

# Satellite $\text{NO}_2$ for the Evaluation of U.S. $\text{NO}_x$ Emissions



Dr. Monica Harkey, UW-Madison  
Dr. Tracey Holloway, UW-Madison  
Dr. R. Brad Pierce, NOAA

*in collaboration with  
Rob Kaleel, LADCO  
Dr. Alex Cohan, LADCO*



# Satellites:

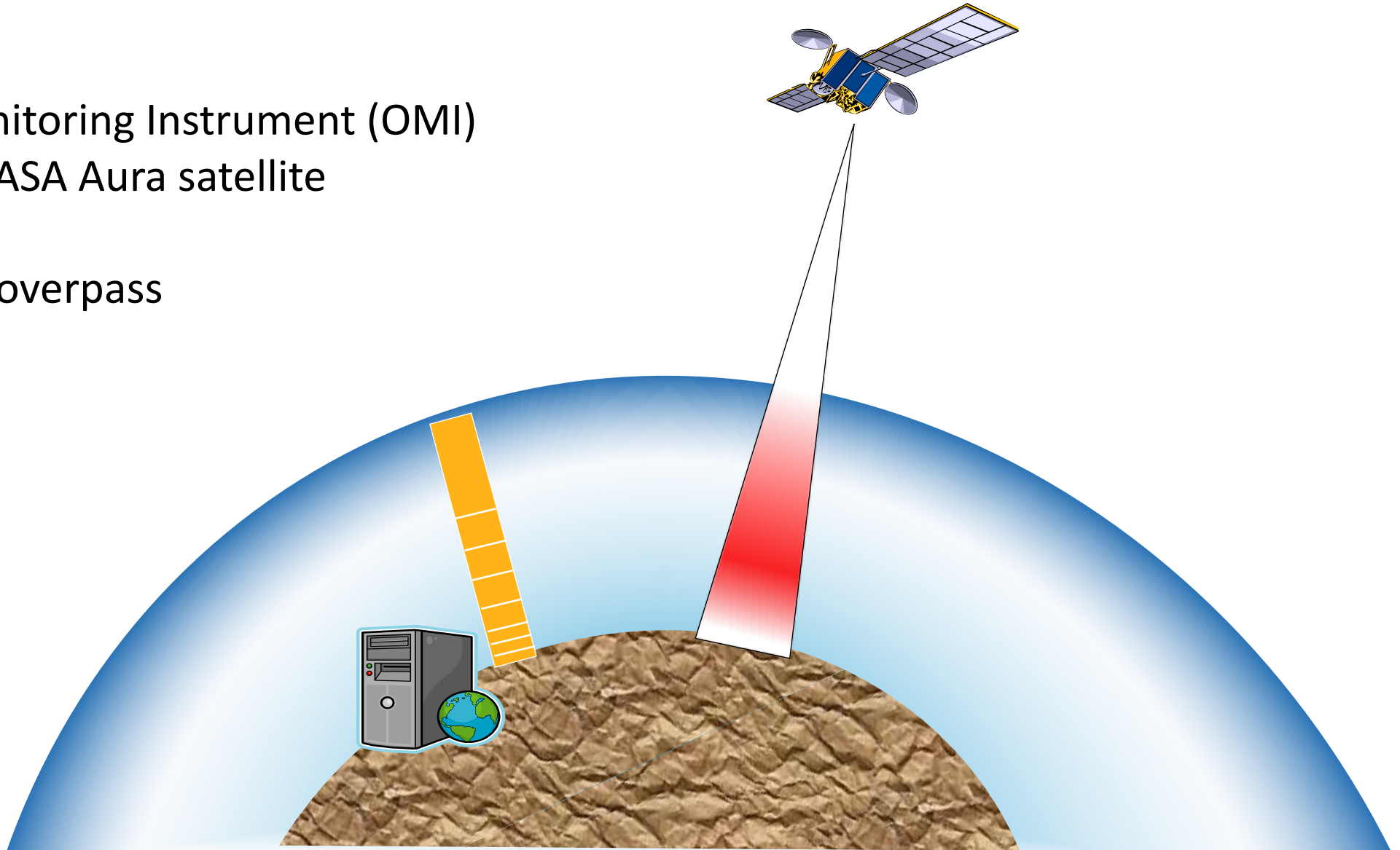


- continuous, global coverage:  $\text{NO}_2$ ,  $\text{SO}_2$ , AOD (particulates), HCHO (VOCs)
- daily, seasonal patterns and multi-year trends

# Satellite-based NO<sub>2</sub>:

Ozone Monitoring Instrument (OMI)  
onboard NASA Aura satellite

~1 pm LST overpass



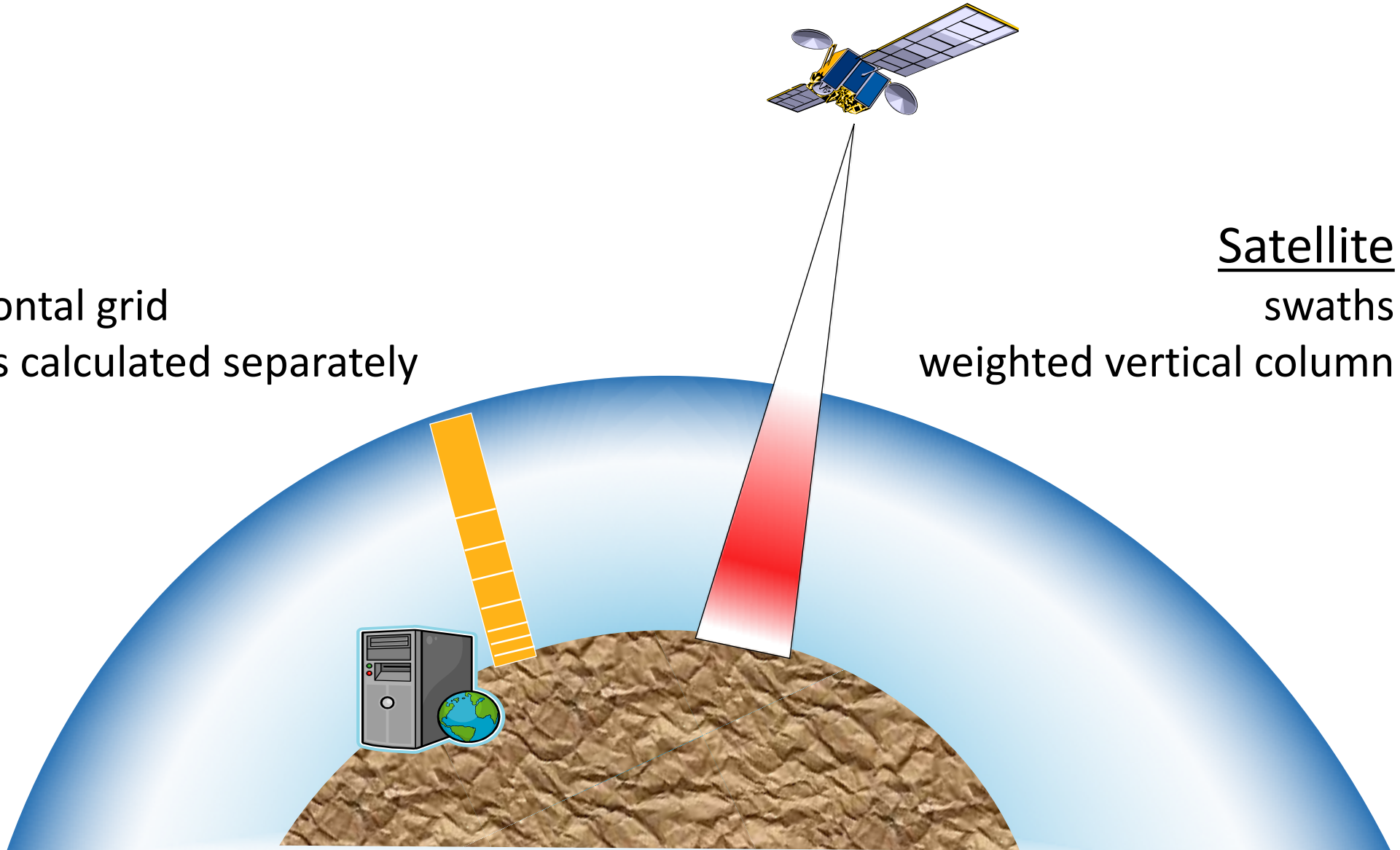
# Satellite-based NO<sub>2</sub>:

## Model

regular horizontal grid  
vertical layers calculated separately

## Satellite

swaths  
weighted vertical column





# Satellite-based NO<sub>2</sub>:

## Model

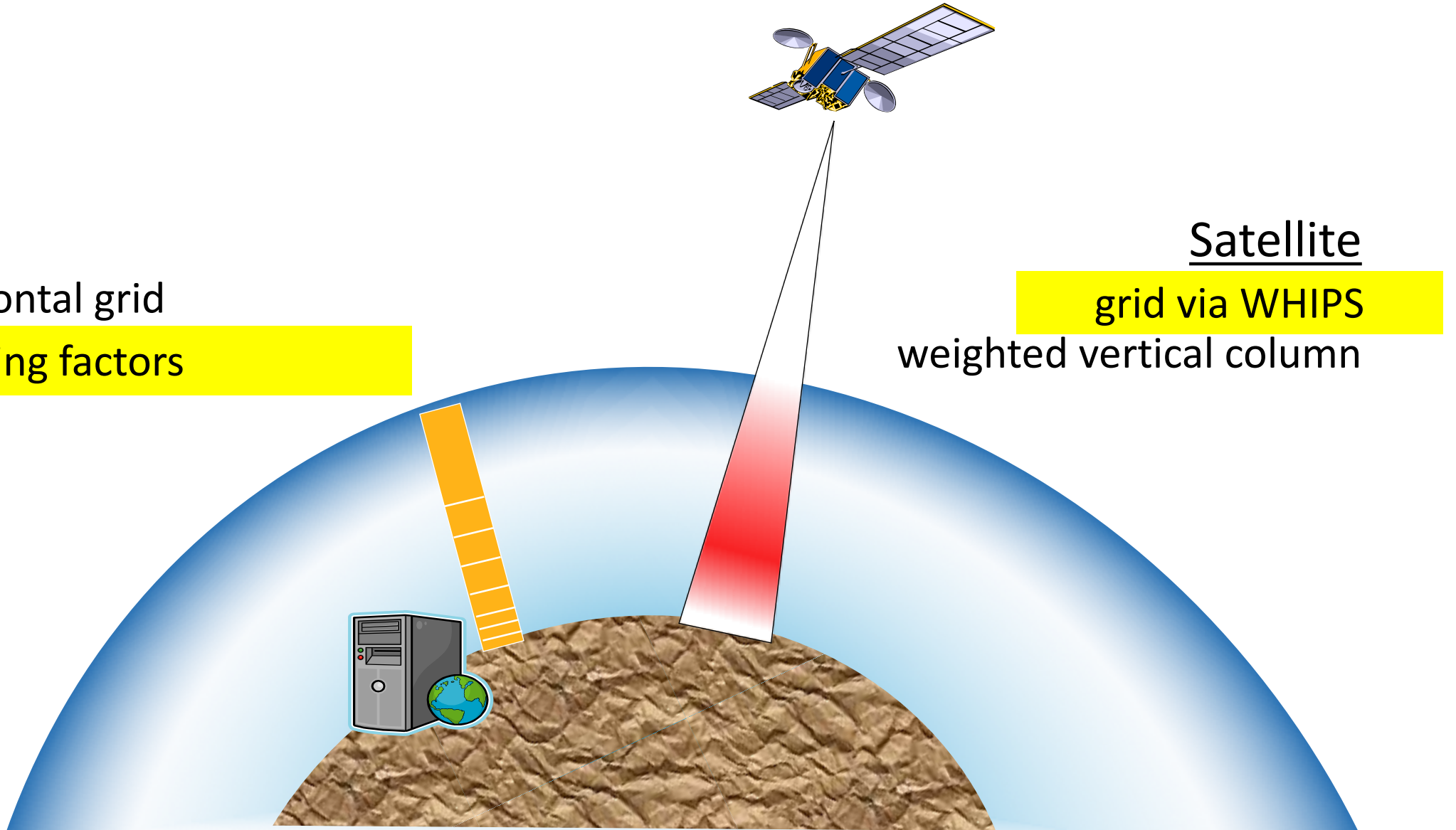
regular horizontal grid

apply weighting factors

## Satellite

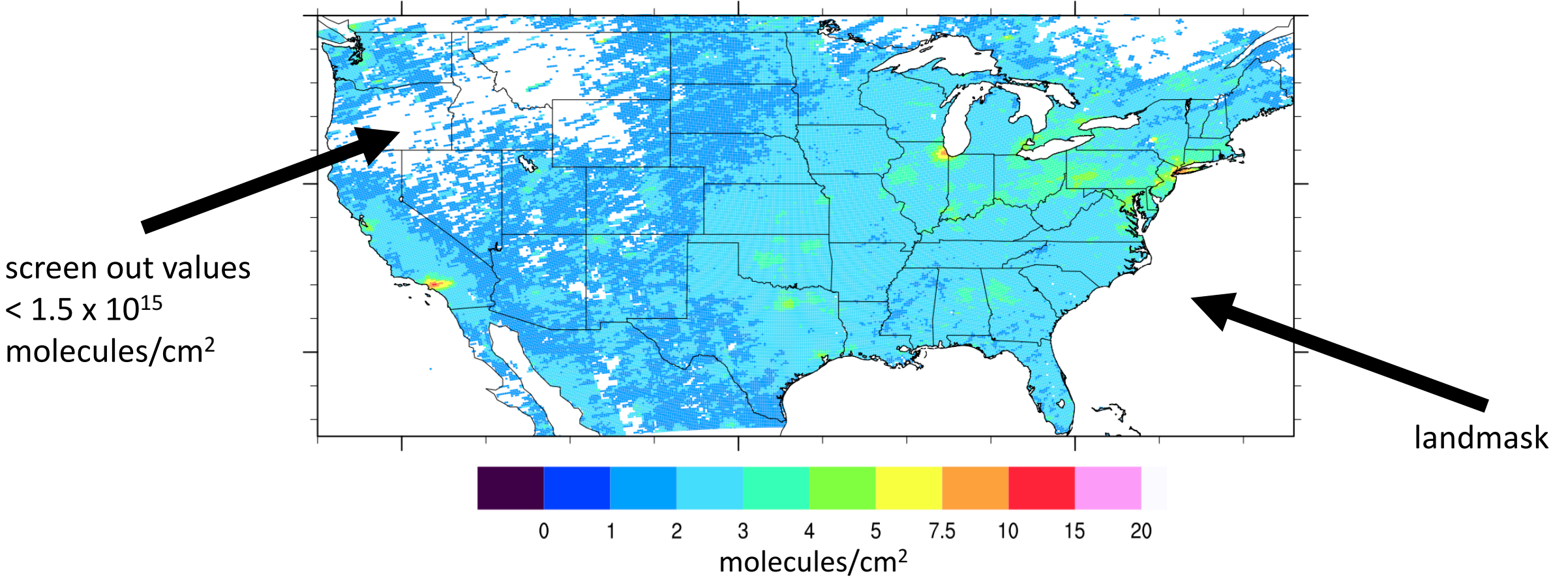
grid via WHIPS

weighted vertical column



# Satellite-based NO<sub>2</sub>:

July 2011 average observed



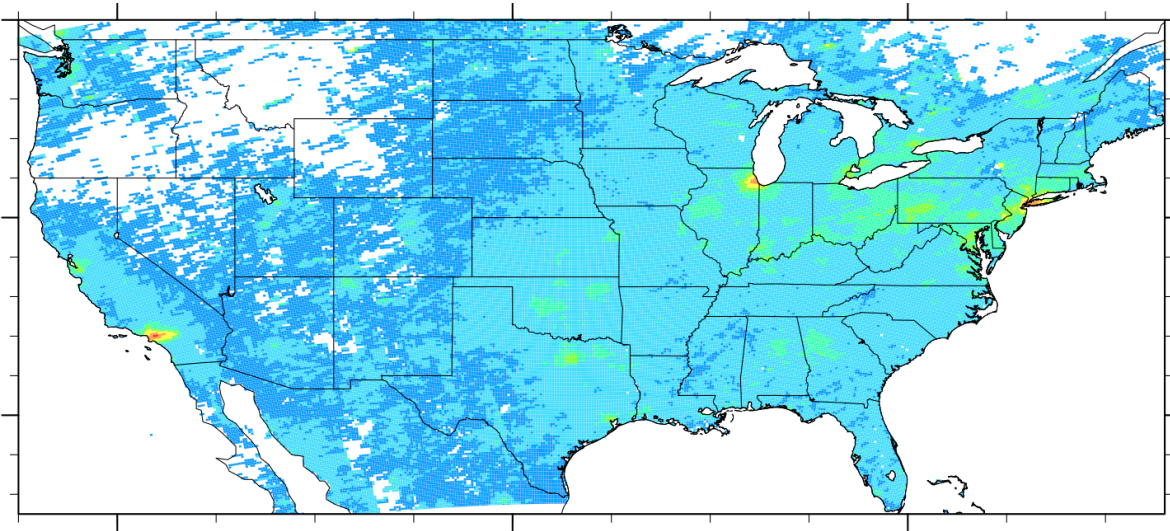
# How can OMI NO<sub>2</sub> help us learn...

- about urban-rural gradients?
- from scaling for near-surface amounts?
- from assimilating OMI NO<sub>2</sub> observations?

