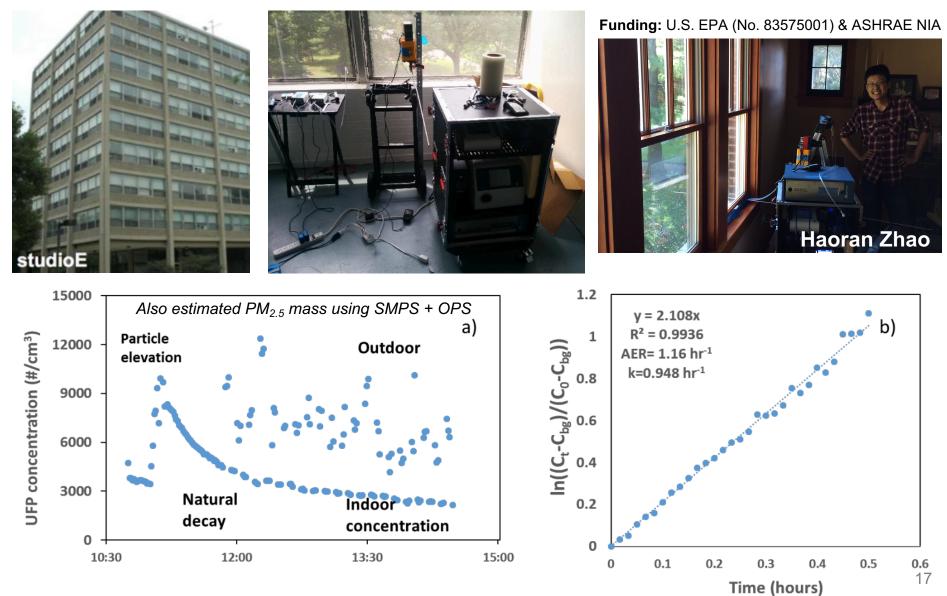
### Methods to directly measure penetration factors (P)



### Summary of size-resolved penetration factors (P)

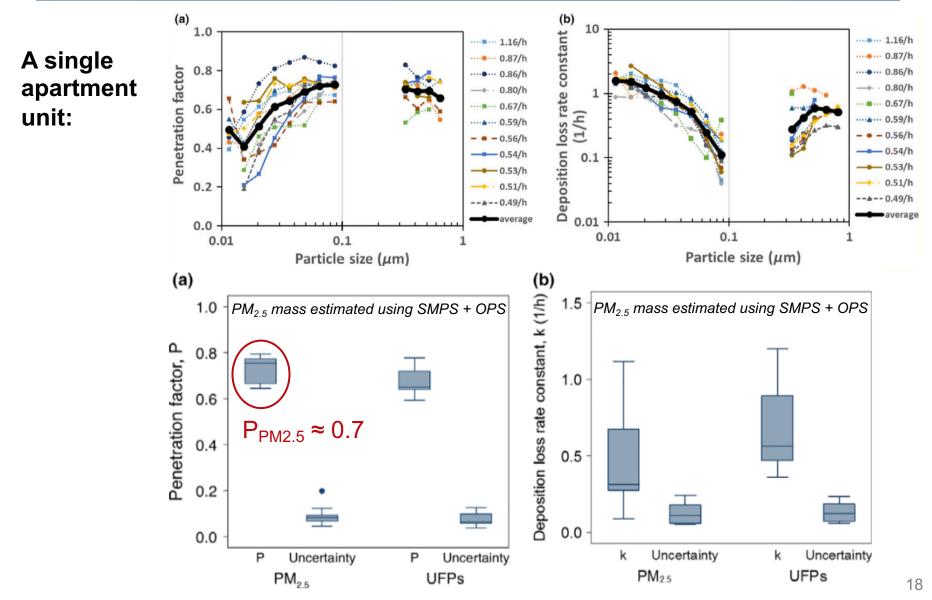


### **Direct** measurements of penetration factors (P)



Zhao and Stephens 2017 Indoor Air

### **PM<sub>2.5</sub>** penetration factors (*P*) from size-resolved data

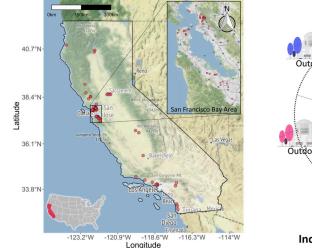


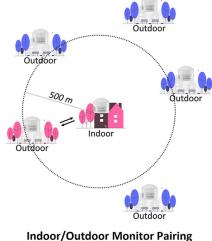
Zhao and Stephens 2017 Indoor Air

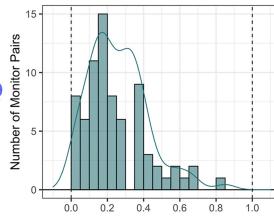
Funding: U.S. EPA (No. 83575001) & ASHRAE NIA

