

# Perspectives on Satellite-Based PM<sub>2.5</sub>

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with contributions from

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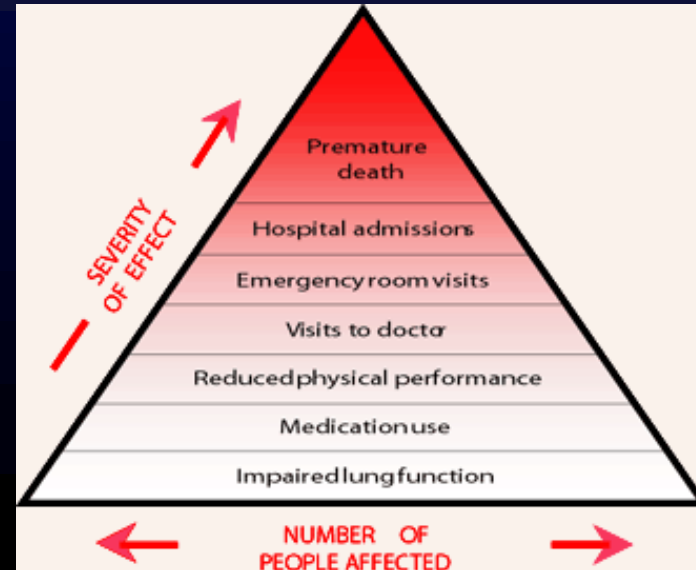
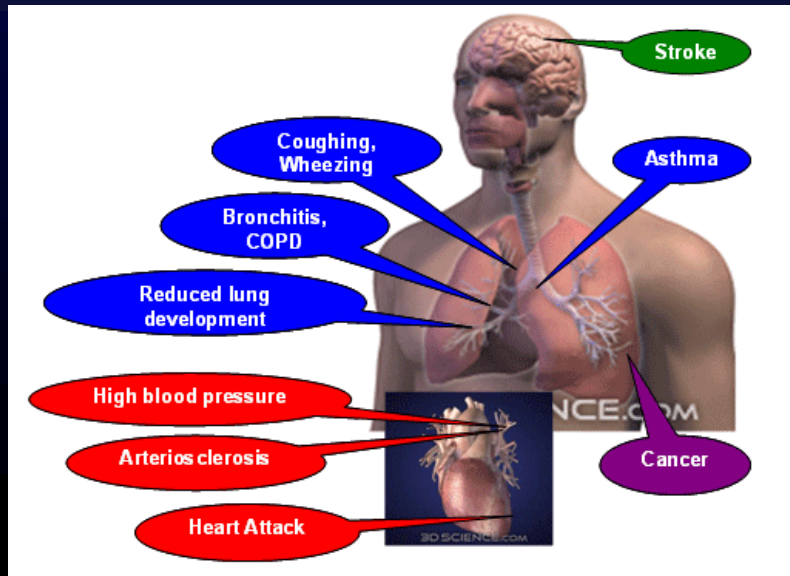


Michael Brauer (UBC), Rick Burnett (Health Canada), Aaron Cohen (HEI), Dan Crouse (Health Canada), Yang Liu (Emory), Daven Henze (CU Boulder), Brent Holben (NASA), Christina Hsu (NASA), Ralph Kahn (NASA), Robert Levy (NASA), Zifeng Lu (Argonne), Alexei Lyapustin (NASA), Vanderlei Martins (UMBC), Yinon Rudich (Weizmann), Andrew Sayer (NASA), David Streets (Argonne), Qiang Zhang (Tsinghua)

