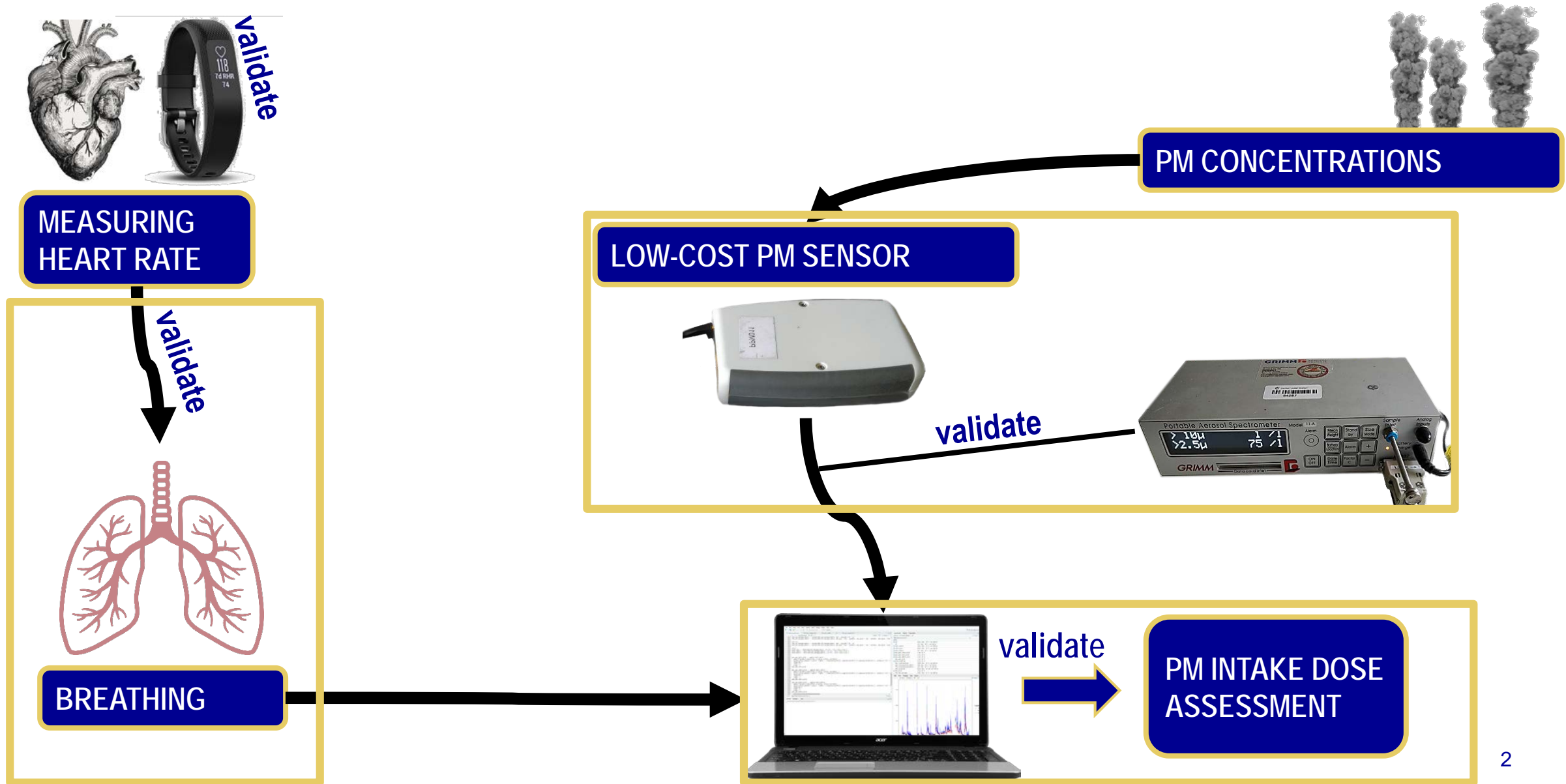


# ICARUS

## Integrated Climate forcing and Air pollution Reduction in Urban Systems

### Uncertainty associated with assessing personal exposure to particulate matter with high temporal resolution using low-cost portable sensors

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Johanna Amalia Robinson, Dimosthenis Sarigiannis