# **NEW DIRECTIONS**

#### Estimating $F_{inf}$ with low-cost sensor networks







Bi et al. 2021 Environmental Pollution

#### purpleair.com



Distribution of Estimated Infiltration Factors

#### Modeling *F<sub>inf</sub>* with building characteristics and other predictors

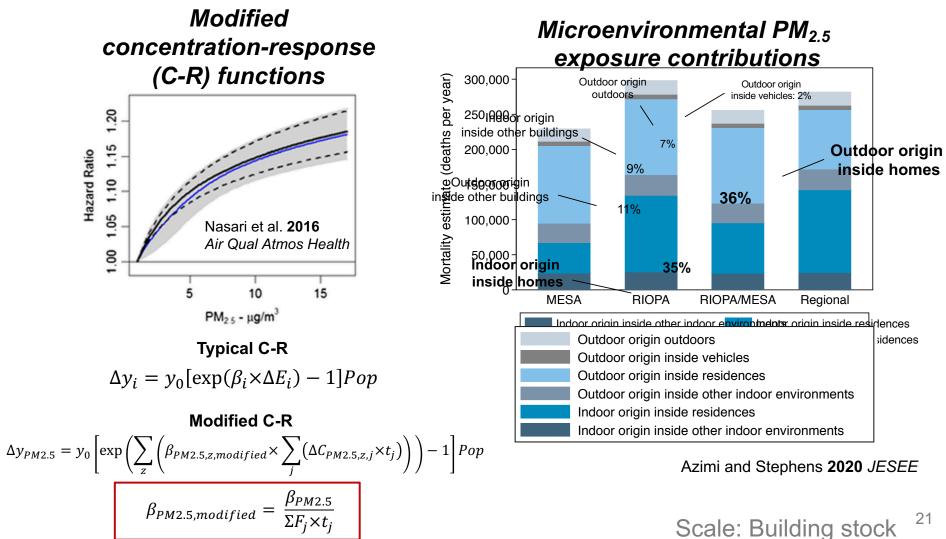
	Current study	Allen et al. <sup>37</sup>	Baster et al. <sup>27</sup>	Wallace and Williams <sup>6</sup>
Study area	102 homes	353 homes	39 homes	37 homes
-	Boston	7 cities across US	Boston	North Carolina
Infiltration proxy	Sulfur	Sulfur	GIS and housing characters	Sulfur
Model technique	Mixed-effects model	Multivariable regression	Bayesian model	Multivariable regressior
Predictive power infiltration proxy	$CV R^2 = 89.3\%$	$CV R^2 = 30 - 60\%$		
Predictive power on PM <sub>2.5</sub>	$CV R^2 = 79.1\%$	_	$CV R^2 = 0.37$	$R^2 = 0.74$