HAQAST Meeting, LDEO  
28 November 2017

# Long-Term Exposure to Fine Particulate Matter (PM<sub>2.5</sub>) Affects Longevity

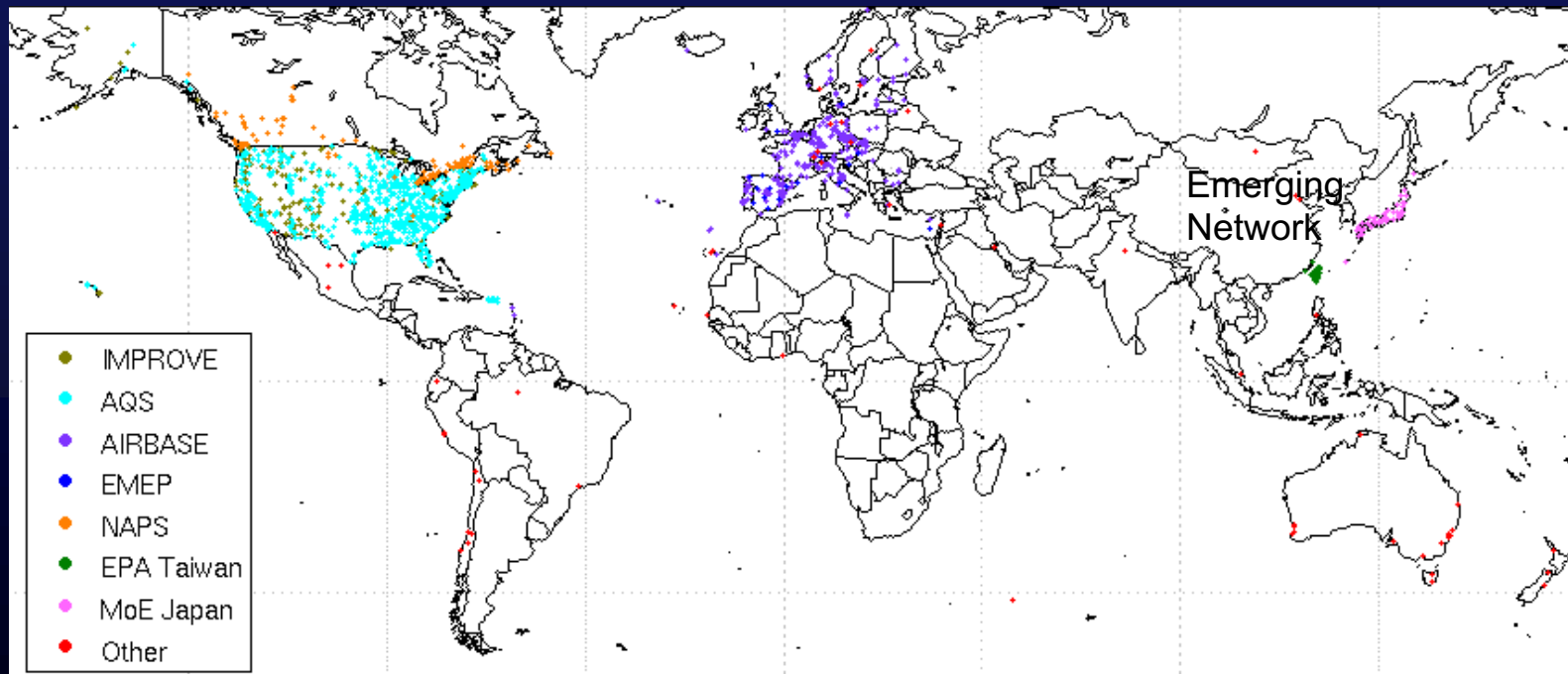
- PM<sub>2.5</sub> leading environmental risk factor for global burden of disease with 4 million attributable deaths (Global Burden of Disease, 2016)
- Annual global welfare costs projected to rise from US\$3 trillion in 2015 to US\$18-25 trillion in 2060 (OECD, 2016).
- Annual mean PM<sub>2.5</sub> concentrations included in UN Sustainable Development Goals (2016)
- WHO International Agency for Research on Cancer declares particulate matter is a leading cause of cancer deaths (2013)



# Vast Regions Have Insufficient PM<sub>2.5</sub> Measurements for Exposure Assessment

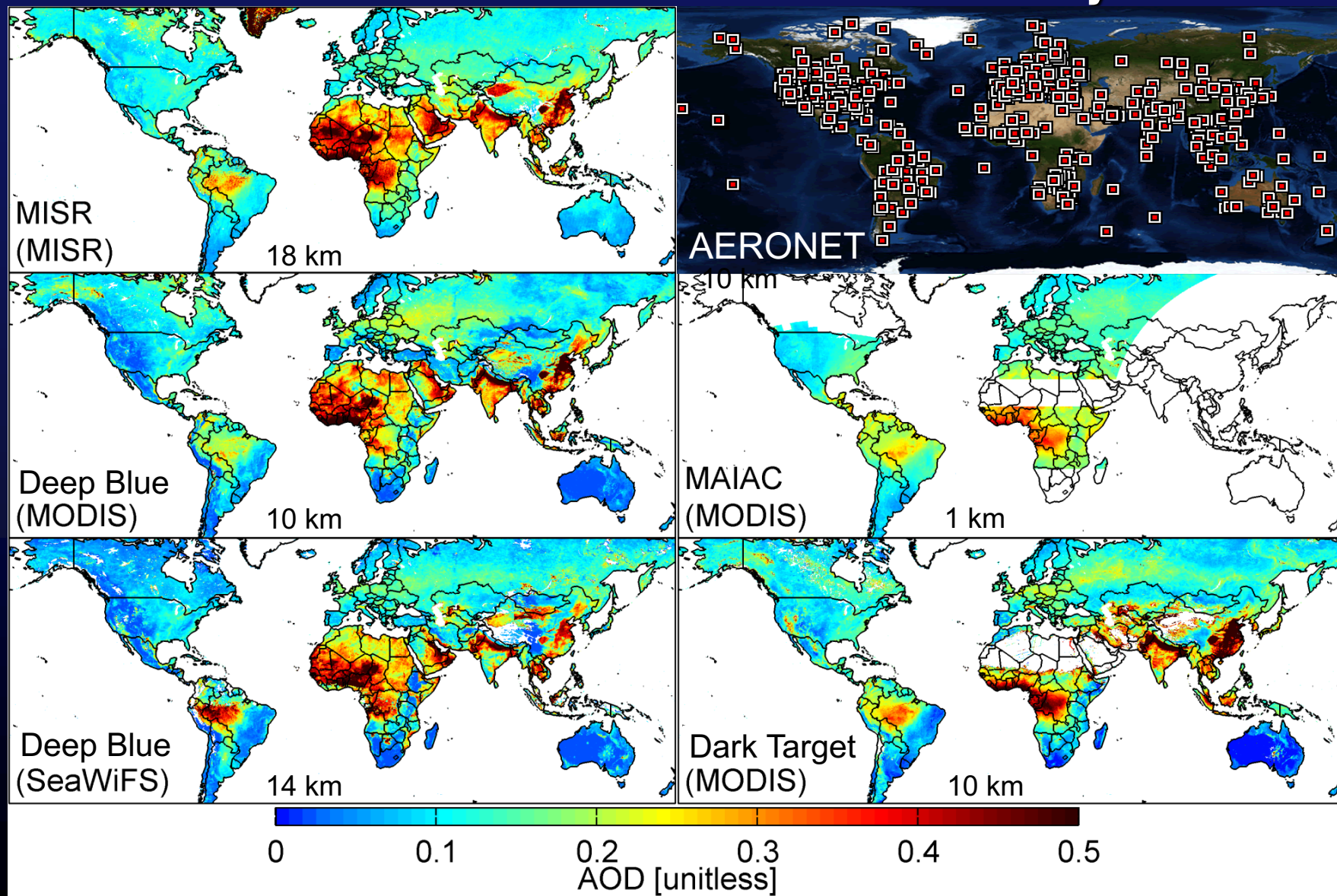
Most countries have no PM<sub>2.5</sub> monitoring