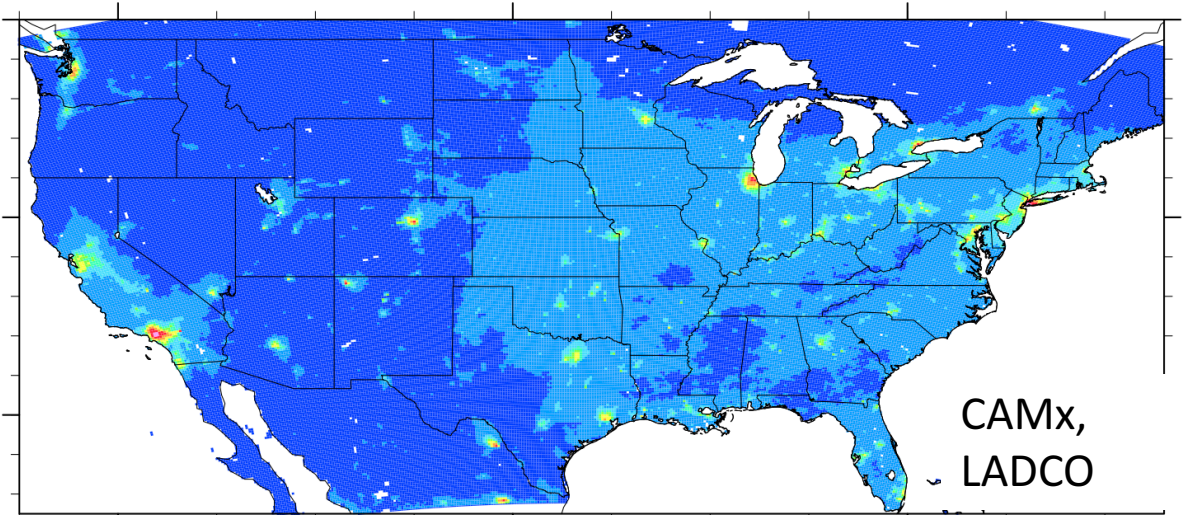


# urban-rural gradients

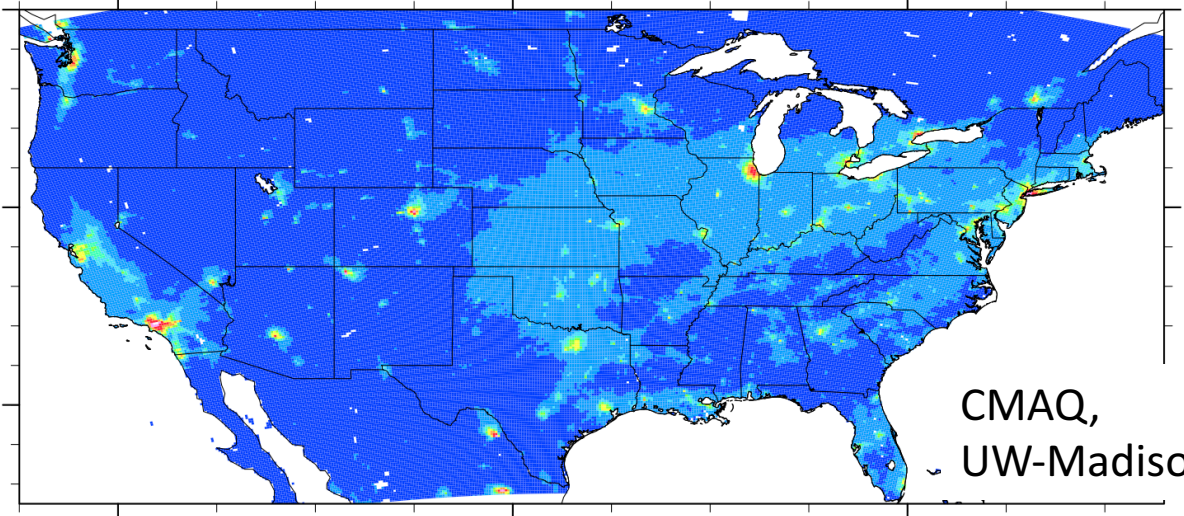
July 2011 average observed



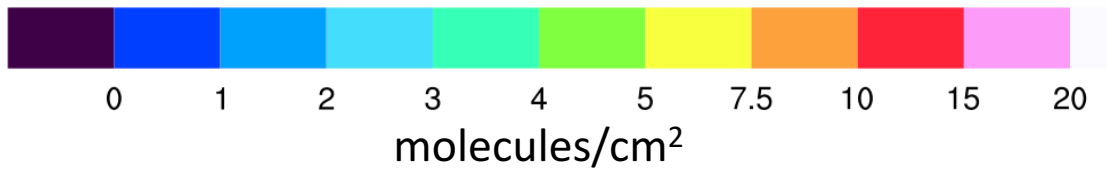
July 2011 average modeled



CAMx,  
LADCO



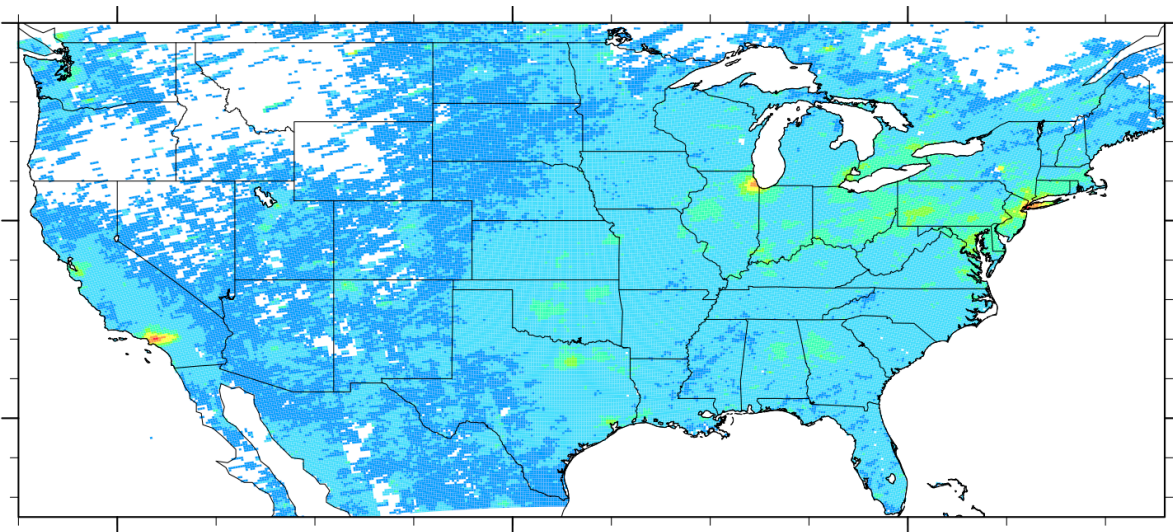
CMAQ,  
UW-Madison





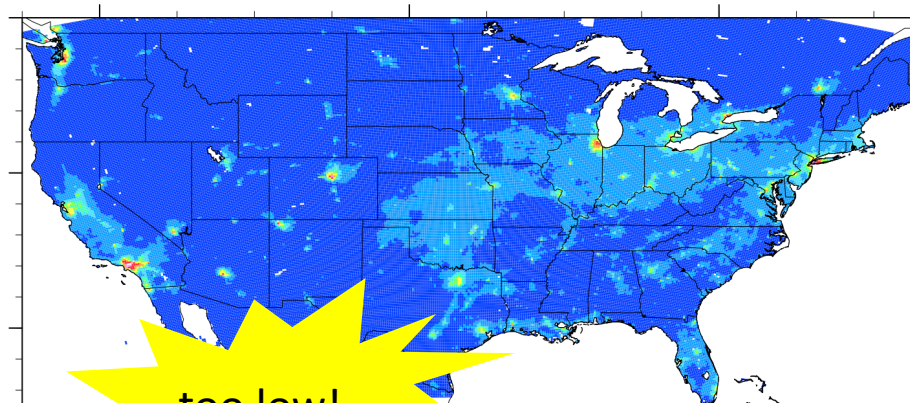
# urban-rural gradients

July 2011 average observed



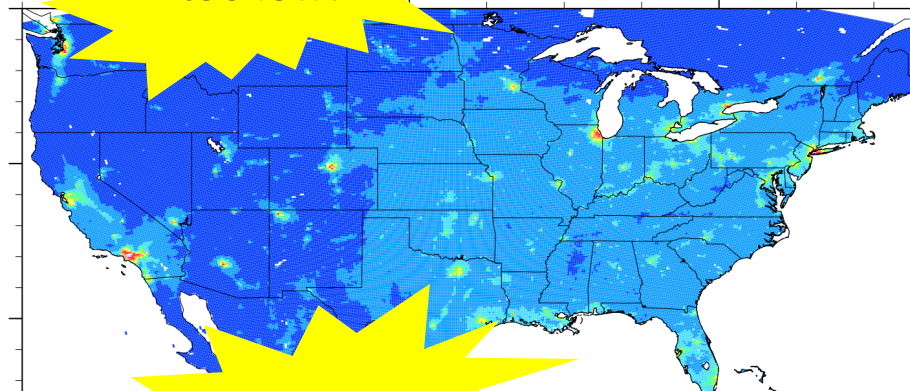
0 1 2 3 4 5 7.5 10 15 20

$\times 10^{15}$  molecules/cm<sup>2</sup>

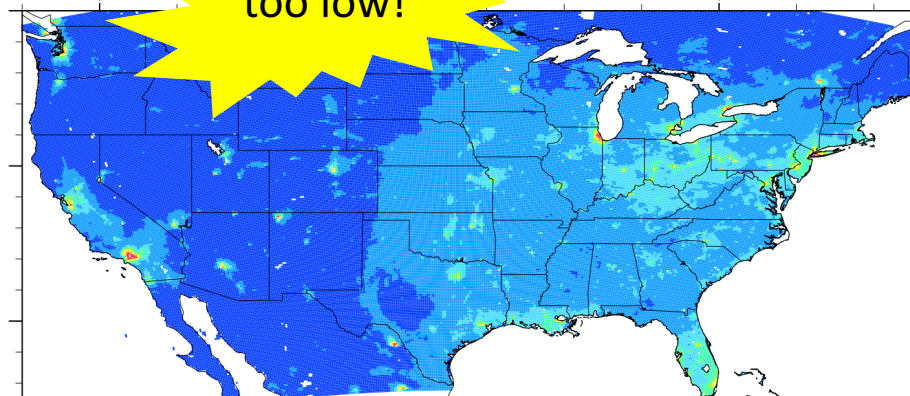


CMAQ:

with emissions  
from fires

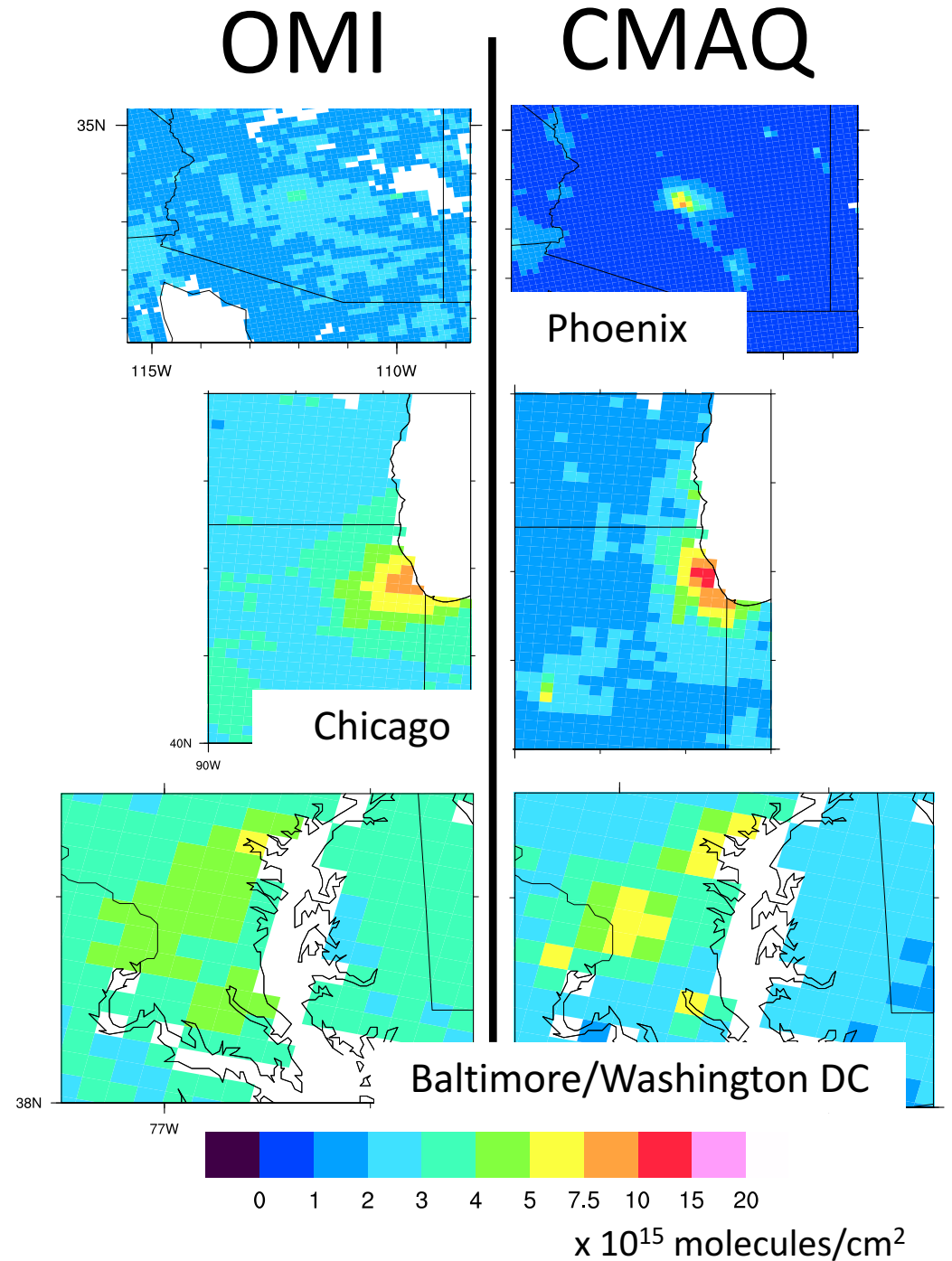
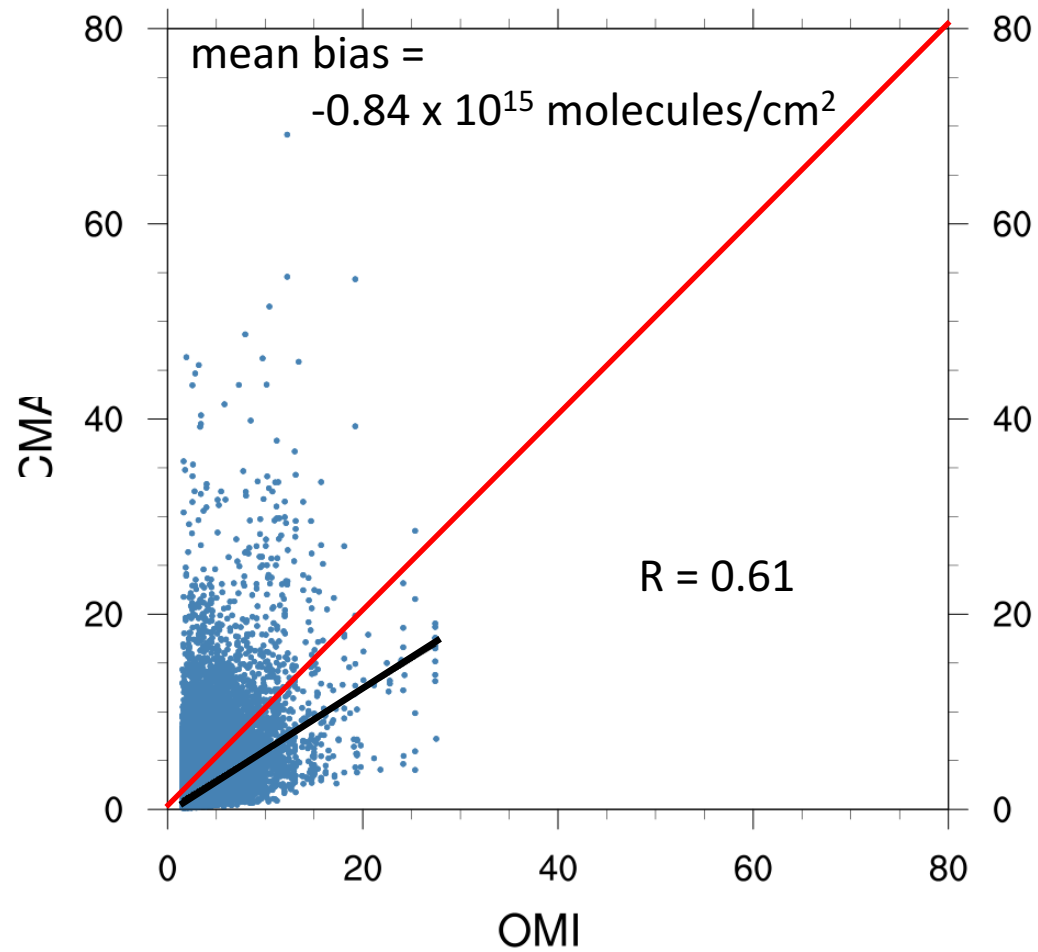


with emissions  
from fires and  
lightning



with emissions  
from fires and  
lightning,  
different  
meteorology

# urban-rural gradients



# How can OMI NO<sub>2</sub> help us learn...

- about urban-rural gradients?

modeled column NO<sub>2</sub> too low in non-urban areas; too high in urban areas  
uncertainties in LNO<sub>x</sub>? aviation emissions?