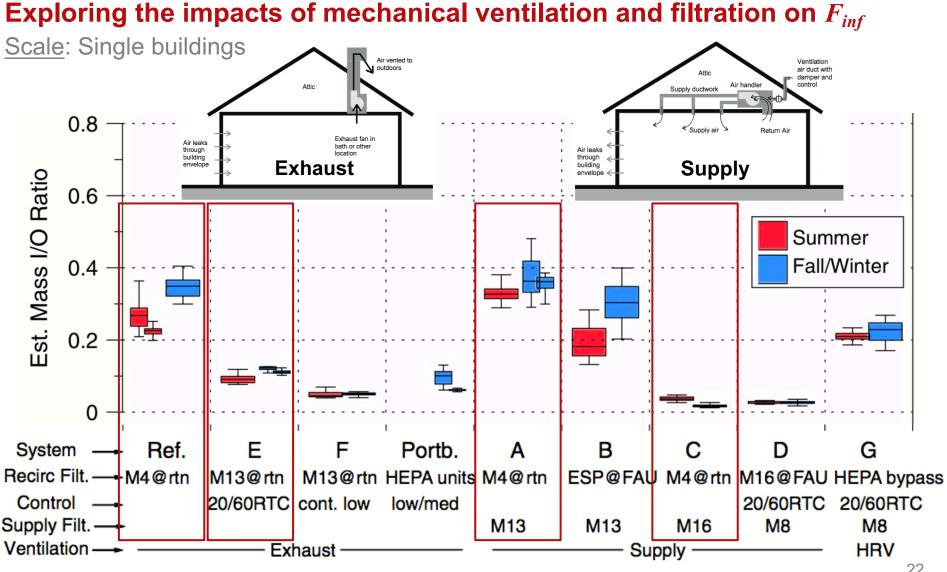
Tang et al., **2018** JESEE

#### Scale: Building stock <sup>20</sup>

#### Integrating *F<sub>inf</sub>* in exposure assessment & environmental epidemiology

Funding: U.S. EPA (via SCG)





Unoccupied test house

Singer et al. 2017 Indoor Air

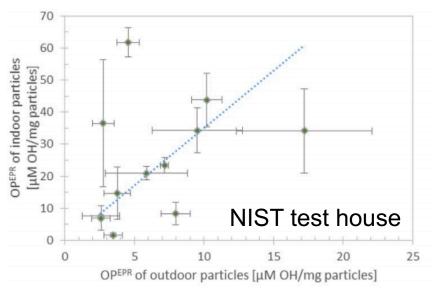
# New directions in assessing $F_{inf}$ and P for $PM_{2.5}$

#### Health-relevant metrics (e.g., oxidative potential) of indoor-infiltrated PM<sub>2.5</sub>

Oxidative potential (OP) of indoor PM in an unoccupied test house:

- Generate reactive oxygen species (ROS)
- EPR spectroscopy
- Mass-normalized OP<sup>EPR</sup> higher indoors than outdoors

Khurshid et al. 2019 Building and Environment

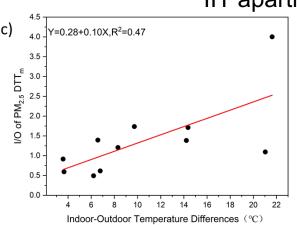


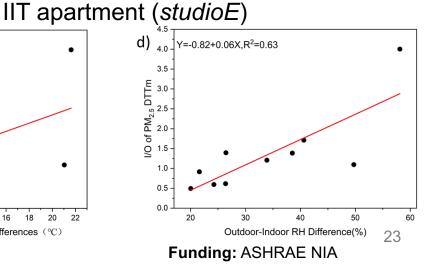
Oxidative potential of indoor <sub>c)</sub> PM of outdoor origin in an unoccupied apartment unit:

- Dithiothreitol (DTT) assay
- Mass-normalized DTT higher indoors than outdoors

Zeng et al. 2021 under review

Scale: Single buildings





### Ongoing research needs

- Integrate indoor exposure attributions to ambient PM epidemiology investigations
  - Address exposure misclassification

- Chen et al. **2012** *Epidemiology* Hodas et al. **2013** *JESEE* Sarnat et al. **2013** *JESEE*
- Improve accuracy of health effect estimates
- Differential toxicity of PM of indoor/outdoor origin

Ebelt et al. 2005 Epidemiology; Koenig et al. 2005 EHP; Long et al. 2001 EHP; Monn and Becker 1999 Tox Appl Pharm

- Direct measurements of  $F_{inf}$  possible, but expensive at scale
  - Typically limited to samples of convenience
  - Potential to leverage advances in low-cost sensors
- Direct measurements of *P* remain very limited
  - Increase sample sizes, incorporate PM chemical composition
  - Standardize approaches, explore influencing factors