## Locations of Publicly Accessible Long-Term PM<sub>2.5</sub> Monitoring Sites



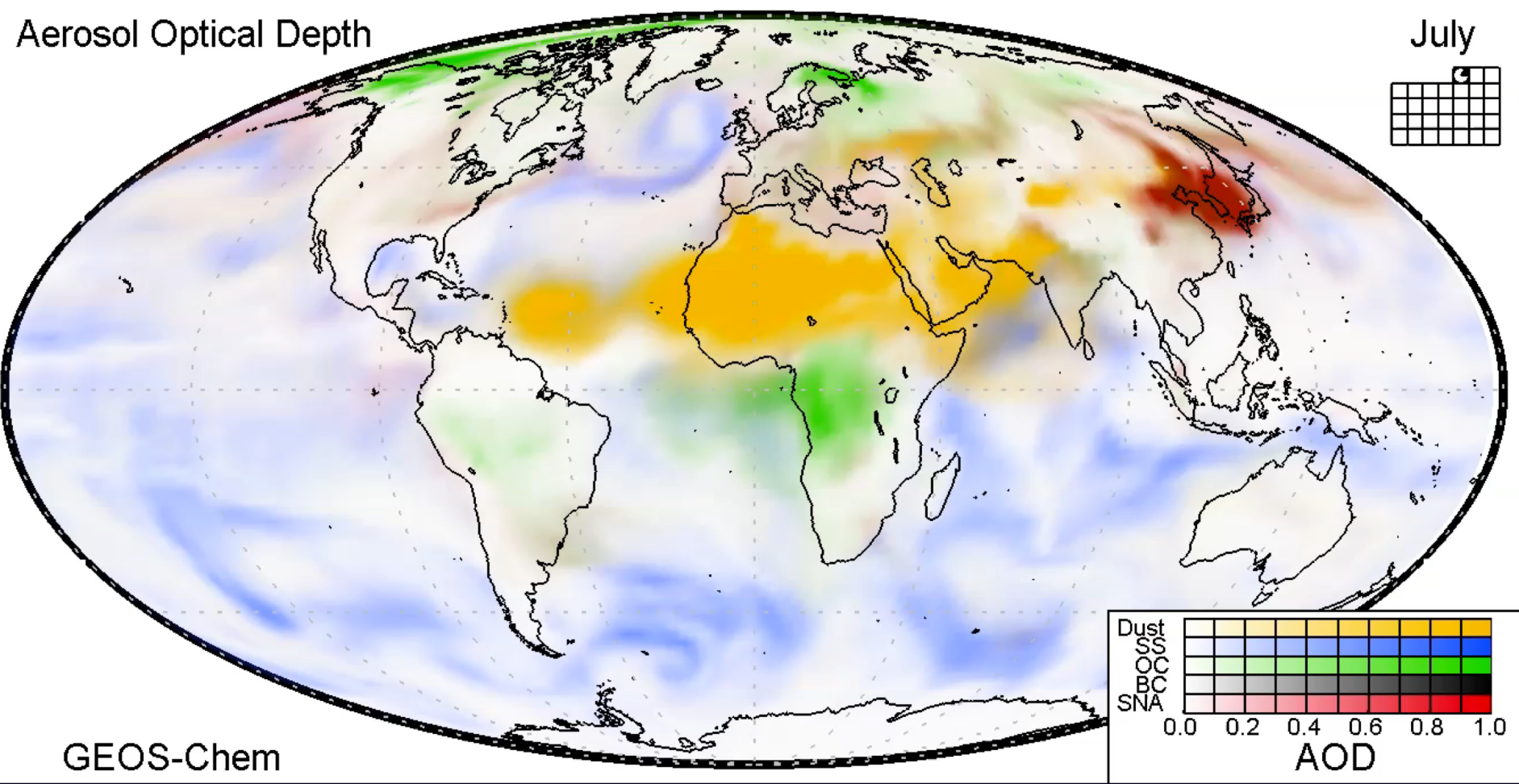
# Long-Term (2001-2010) Aerosol Optical Depth (AOD)