- from scaling for near-surface amounts?

- from assimilating OMI NO<sub>2</sub> observations?

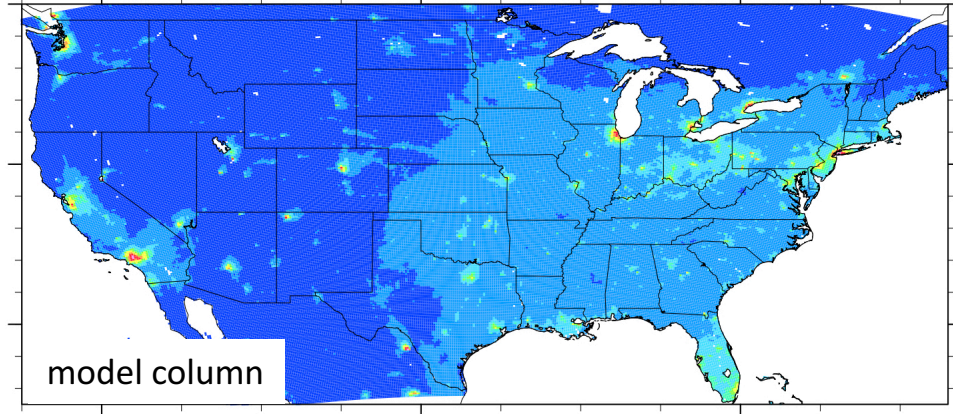
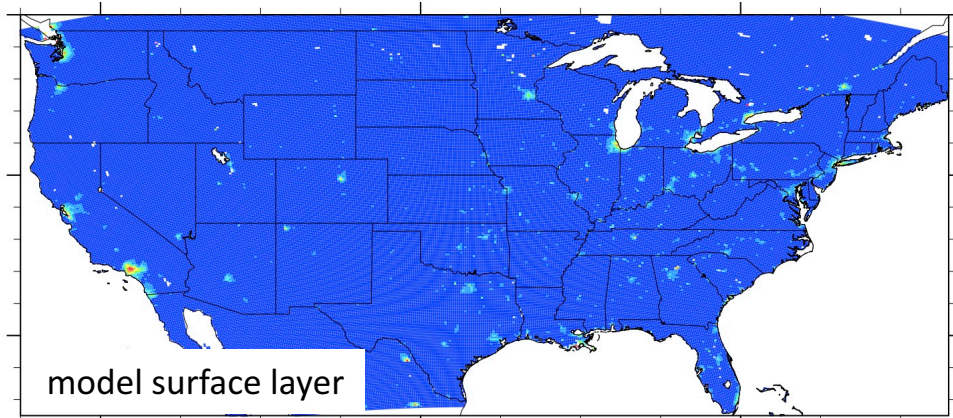


# scaling OMI NO<sub>2</sub> for near-surface amounts

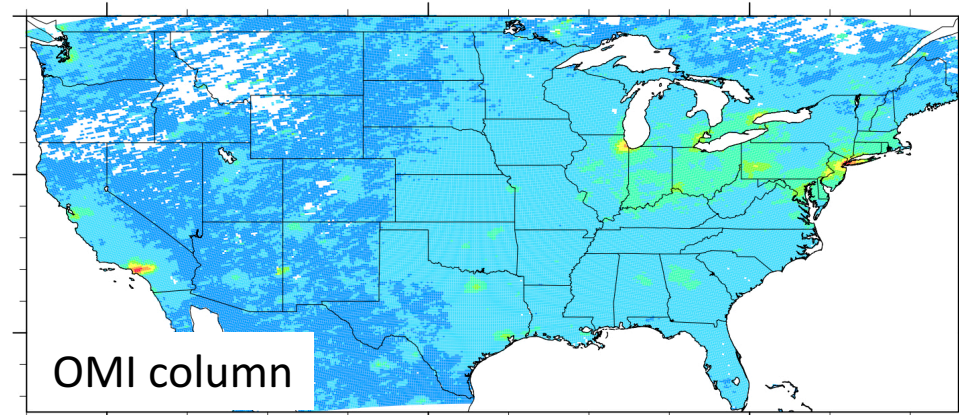
model surface layer  
model column

=

scaled OMI surface layer  
OMI column



X

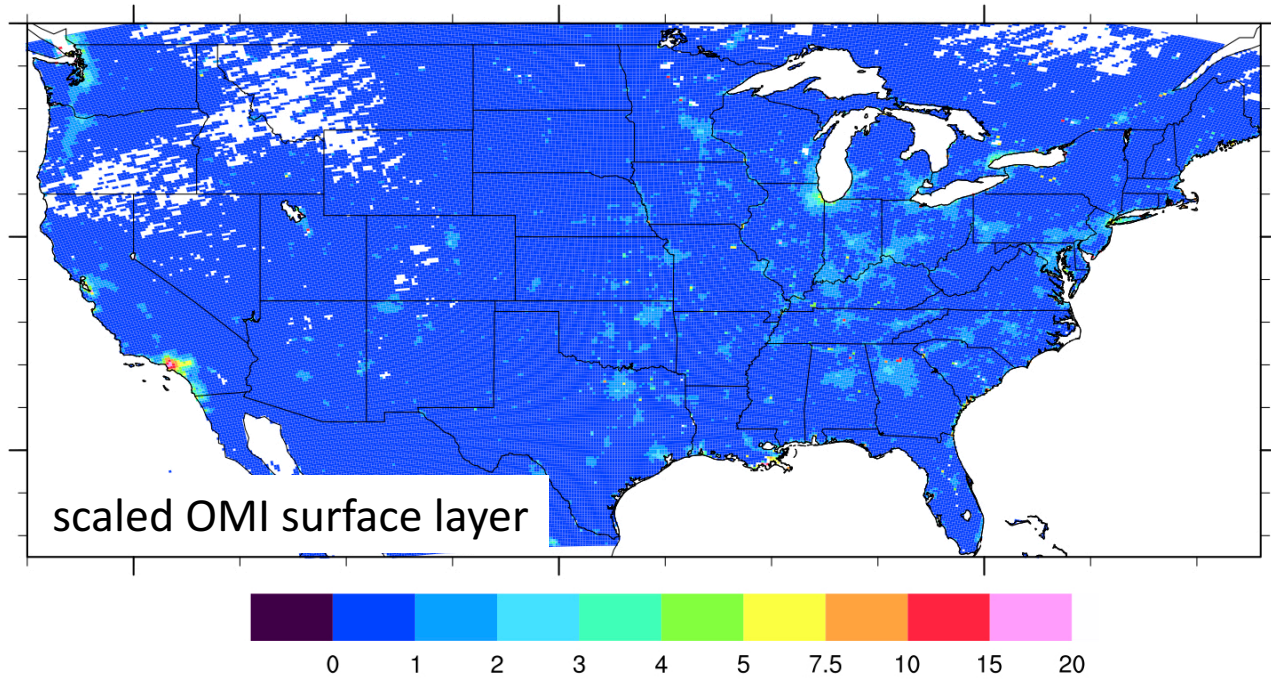


=

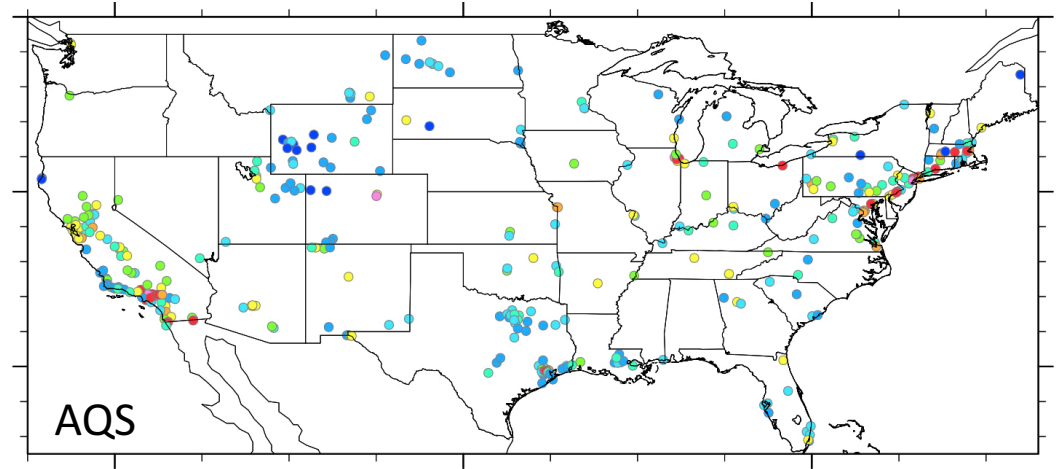
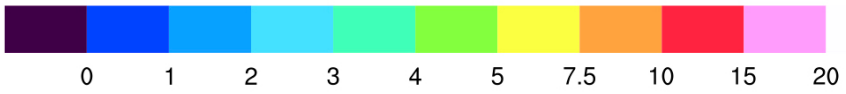
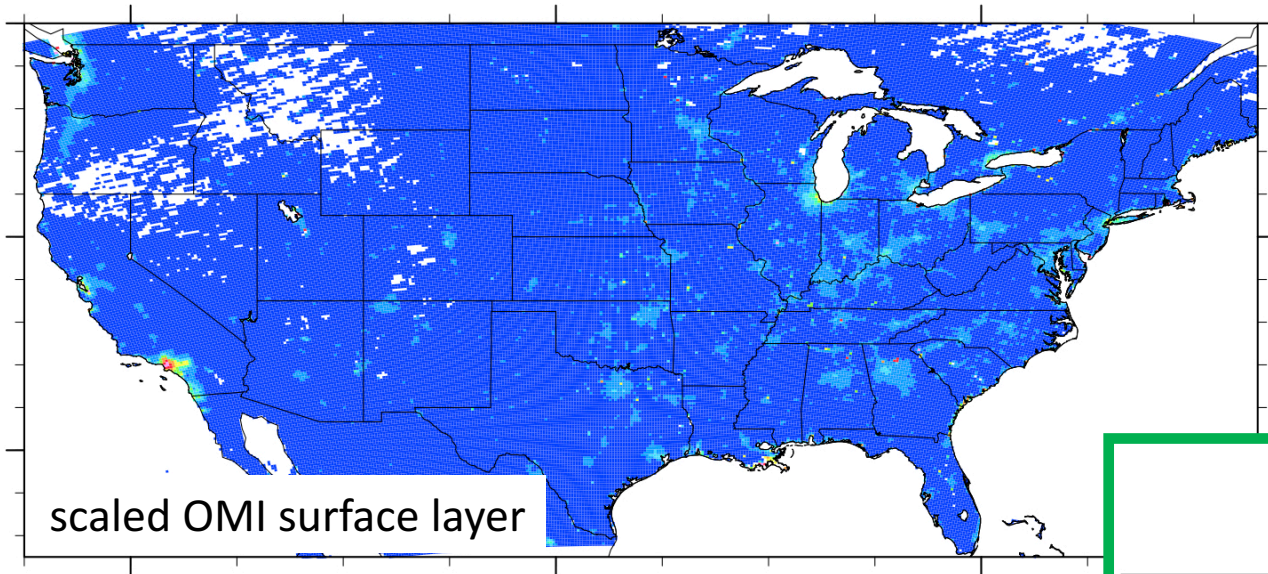




# scaling OMI NO<sub>2</sub> for near-surface amounts



# scaling OMI NO<sub>2</sub> for near-surface amounts



	average	RMSE	Mean Error	Mean Fractional Error	Mean Bias	Mean Fractional Bias
AQS	4.590					
CMAQ surface	1.946	3.807	3.016	95.707	-2.534	-84.565
scaled-surface OMI	3.216	4.541	1.343	28.685	-0.614	-21.278

# How can OMI NO<sub>2</sub> help us learn...

- about urban-rural gradients?

modeled column NO<sub>2</sub> too low in non-urban areas; too high in urban areas  
uncertainties in LNO<sub>x</sub>? aviation emissions?