### **References Cited**

- Allen, R.W., Adar, S.D., Avol, E., Cohen, M., Curl, C.L., Larson, T., Liu, L.-J.S., Sheppard, L., Kaufman, J.D., 2012. Modeling the residential infiltration of outdoor PM2.5 in the Multi-Ethnic Study of Atherosclerosis and Air Pollution (MESA Air). Environmental Health Perspectives 120, 824–830. https://doi.org/10.1289/ehp.1104447
- Azimi, P., Stephens, B., 2020. A framework for estimating the US mortality burden of fine particulate matter exposure attributable to indoor and outdoor microenvironments. J Expo Sci Environ Epidemiol 30, 271–284. https://doi.org/10.1038/s41370-018-0103-4
- Bi, J., Wallace, L.A., Sarnat, J.A., Liu, Y., 2021. Characterizing outdoor infiltration and indoor contribution of PM2.5 with citizen-based low-cost monitoring data. Environmental Pollution 276, 116763. https://doi.org/10.1016/j.envpol.2021.116763
- Bi, J., Wildani, A., Chang, H.H., Liu, Y., 2020. Incorporating Low-Cost Sensor Measurements into High-Resolution PM <sub>2.5</sub> Modeling at a Large Spatial Scale. Environ. Sci. Technol. 54, 2152–2162. https://doi.org/10.1021/acs.est.9b06046
- Chan, W.R., Kim, Y.-S., Less, B.D., Singer, B.C., Walker, I.S., 2020. Ventilation and Air Quality in New California Homes with Gas Appliances and Mechanical Ventilation (No. CEC-500-2020-023). California Energy Commission.
- Chan, W.R., Logue, J.M., Wu, X., Klepeis, N.E., Fisk, W.J., Noris, F., Singer, B.C., 2017. Quantifying fine particle emission events from time-resolved measurements: Method description and application to 18 California low-income apartments. Indoor Air. https://doi.org/10.1111/ina.12425
- Chao, C.Y.H., Wan, M.P., Cheng, E.C.K., 2003. Penetration coefficient and deposition rate as a function of particle size in non-smoking naturally ventilated residences. Atmos. Environ. 37, 4233–4241. https://doi.org/10.1016/S1352-2310(03)00560-0
- Chen, C., Zhao, B., 2011. Review of relationship between indoor and outdoor particles: I/O ratio, infiltration factor and penetration factor. Atmos. Environ. 45, 275–288. https://doi.org/10.1016/j.atmosenv.2010.09.048
- Chen, C., Zhao, B., Weschler, C.J., 2012. Indoor exposure to "outdoor PM10." Epidemiology 23, 870–878. https://doi.org/10.1097/EDE.0b013e31826b800e
- Di, Q., Amini, H., Shi, L., Kloog, I., Silvern, R., Kelly, J., Sabath, M.B., Choirat, C., Koutrakis, P., Lyapustin, A., Wang, Y., Mickley, L.J., Schwartz, J., 2019. An ensemblebased model of PM2.5 concentration across the contiguous United States with high spatiotemporal resolution. Environment International 130, 104909. https://doi.org/10.1016/j.envint.2019.104909
- Di, Q., Kloog, I., Koutrakis, P., Lyapustin, A., Wang, Y., Schwartz, J., 2016. Assessing PM 2.5 Exposures with High Spatiotemporal Resolution across the Continental United States. Environ. Sci. Technol. 50, 4712–4721. https://doi.org/10.1021/acs.est.5b06121
- Di, Q., Wang, Yan, Zanobetti, A., Wang, Yun, Koutrakis, P., Choirat, C., Dominici, F., Schwartz, J.D., 2017. Air Pollution and Mortality in the Medicare Population. New England Journal of Medicine 376, 2513–2522. https://doi.org/10.1056/NEJMoa1702747
- Diapouli, E., Chaloulakou, A., Koutrakis, P., 2013. Estimating the Concentration of indoor particles of outdoor origin: A review. Journal of the Air & Waste Management Association 130422132846001. https://doi.org/10.1080/10962247.2013.791649
- Ebelt, S.T., Wilson, W.E., Brauer, M., 2005. Exposure to ambient and nonambient components of particulate matter: a comparison of health effects. Epidemiology 16, 396–405.
- El Orch, Z., Stephens, B., Waring, M.S., 2014. Predictions and determinants of size-resolved particle infiltration factors in single-family homes in the U.S. Build. Environ. 74, 106–118. https://doi.org/10.1016/j.buildenv.2014.01.006
- Hodas, N., Turpin, B.J., Lunden, M.M., Baxter, L.K., Özkaynak, H., Burke, J., Ohman-Strickland, P., Thevenet-Morrison, K., Kostis, J.B., Rich, D.Q., 2013. Refined ambient PM2.5 exposure surrogates and the risk of myocardial infarction. Journal of Exposure Science and Environmental Epidemiology 23, 573–580. https://doi.org/10.1038/jes.2013.24
- Kearney, J., Wallace, L., MacNeill, M., Héroux, M.-E., Kindzierski, W., Wheeler, A., 2014. Residential infiltration of fine and ultrafine particles in Edmonton. Atmospheric Environment 94, 793–805. https://doi.org/10.1016/j.atmosenv.2014.05.020
- Kearney, J., Wallace, L., MacNeill, M., Xu, X., VanRyswyk, K., You, H., Kulka, R., Wheeler, A.J., 2011. Residential indoor and outdoor ultrafine particles in Windsor, Ontario. Atmos. Environ. 45, 7583–7593. https://doi.org/10.1016/j.atmosenv.2010.11.002
- Khurshid, S.S., Emmerich, S., Persily, A., 2019. Oxidative potential of particles at a research house: Influencing factors and comparison with outdoor particles. Building and Environment 106275. https://doi.org/10.1016/j.buildenv.2019.106275
- Klepeis, N.E., Nelson, W.C., Ott, W.R., Robinson, J.P., Tsang, A.M., Switzer, P., Behar, J.V., Hern, S.C., Engelmann, W.H., 2001. The National Human Activity Pattern Survey (NHAPS): a resource for assessing exposure to environmental pollutants. J Expo Anal Environ Epidemiol 11, 231–252. https://doi.org/10.1038/sj.jea.7500165