## Use AERONET AOD to Assess Relative Accuracy & Combine



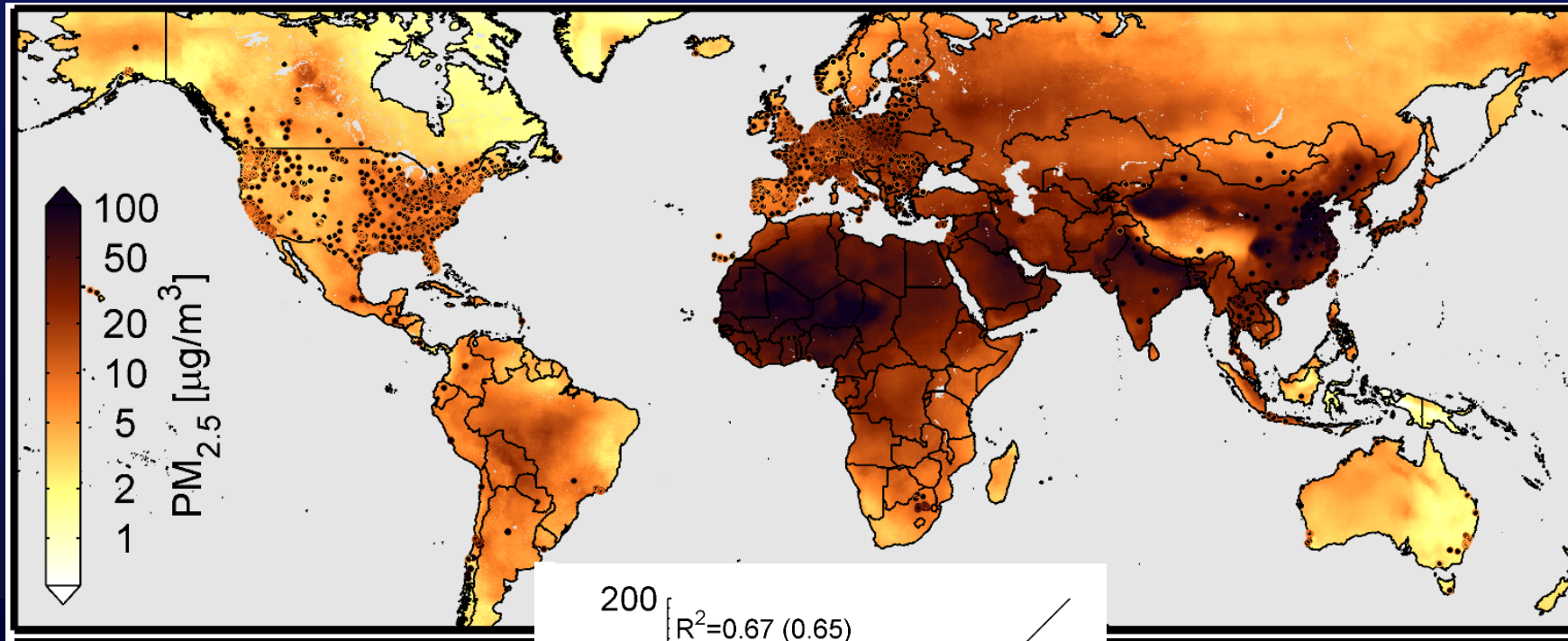


# Apply Chemical Transport Model (GEOS-Chem) to Calculate Solution to $PM_{2.5} = f(x,y,t,AOD)$



# Satellite-Derived PM<sub>2.5</sub> for 2010

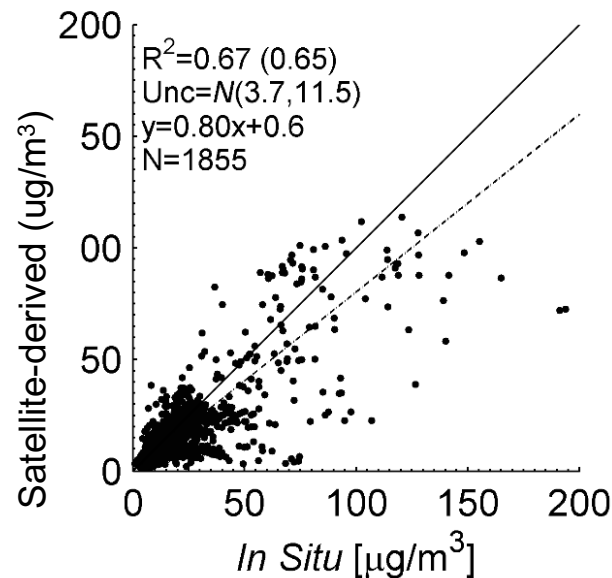
## Promising Consistency with In Situ, & Room for Improvement