*sensors*



Article

# Comparing Airborne Particulate Matter Intake Dose Assessment Models Using Low-Cost Portable Sensor Data

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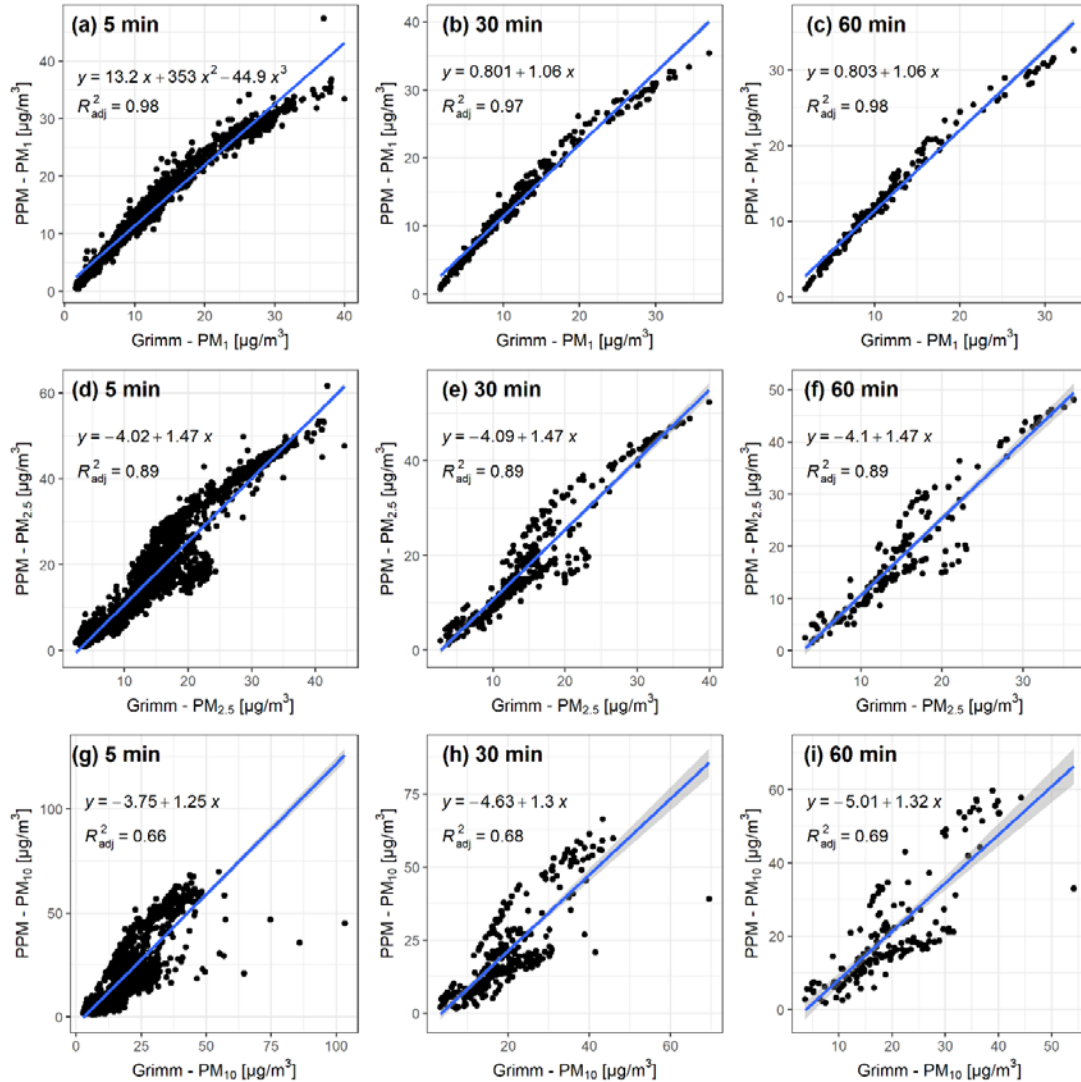
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$$intake\ dose = \dot{V}_E * PM_1$$

minute ventilation [l/min]      PM<sub>1</sub> concentration [ $\mu\text{g}/\text{m}^3$ ]

model 1    model 2

model 3    model 4

## model 1

$$\text{intake dose} = \dot{V}_E^1 * PM_1$$

- Most complex estimate for  $\dot{V}_E$
- Based on Greenwald et al.

$$\dot{V}_E^1 = e^{-9.59} HR^{2.39} age^{0.274} sex^{-0.204} FVC^{0.520}$$

Heart rate in beats per minute

Age in years

"1" for male, "2" for female

Forced vital capacity  
From GLFI methodology  
(3.32 l for P1, 5.37 l for P2)

## model 2

$$\text{intake dose} = \dot{V}_E^2 * PM_1$$

- Less complex  $\dot{V}_E$  calculation, using only HR and sex
- Based on Zuurbier et al.

$$\dot{V}_E^2 = (a * HR + b)^e$$

Heart rate in beats per minute

"a" and "b" based on sex:  
a is 0.023 and 0.021,  
b is 0.57 and 1.03,  
for females and males, respectively

## model 3

$$\text{intake dose} = \dot{V}_E^3 * PM_1$$

- $\dot{V}_E$  not based on HR; activity patterns, inhalation rates, and body weight, with a specific type of microenvironment
- Based on Sarigiannis et al., Madureira et al. and EPA Exposure Factors Handbook
- Average  $\dot{V}_E$  provided for 4 levels of activity
- $\dot{V}_E$  determined for each hourly interval