### **References Cited**

Koenig, J.Q., Mar, T.F., Allen, R.W., Jansen, K., Lumley, T., Sullivan, J.H., Trenga, C.A., Larson, T.V., Liu, L.-J.S., 2005. Pulmonary effects of indoor- and outdoorgenerated particles in children with asthma. Environ Health Persp 113, 499–503. https://doi.org/10.1289/ehp.7511

Liu, D., Nazaroff, W.W., 2001. Modeling pollutant penetration across building envelopes. Atmos. Environ. 35, 4451–4462. https://doi.org/10.1016/S1352-2310(01)00218-7

Liu, D.-L., Nazaroff, W.W., 2003. Particle penetration through building cracks. Aerosol Sci. Technol. 37, 565–573. https://doi.org/10.1080/02786820300927

- Long, C.M., Suh, H.H., Kobzik, L., Catalano, P.J., Ning, Y.Y., Koutrakis, P., 2001. A pilot investigation of the relative toxicity of indoor and outdoor fine particles: in vitro effects of endotoxin and other particulate properties. Environ. Health Perspect. 109, 1019–1026.
- MacNeill, M., Kearney, J., Wallace, L., Gibson, M., Héroux, M.E., Kuchta, J., Guernsey, J.R., Wheeler, A.J., 2014. Quantifying the contribution of ambient and indoorgenerated fine particles to indoor air in residential environments. Indoor Air 24, 362–375. https://doi.org/10.1111/ina.12084
- MacNeill, M., Wallace, L., Kearney, J., Allen, R.W., Van Ryswyk, K., Judek, S., Xu, X., Wheeler, A., 2012. Factors influencing variability in the infiltration of PM2.5 mass and its components. Atmospheric Environment 61, 518–532. https://doi.org/10.1016/j.atmosenv.2012.07.005
- Meng, Q.Y., Turpin, B.J., Korn, L., Weisel, C.P., Morandi, M., Colome, S., Zhang, J. (Jim), Stock, T., Spektor, D., Winer, A., Zhang, L., Lee, J.H., Giovanetti, R., Cui, W., Kwon, J., Alimokhtari, S., Shendell, D., Jones, J., Farrar, C., Maberti, S., 2005. Influence of ambient (outdoor) sources on residential indoor and personal PM2.5 concentrations: Analyses of RIOPA data. J Expo Anal Environ Epidemiol 15, 17–28. https://doi.org/10.1038/sj.jea.7500378
- Monn, C., Becker, S., 1999. Cytotoxicity and Induction of Proinflammatory Cytokines from Human Monocytes Exposed to Fine (PM2.5) and Coarse Particles (PM10–2.5) in Outdoor and Indoor Air. Toxicology and Applied Pharmacology 155, 245–252. https://doi.org/10.1006/taap.1998.8591

Rim, D., Wallace, L., Persily, A., 2010. Infiltration of outdoor ultrafine particles into a test house. Environ. Sci. Technol. 44, 5908–5913. https://doi.org/10.1021/es101202a