**Without GEOS-Chem:**

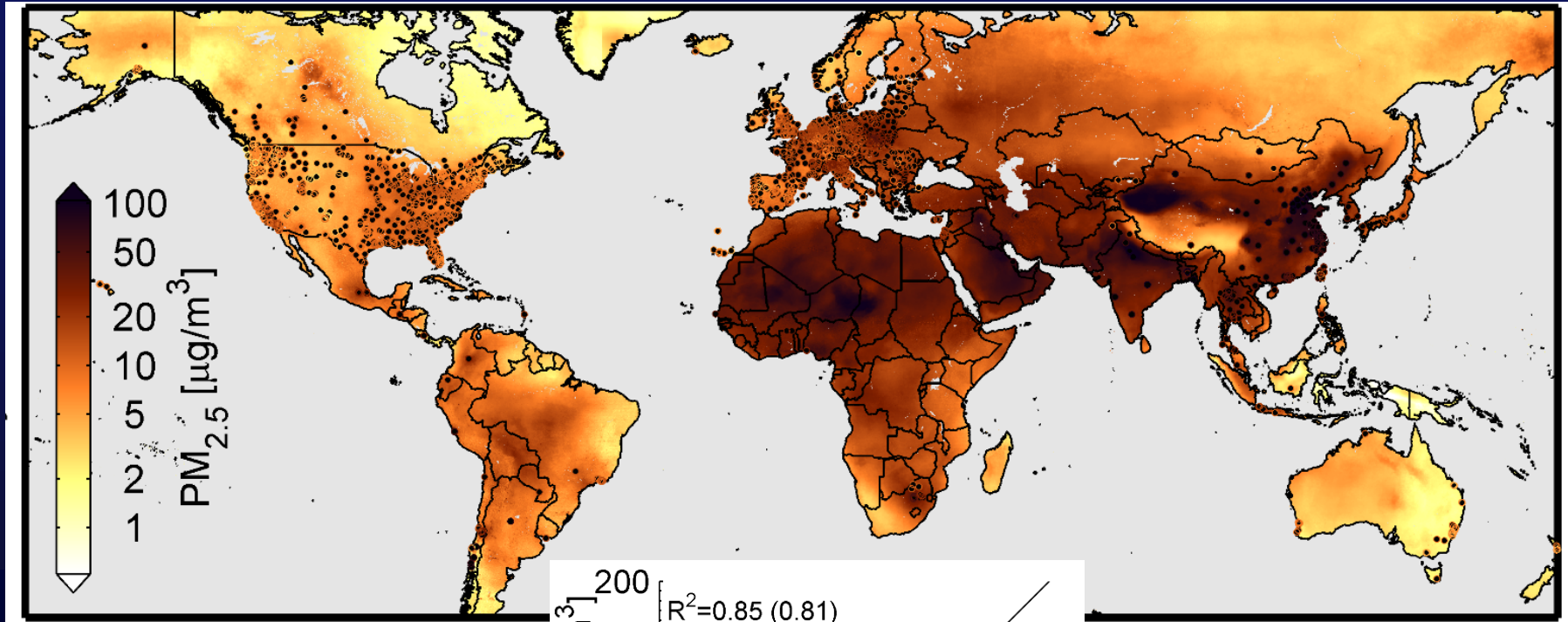
Single algorithm AOD:  $r^2 = 0.32 - 0.39$

Combined AOD:  $r^2 = 0.45$



**Error likely driven by modeled relation between AOD and PM<sub>2.5</sub>**

# Statistical Fusion with Ground-Based Monitors Further Improves Consistency; Still Room for Improvement



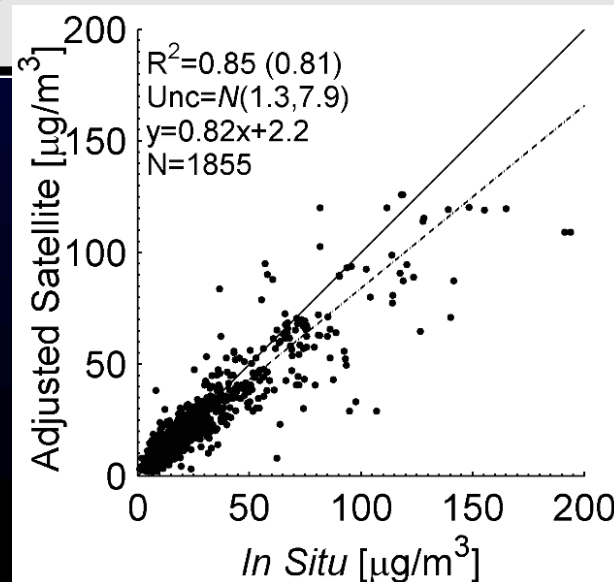
## Explained PM<sub>2.5</sub> variance:

Single algorithm AOD: 32-39%

Combined AOD: 6-13%

CTM PM<sub>2.5</sub> =  $f(\text{AOD})$ : 20%

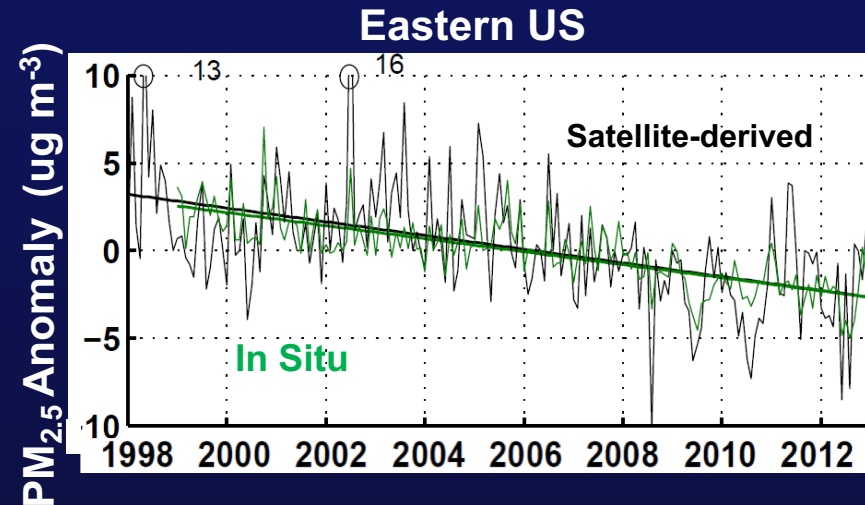
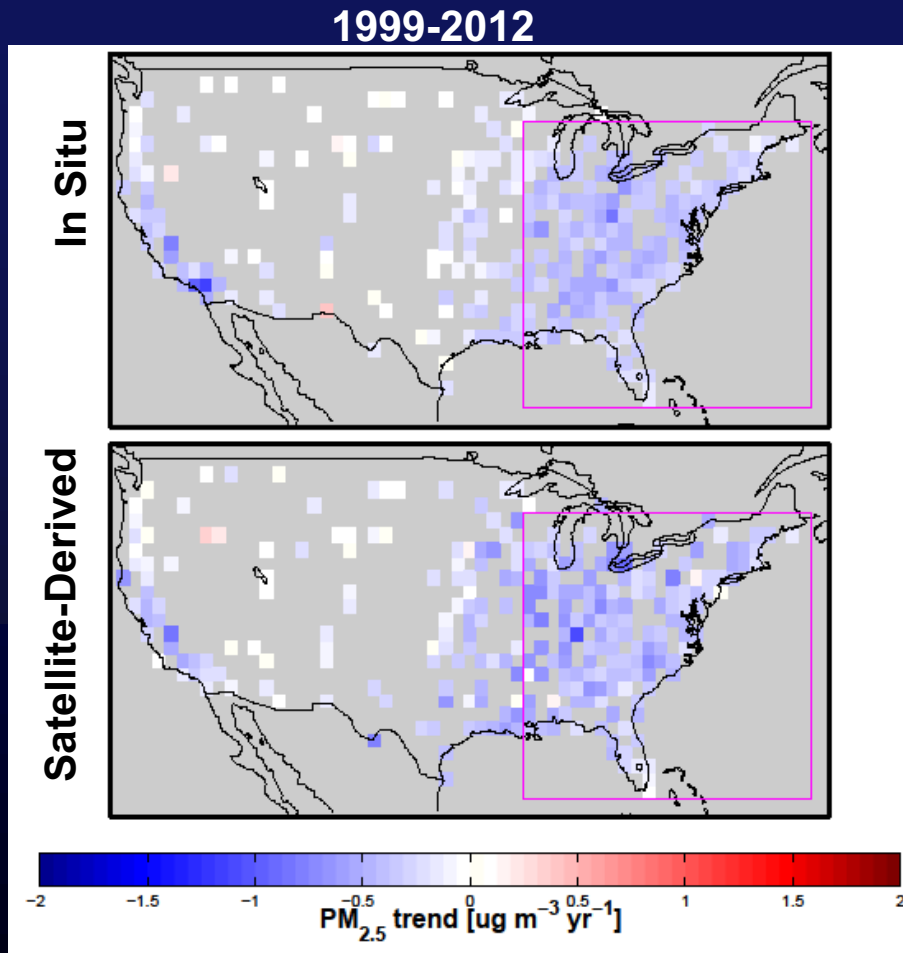
Statistical fusion: 16%



Out of sample  $R^2=0.81$



# Consistent Trends in Satellite-Derived and In Situ $\text{PM}_{2.5}$ If Include Temporal $\text{PM}_{2.5} = f(\text{AOD})$ from CTM (GEOS-Chem)



In Situ (1999-2012)  
 $0.37 \pm 0.06$  (95% CI)  $\mu\text{g m}^{-3} \text{yr}^{-1}$

Satellite-Derived (1999-2012)  
 $0.36 \pm 0.13$  (95% CI)  $\mu\text{g m}^{-3} \text{yr}^{-1}$

If constant  $\text{PM}_{2.5}$  / AOD, trend  
degrades:  $0.22 \pm 0.09$   $\mu\text{g m}^{-3} \text{yr}^{-1}$

Boys et al., ES&T, 2014



## Few Collocated Measurements of PM<sub>2.5</sub> & AOD

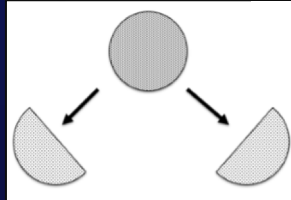


# Surface Particulate Matter Network (SPARTAN): Measures PM<sub>2.5</sub> Mass & Composition at Sites Measuring AOD

Semi-autonomous PM<sub>2.5</sub> & PM<sub>10</sub> Impaction Sampling Station (AirPhoton)



Mass (35% RH)  
Black Carbon



Ions  
(IC)

Metals  
(ICP-MS)

Organics (AMS)

3-λ nephelometer  
(AirPhoton)  
Scatter



AOD from  
Sunphotometer  
(e.g. AERONET)



$$\frac{\text{PM}_{2.5}}{\text{AOD}} = \left( \frac{b_{sp, \text{overpass}}}{\text{AOD}_{\text{overpass}}} \right) \left( \frac{b_{sp, 24h}}{b_{sp, \text{overpass}}} \right) \left( \frac{\text{PM}_{2.5, 24h}}{b_{sp, 24h}} \right)$$