- from scaling for near-surface amounts?

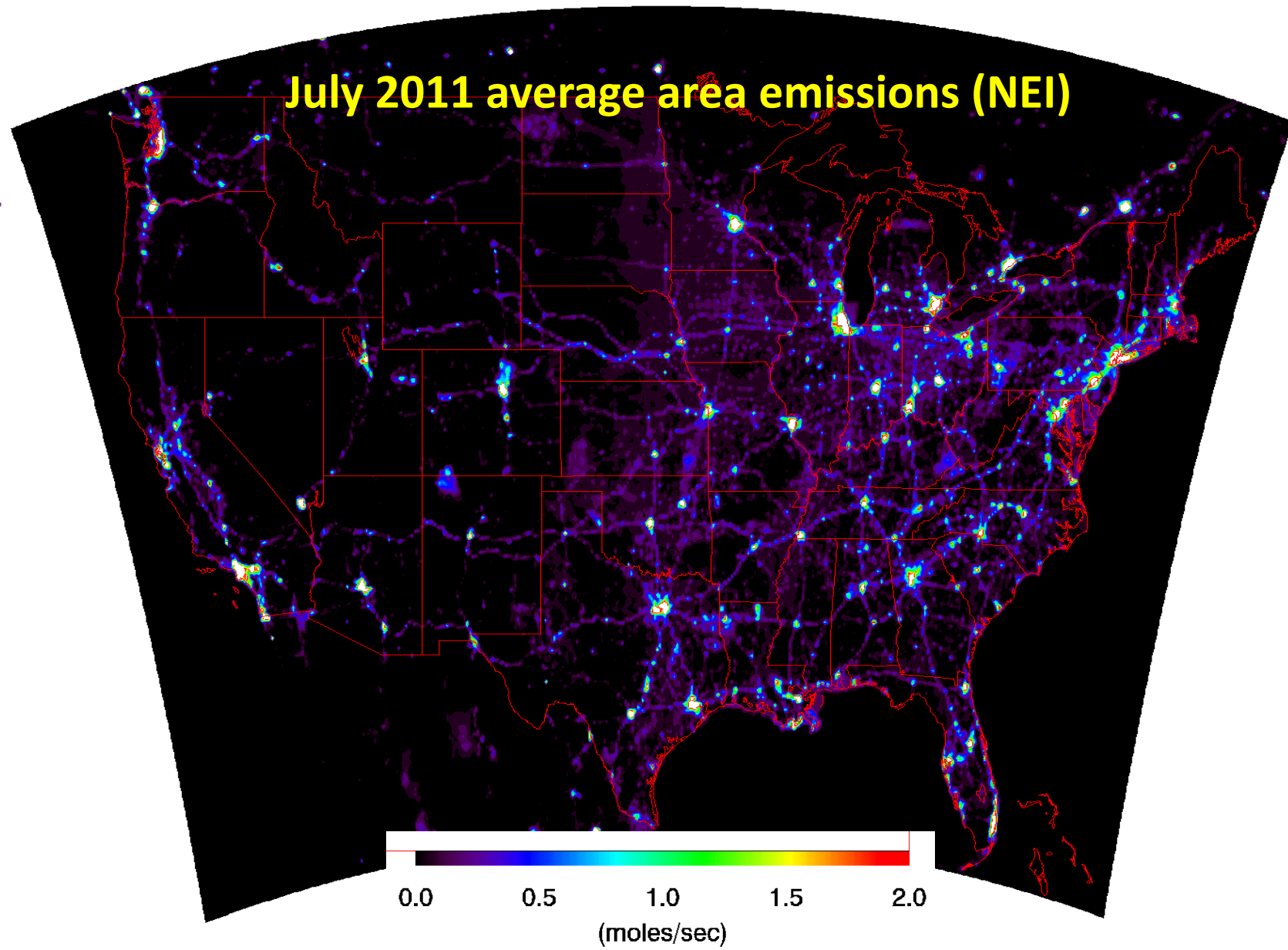
low-bias technique useful for “filling in the gaps”  
results using month averages similar to using daily values

- from assimilating OMI NO<sub>2</sub> observations?

# assimilating OMI NO<sub>2</sub> observations

adjust area NO<sub>x</sub> *emissions*

(NO<sub>2</sub> lifetime too short to use  
assimilation to constrain  
tropospheric column amounts)





# assimilating OMI NO<sub>2</sub> observations

adjust area NO<sub>2</sub> emissions

1) calculate monthly mean NO<sub>2</sub> Jacobian ( $\beta$ ) from a 15% NO<sub>x</sub> reduction perturbation experiment following *Lamsal et al. 2011*

$$\frac{\Delta E}{E} = \beta \times \frac{\Delta \Omega}{\Omega}.$$

2) calculate monthly mean NO<sub>2</sub> analysis increment using CMAQ + OMI NO<sub>2</sub> assimilation

$$\frac{\Delta E}{E} = \beta \times \frac{\Delta \Omega}{\Omega}.$$

3) adjust 2011 NEI NO<sub>2</sub> emissions using Jacobian and analysis increment

$$\frac{\Delta E}{E} = \beta \times \frac{\Delta \Omega}{\Omega}.$$

# assimilating OMI NO<sub>2</sub> observations

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1) calculate monthly mean NO<sub>2</sub> Jacobian ( $\beta$ ) from a 15% NO<sub>x</sub> reduction perturbation experiment following *Lamsal et al. 2011*

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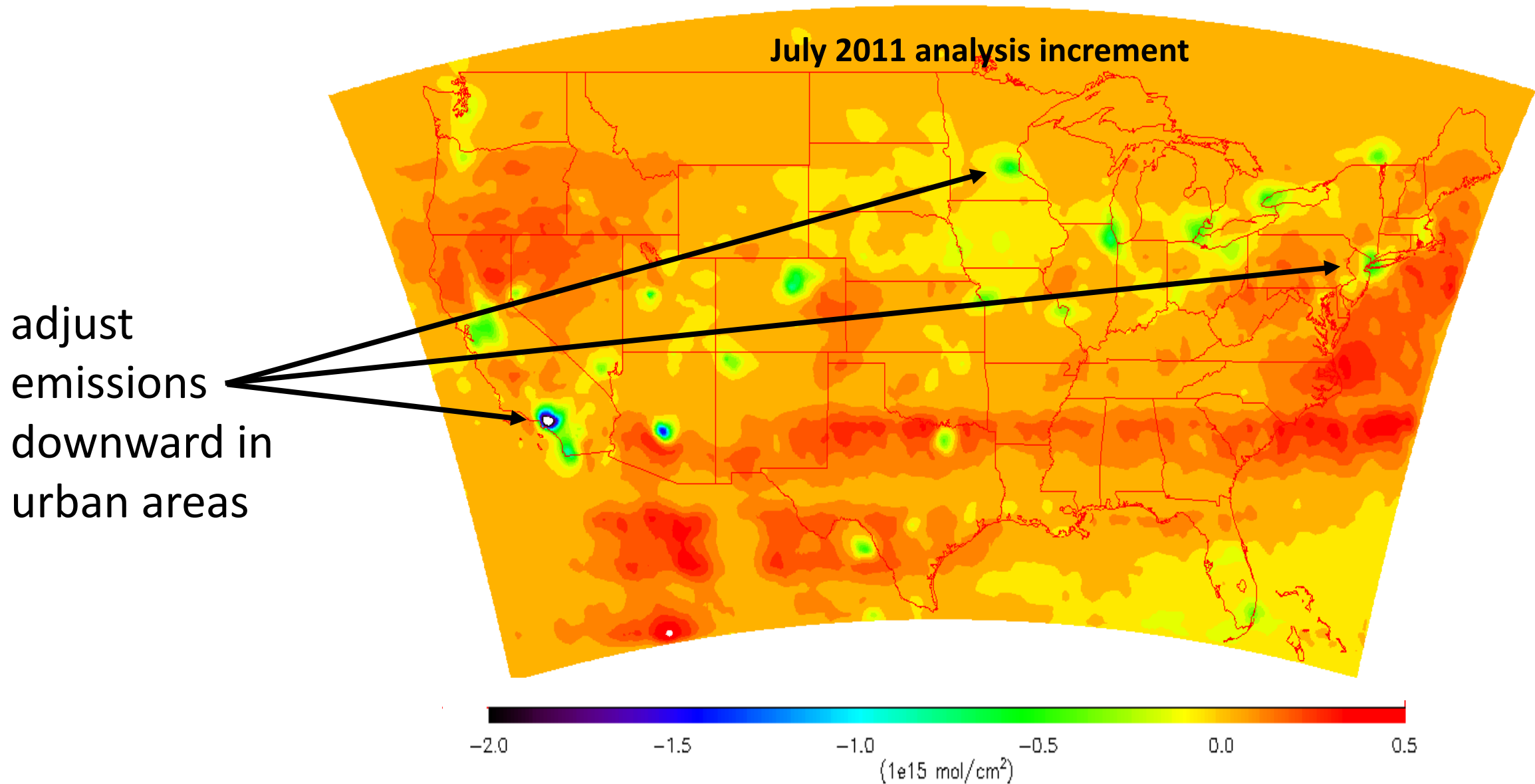
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$$\frac{\Delta E}{E} = \beta \times \frac{\Delta \Omega}{\Omega}.$$

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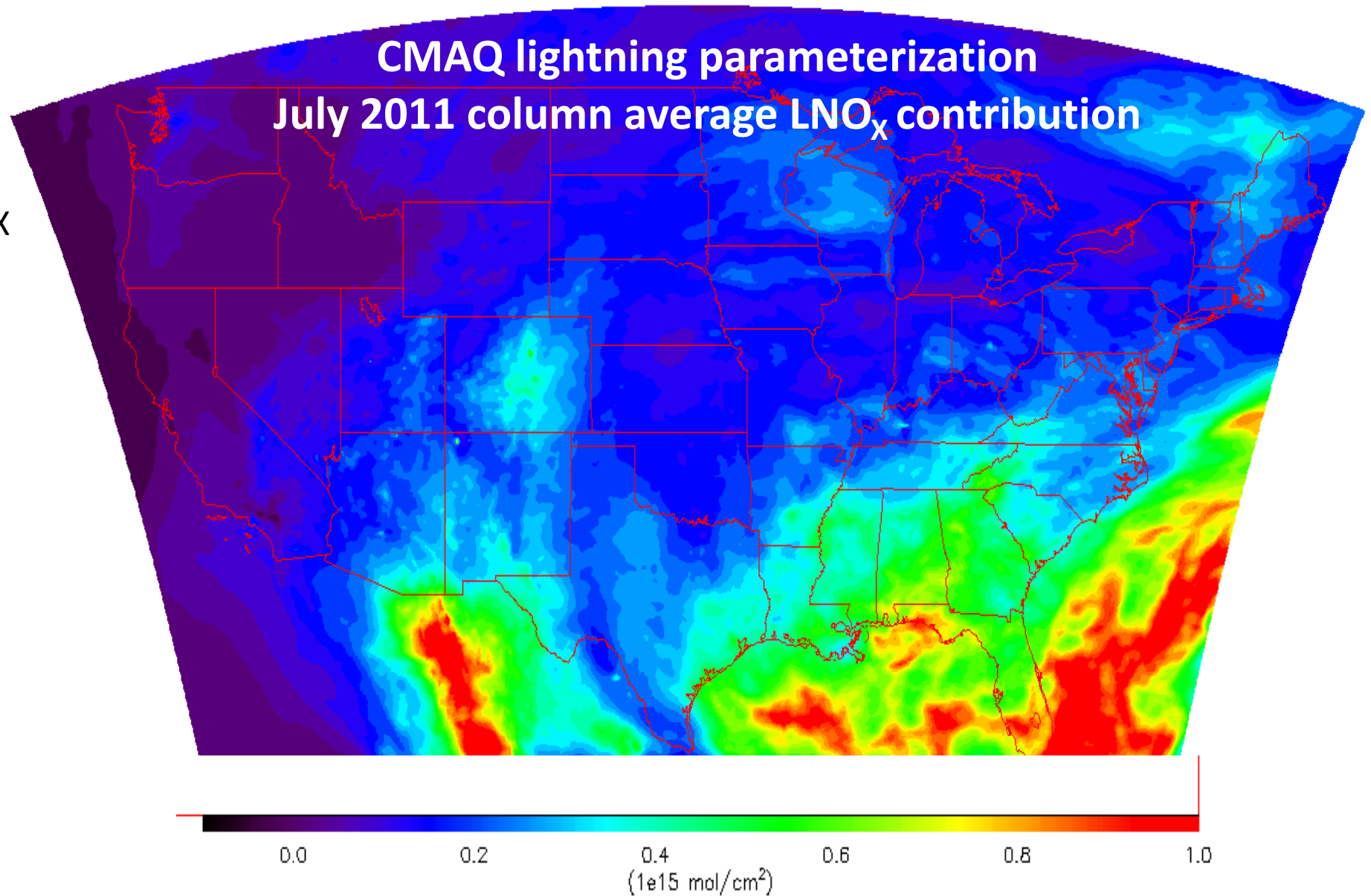
$$\frac{\Delta E}{E} = \beta \times \frac{\Delta \Omega}{\Omega}.$$