## model 4

$$\text{intake dose} = \dot{V}_E^4 * PM_1$$

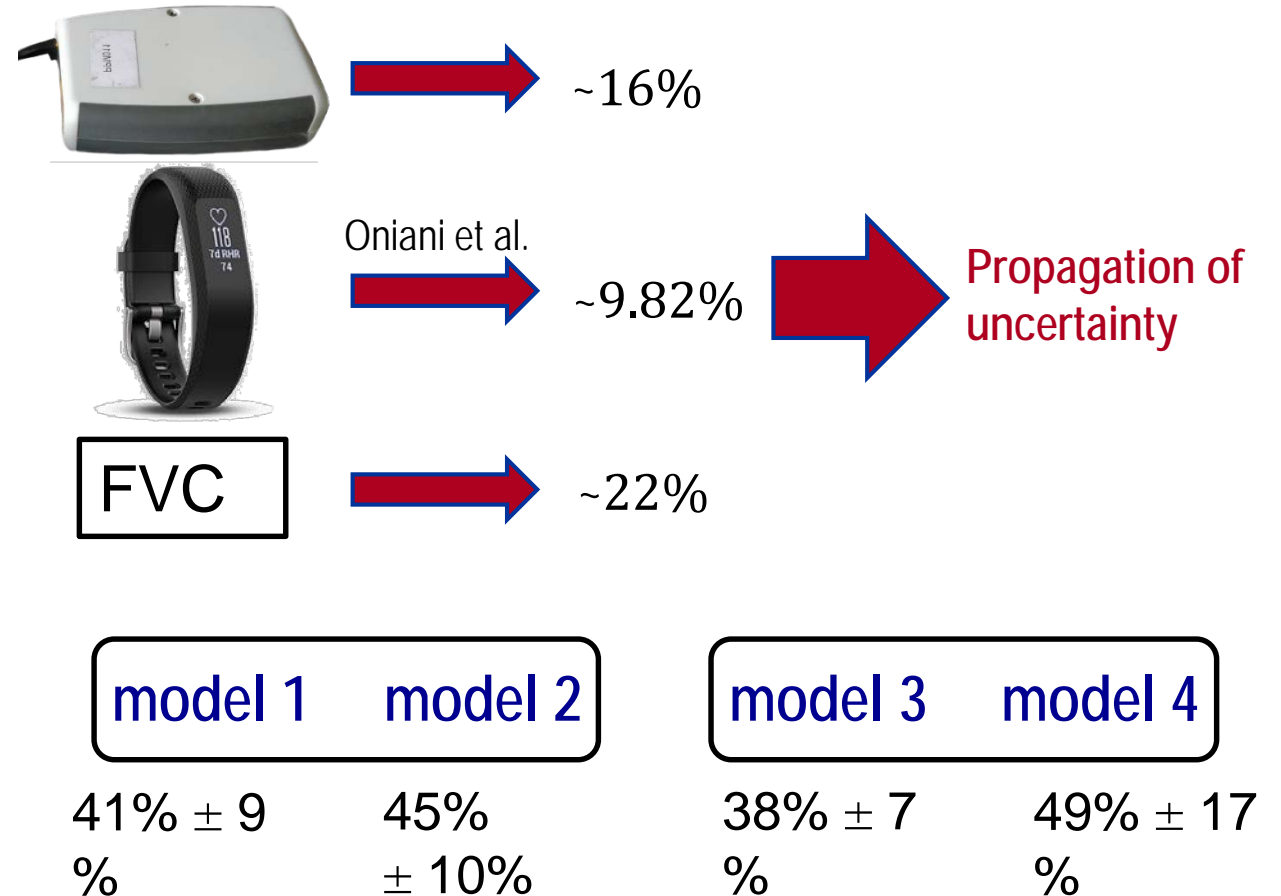
- Most basic approach for  $\dot{V}_E$ , using only age, sex and weight
- Using EPA Handbook with generalized  $\dot{V}_E$  data for time spent in micro-locations, doing specific activities for each (age and sex) group

$$\dot{V}_E^4 = (sP * aV_P + sLi * aV_{Li} + sMi * aV_{Mi} + sHi * aV_{Hi}) * BW$$

## Determining uncertainty

- PPM sensor ► compare with GRIMM
- SAT tracker ► Oniani et al.
- FVC ► Interval from lower to higher
- EPA  $\dot{V}_E$  ► Upper and lower interval
- EPA activity ► Upper and lower interval
- **Propagation of uncertainty!**

## Quantifying Uncertainty



Which model is “the best”?  
Which is “the most accurate”?  
Which one should we use?

**IT DEPENDS!**

- Only have some basic data (weight, age)
- Need a general assessment with more uncertainty
- Short on time and resources



**M3 & M4**

- Have data with high spatiotemporal resolution
- Participants heavily involved in research
- A lot of processing power
- Need more accurate data



**M1 & M2**

1. Low-cost sensors ► intake dose estimate?  
**It is possible!**

2. Most of the uncertainty comes from the  $\dot{V}_E$  **MODELS**,  
not the sensors

3. Which approach is the best for your research? **It depends!**



# Thank you for your attention!

## QUESTIONS, COMMENTS



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