Surface/Column
Diurnal
Mass Scattering Efficiency

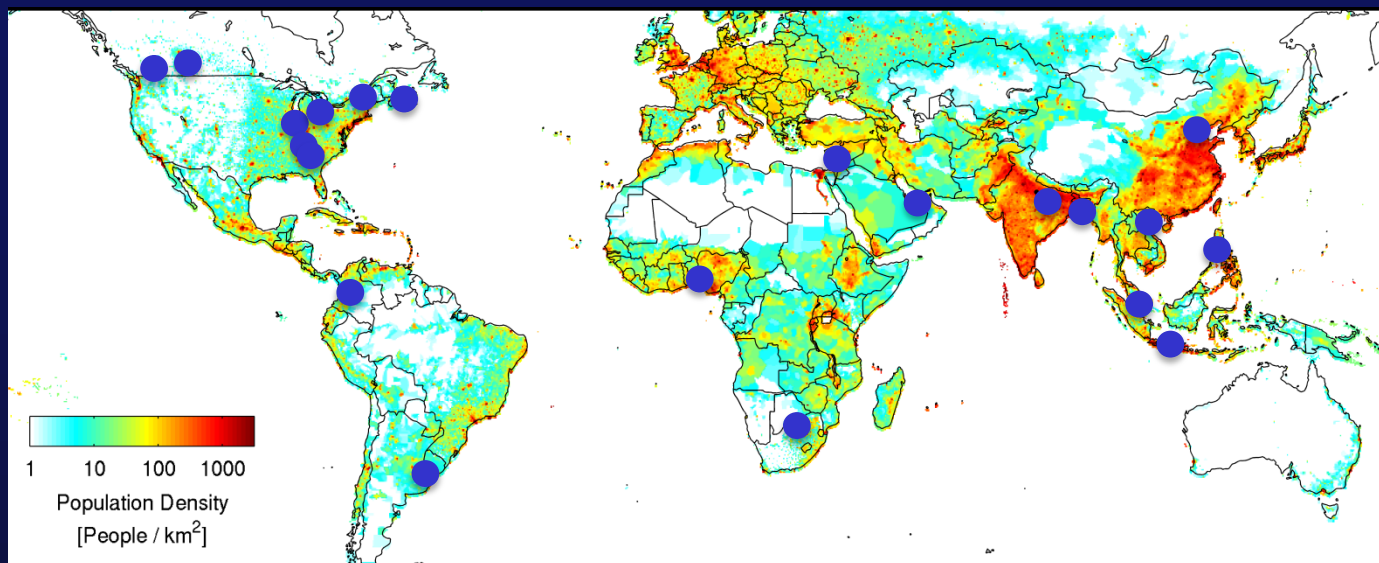
$b_{sp}$  = nephelometer measurements of aerosol scatter

overpass = satellite overpass time

[www.spartan-network.org](http://www.spartan-network.org)