# assimilating OMI NO<sub>2</sub> observations



# assimilating OMI NO<sub>2</sub> observations

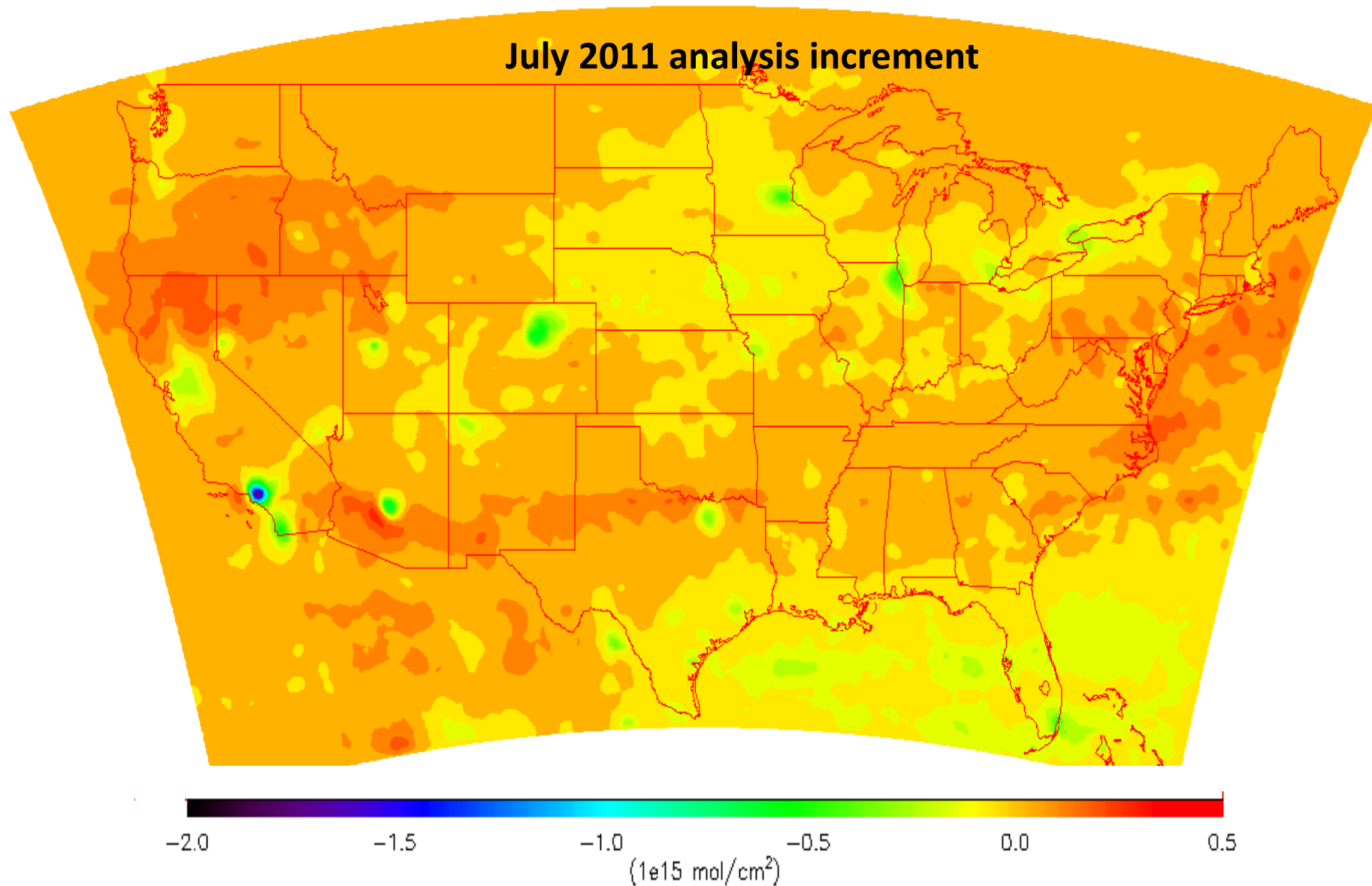
adjust lightning NO<sub>x</sub>  
emissions





# assimilating OMI NO<sub>2</sub> observations

adjust lightning NO<sub>x</sub>  
emissions

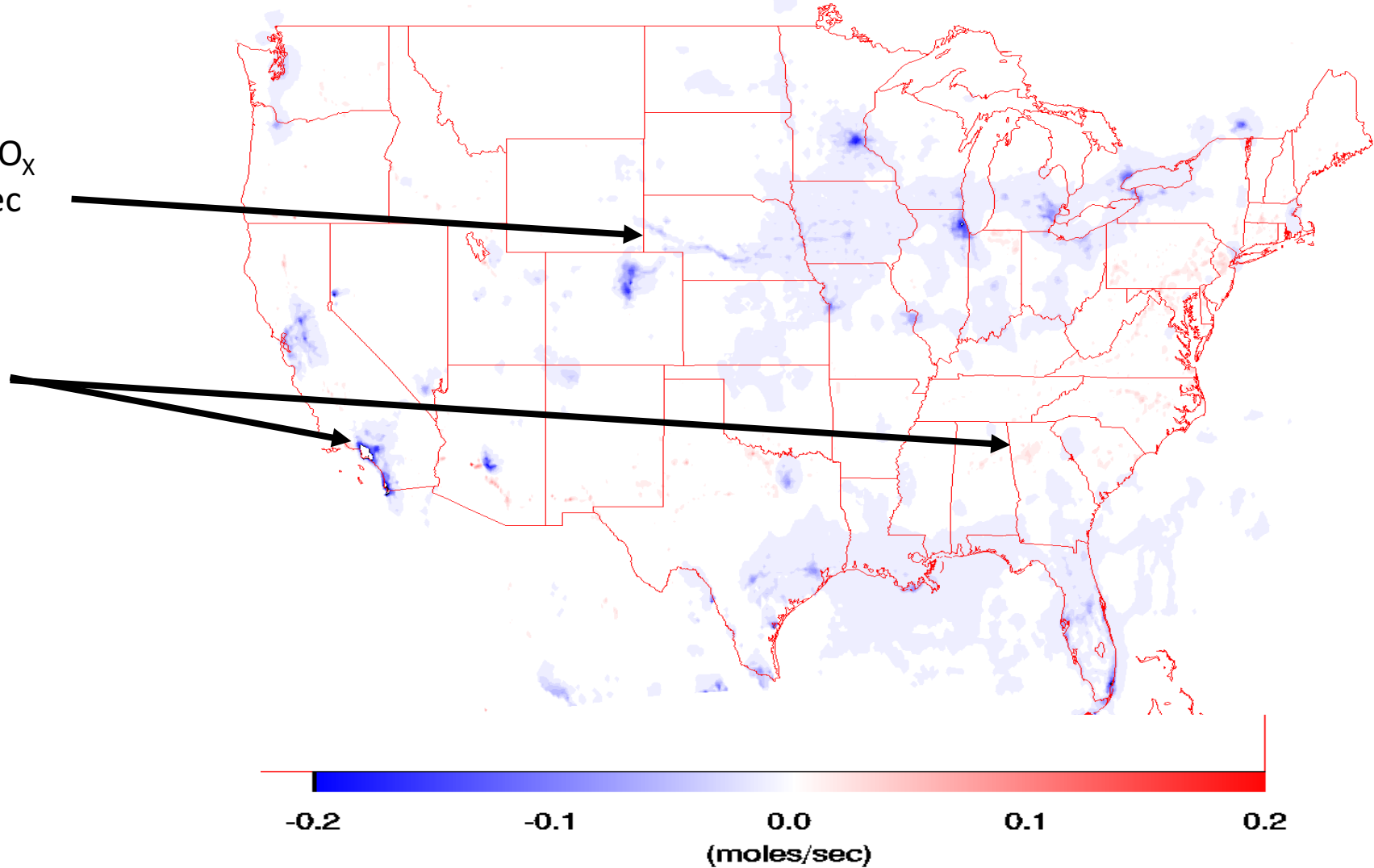


# assimilating OMI NO<sub>2</sub> observations

## July 2011 area-source emissions adjustment

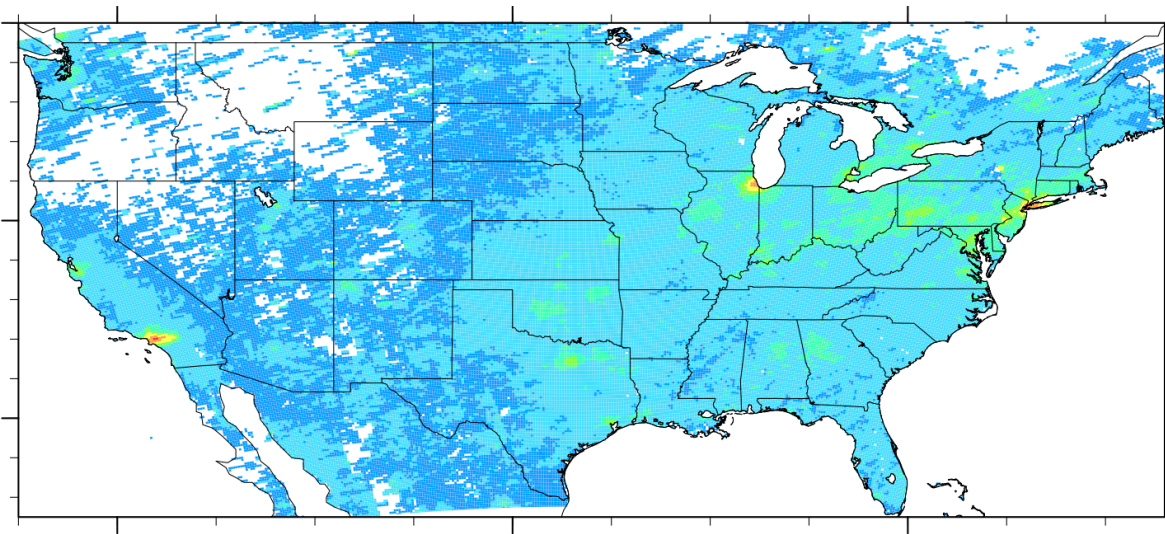
transportation-related NO<sub>x</sub>  
emissions ~ 0.3 moles/sec