- Sarnat, J.A., Sarnat, S.E., Flanders, W.D., Chang, H.H., Mulholland, J., Baxter, L., Isakov, V., Özkaynak, H., 2013. Spatiotemporally resolved air exchange rate as a modifier of acute air pollution-related morbidity in Atlanta. Journal of Exposure Science and Environmental Epidemiology 23, 606–615. https://doi.org/10.1038/jes.2013.32
- Singer, B.C., Delp, W.W., Black, D.R., Walker, I.S., 2017. Measured performance of filtration and ventilation systems for fine and ultrafine particles and ozone in an unoccupied modern California house. Indoor Air 27, 780–790. https://doi.org/10.1111/ina.12359
- Tang, C.H., Garshick, E., Grady, S., Coull, B., Schwartz, J., Koutrakis, P., 2018. Development of a modeling approach to estimate indoor-to-outdoor sulfur ratios and predict indoor PM2.5 and black carbon concentrations for Eastern Massachusetts households. J Expo Sci Environ Epidemiol 28, 125–130. https://doi.org/10.1038/jes.2017.11
- Thatcher, T.L., Lunden, M.M., Revzan, K.L., Sextro, R.G., Brown, N.J., 2003. A concentration rebound method for measuring particle penetration and deposition in the indoor environment. Aerosol Sci. Technol. 37, 847–864. https://doi.org/10.1080/02786820300940
- US EPA, 2019. Integrated Science Assessment for Particulate Matter (No. EPA/600/R-19/188). Center for Public Health and Environmental Assessment, Office of Research and Development, Research Triangle Park, NC.
- van Donkelaar, A., Martin, R.V., Brauer, M., Kahn, R., Levy, R., Verduzco, C., Villeneuve, P.J., 2010. Global Estimates of Ambient Fine Particulate Matter Concentrations from Satellite-Based Aerosol Optical Depth: Development and Application. Environ Health Perspect 118, 847–855. https://doi.org/10.1289/ehp.0901623
- Vette, A., Rea, A., Lawless, P., Rodes, C., Evans, G., Highsmith, V.R., Sheldon, L., 2001. Characterization of indoor-outdoor aerosol concentration relationships during the Fresno PM exposure studies. Aerosol Sci. Technol. 34, 118–126. https://doi.org/10.1080/02786820117903
- Williams, R., Suggs, J., Rea, A., Sheldon, L., Rodes, C., Thornburg, J., 2003. The Research Triangle Park particulate matter panel study: modeling ambient source contribution to personal and residential PM mass concentrations. Atmos. Environ. 37, 5365–5378. https://doi.org/10.1016/j.atmosenv.2003.09.010
- Zeng, Y., Yu, H., Zhao, H., Stephens, B., Verma, V., under review. Influence of Environmental Conditions on the Dithiothreitol (DTT)-Based Oxidative Potential of Size-Resolved Indoor Particulate Matter of Ambient Origin. Atmospheric Environment.
- Zhao, H., 2019. Improving Methods to Measure the Transport of Outdoor Pollutants into Residential Indoor Environments (Dissertation). Illinois Institute of Technology, Chicago, IL.
- Zhao, H., Stephens, B., 2017. Using portable particle sizing instrumentation to rapidly measure the penetration of fine and ultrafine particles in unoccupied residences. Indoor Air 27, 218–229. https://doi.org/10.1111/ina.12295

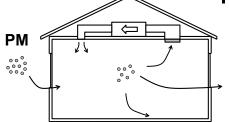
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Illinois Institute of Technology, Chicago, IL