Snider, Weagle, et al., AMT, 2015

# SPARTAN: An Emerging Global Network to Evaluate and Enhance Satellite-Based Estimates of PM<sub>2.5</sub>



An IGAC  
Activity

Globally consistent PM<sub>2.5</sub> mass and composition network

**Coal, Traffic**

**Fires**

**Agriculture**

**Sea Spray**

**Mineral  
Dust**

**SPARTAN Measurements**

**SO<sub>4</sub><sup>2-</sup>, Pb, As, V, Zn, BC**

**K**

**NH<sub>4</sub><sup>+</sup>**

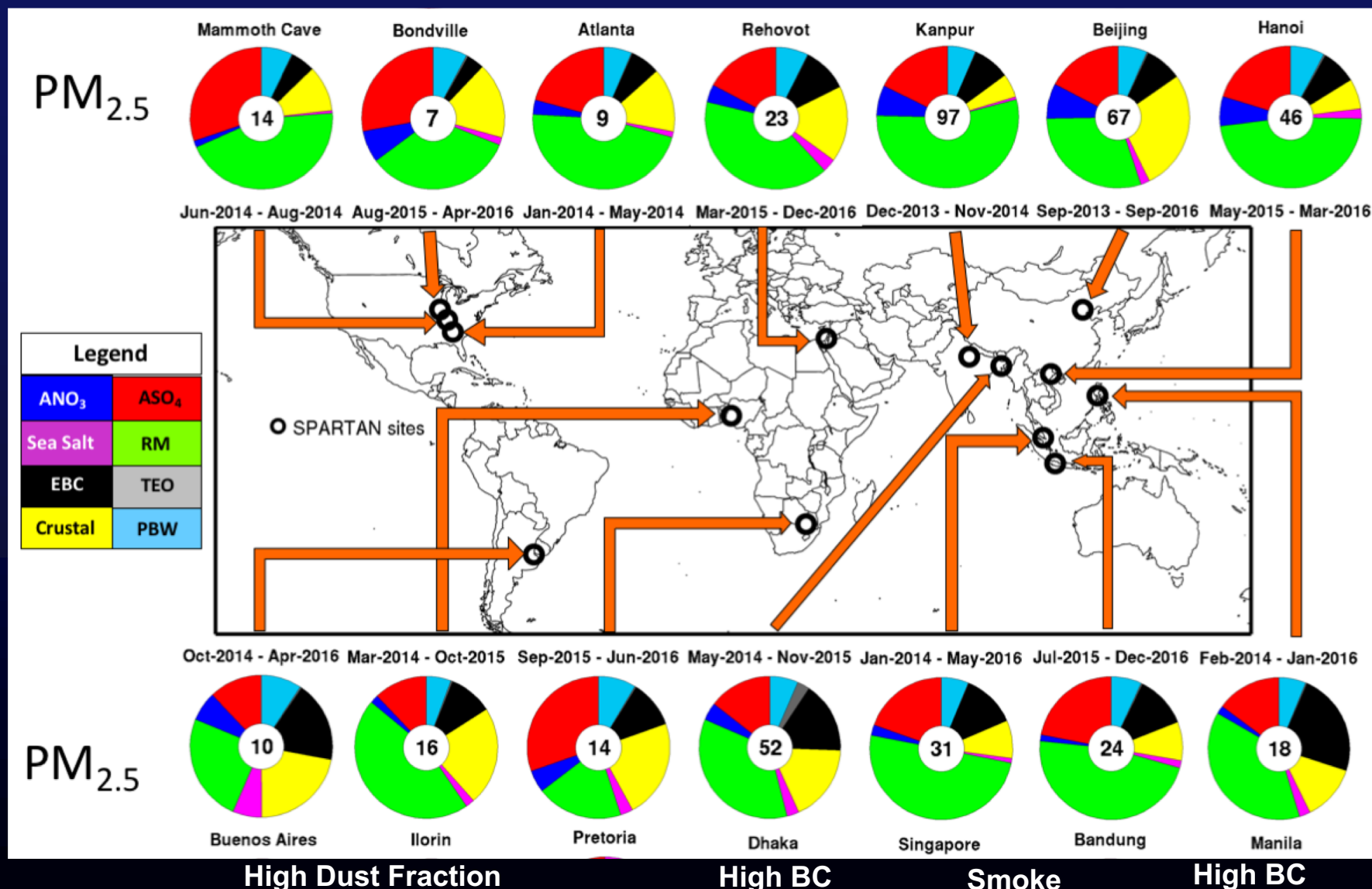
**Na<sup>+</sup>**

**Al, Fe, Mg, Ti**

# Initial SPARTAN PM<sub>2.5</sub> Mass and Composition (>1500 filters)

Low PM<sub>2.5</sub>

High PM, Nitrate



Data publicly available at [spartan-network.org](http://spartan-network.org)

Middle contains PM<sub>2.5</sub> Mass in ug/m<sup>3</sup>

Snider et al., ACP, 2016



# Mortality due to Air Pollution at Low levels of Exposure (MAPLE)

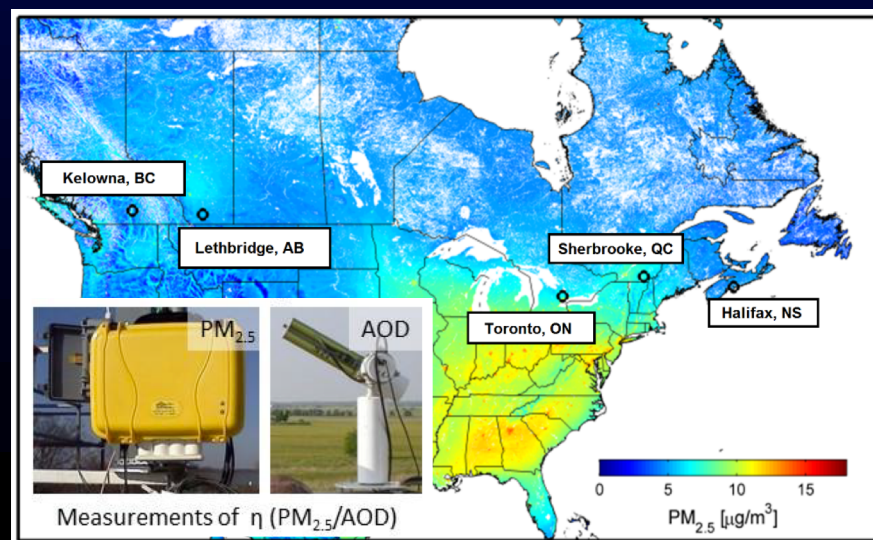
- Apply novel individual estimates of  $PM_{2.5}$  exposure to several large population-based cohorts (2.5M & 3.5M)

Majority of Canadian population lives in areas with relatively low ambient  $PM_{2.5}$  concentrations ( $<12\mu g/m^3$ )

- Characterize relationship between  $PM_{2.5}$  exposure with (all cause / cause-specific) mortality
- Characterize shape of concentration-mortality association in subjects whose average past 3-20 years of exposure  $<$  specified concentrations



Michael Brauer, Rick Burnett, Scott Weichenthal, Daniel Crouse, Randall V. Martin, Perry Hystad, Anders Erickson, Jeffrey R. Brook, Michael Tjepkema, Lauren Pinault

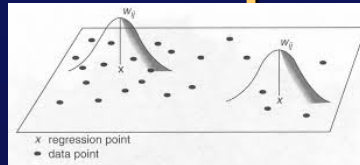
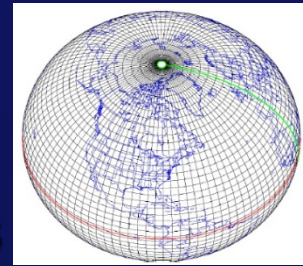


## **Some Emerging Satellite Datasets**

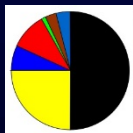
- Ongoing global aerosol monitoring (e.g. VIIRS on NPP)
- Improved aerosol algorithms (e.g. MAIAC with global 1km AOD)
- Finer resolution trace gas information (e.g. TROPOMI for NO<sub>2</sub>), 2017 launch
- Diurnal information (e.g. geostationary constellation; launch in few years)
- Additional information on aerosol composition (e.g. MAIA 2020 launch)

**Key Challenge for All These Datasets:  
Relate Columnar Satellite Observation to Ground-level Mass**

**Satellites offer high quality global columnar observations with information about  $PM_{2.5}$  when interpreted with models**



**Ground-based collocated measurements of AOD,  $PM_{2.5}$  mass,  $PM_{2.5}$  scatter, and  $PM_{2.5}$  composition key to improving global satellite-based estimates of  $PM_{2.5}$**



**Exciting opportunities for source apportionment, connections with low cost sensors, and health applications**