NO<sub>x</sub> emissions in urban  
areas ≥ 2 moles/sec

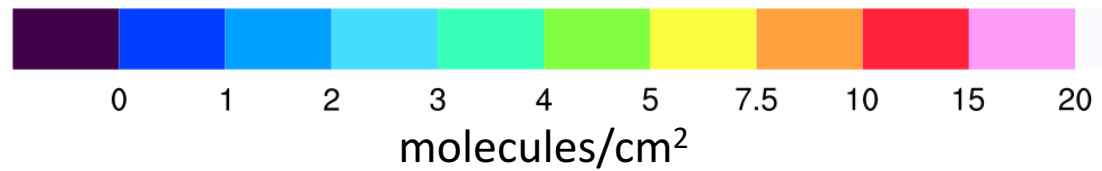
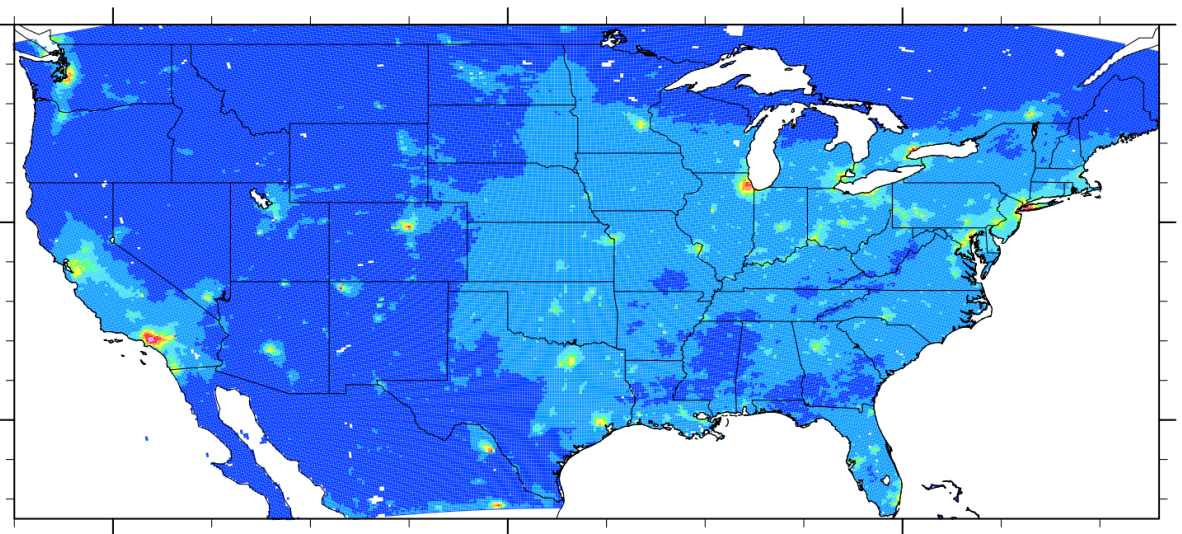


# (not) assimilating OMI NO<sub>2</sub>

July 2011 average observed

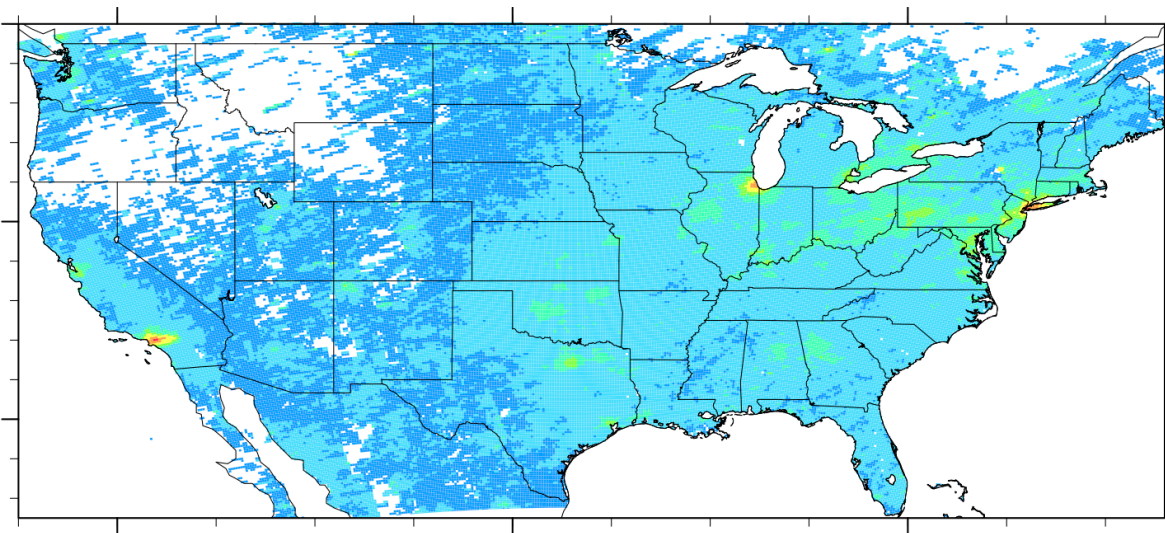


July 2011 average modeled  
(original emissions)

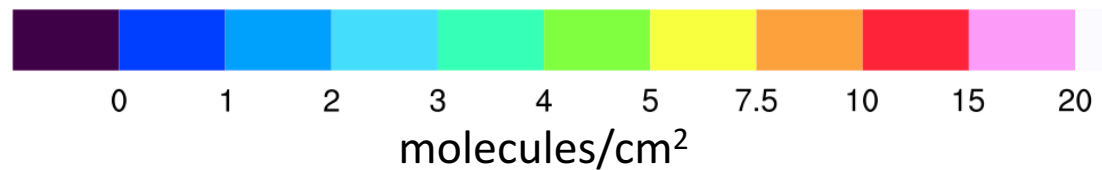
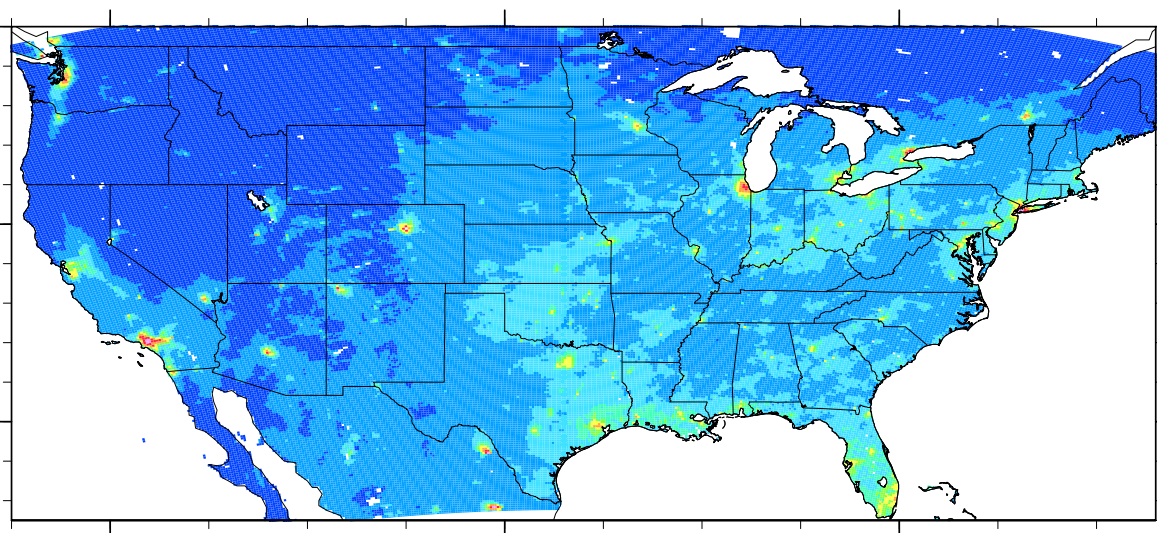


# assimilating OMI NO<sub>2</sub>

July 2011 average observed

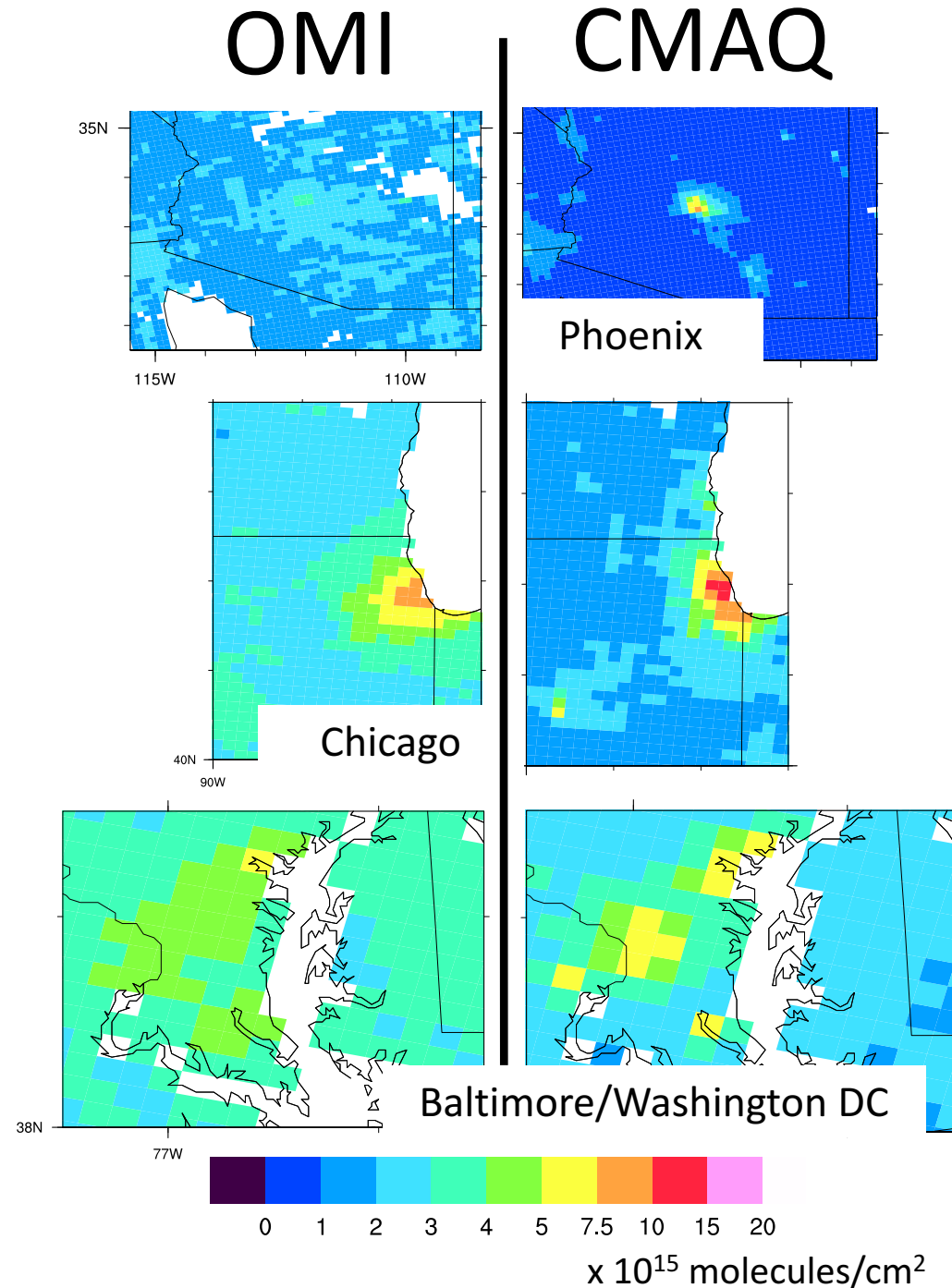
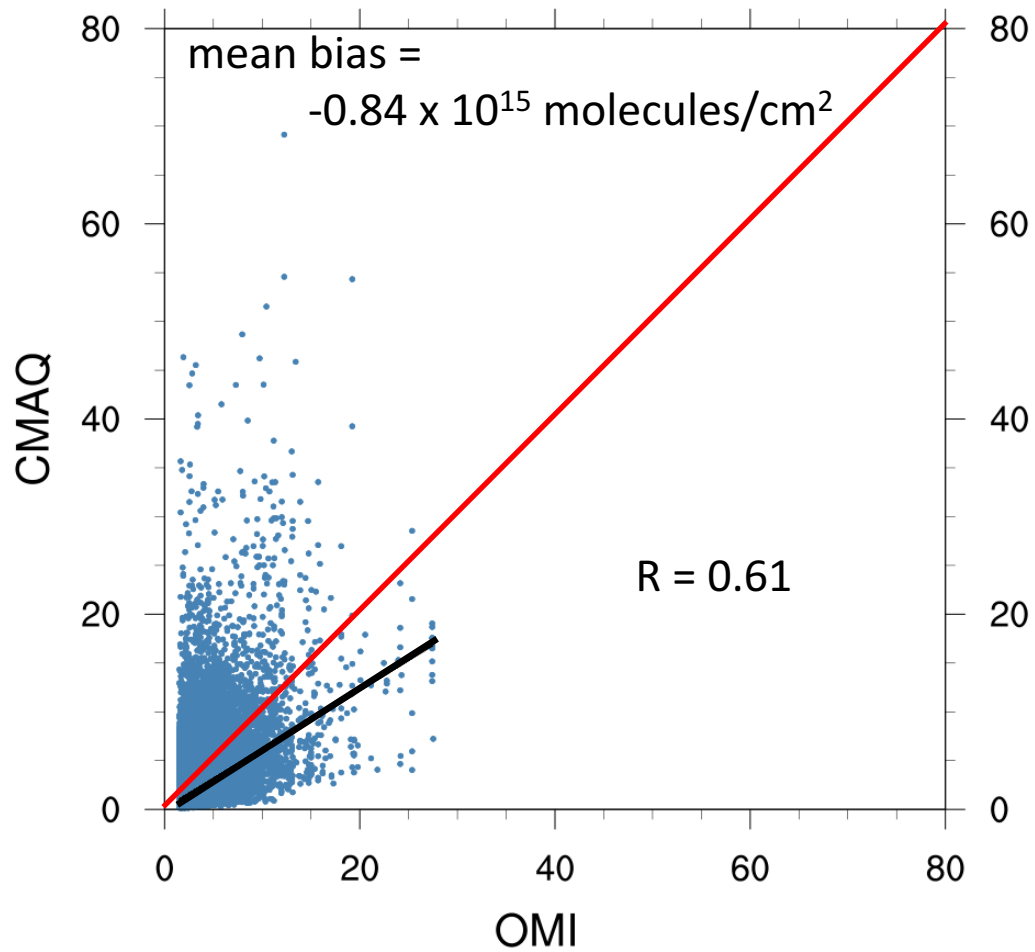