# The Built Environment Research Group

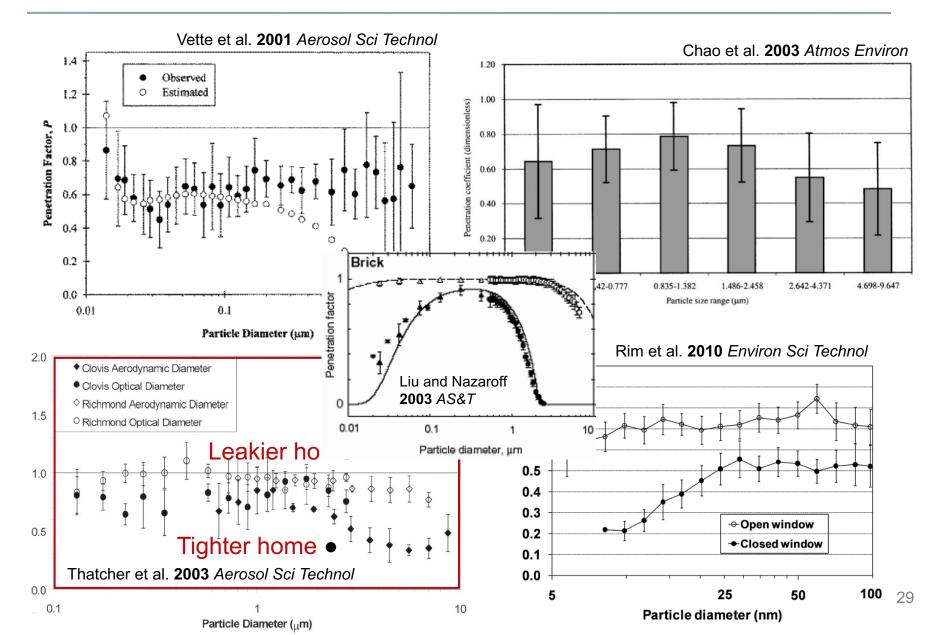
advancing energy, environmental, and sustainability research within the built environment at Illinois Institute of Technology



web <u>www.built-envi.com</u> email <u>brent@iit.edu</u> twitter @built\_envi

### **Bonus slides**

### **Direct** measurements of penetration factors (P)



#### Exploring the impacts of mechanical ventilation and filtration on $F_{inf}$

# HUD HHTS: Impacts of ventilation system retrofits on IAQ and adult asthma outcomes (2016-2020)

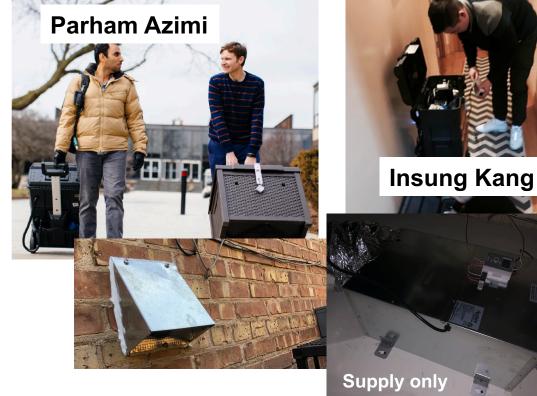


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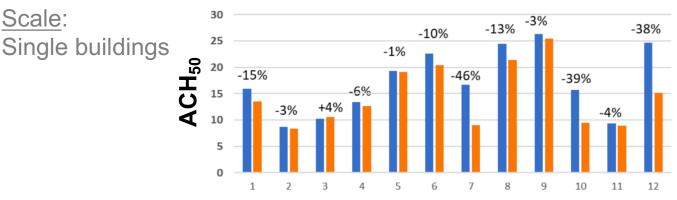
Kang et al. unpublished



Funding: U.S. HUD HHTS (ILHHU0031-16)

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#### Assessing the impacts of energy efficiency retrofits on $F_{inf}$ and P



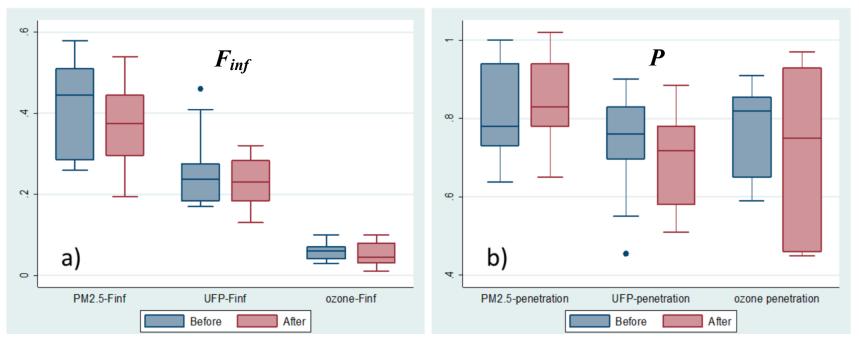
Scale:

#### Homes in Chicago

#### Envelope air-sealing

Mean ACH<sub>50</sub> reduction of ~16%

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before after

Zhao and Stephens unpublished work (from Haoran Zhao Dissertation, 2019) Funding: U.S. EPA (No. 83575001) & ASHRAE NIA