July 2011 average modeled  
(adjusted emissions)

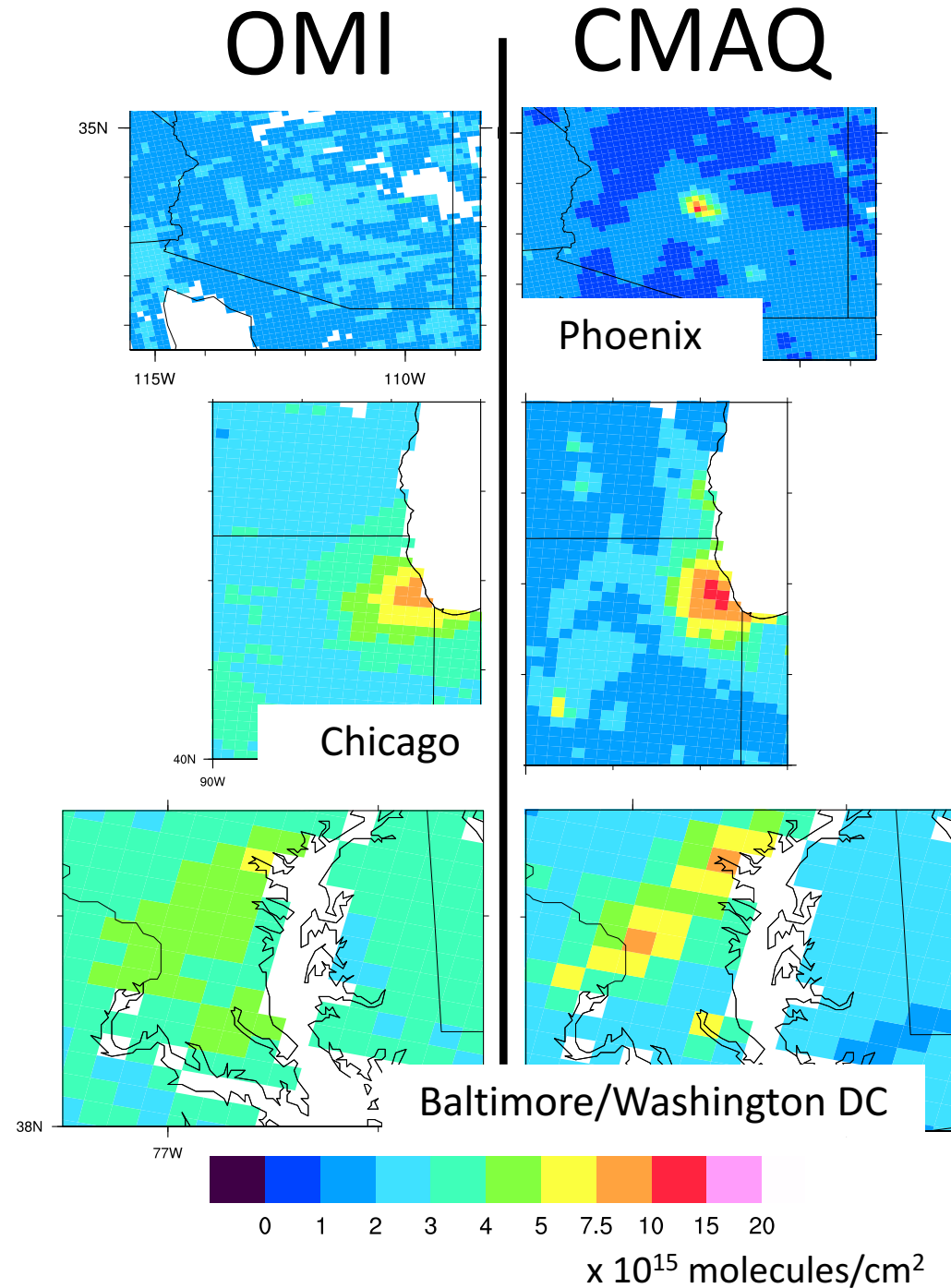
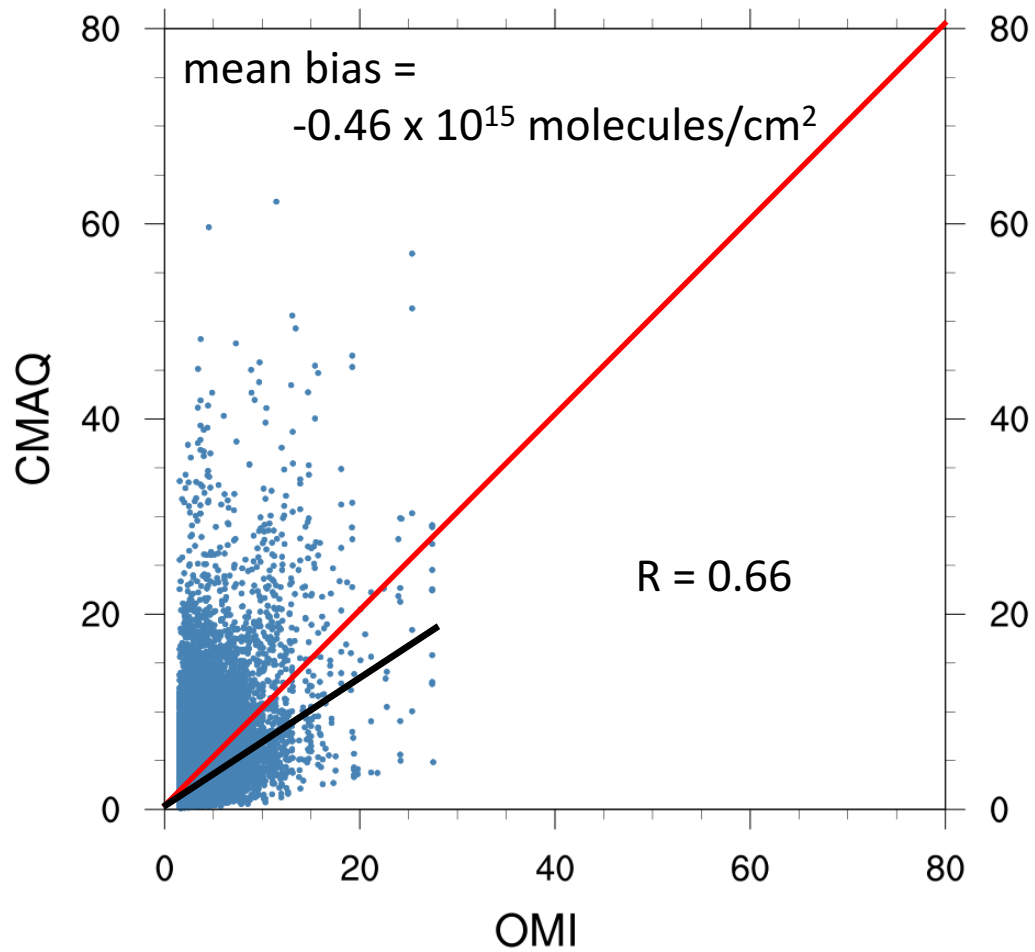




# (not) assimilating OMI NO<sub>2</sub>



# assimilating OMI NO<sub>2</sub>



# How can OMI NO<sub>2</sub> help us learn...

- about urban-rural gradients?

modeled column NO<sub>2</sub> too low in non-urban areas; too high in urban areas  
uncertainties in LNO<sub>x</sub>? aviation emissions?

- from scaling for near-surface amounts?

low-bias technique useful for “filling in the gaps”  
results using month averages similar to using daily values

- from assimilating OMI NO<sub>2</sub> observations?

NO<sub>x</sub> emissions may be adjusted downward in most large urban areas  
emissions of lightning NO<sub>x</sub> important  
adjusted emissions improve model-satellite column NO<sub>2</sub> agreement

# What can we learn from OMI NO<sub>2</sub>?

- model evaluation and data assimilation show urban NO<sub>x</sub> tends to be too high
- uncertainties with lightning NO<sub>x</sub>, emissions from aviation at cruising altitude
- scaled-to-surface satellite observations may be helpful in evaluating emissions and trends away from ground-based monitors



# More OMI NO<sub>2</sub> utility:



**NELSON INSTITUTE**  
**SAGE** Center for  
Sustainability and the  
Global Environment  
UNIVERSITY OF WISCONSIN-MADISON

[mkharkey@wisc.edu](mailto:mkharkey@wisc.edu)

**AGU PUBLICATIONS**

## Journal of Geophysical Research: Atmospheres

RESEARCH ARTICLE  
10.1002/2015JD023316

**Key Point:**

- CMAQ NO<sub>2</sub> evaluated using observed chemistry-meteorology relationships

Supporting Information:  
• Tables C1-C2 and Figures C1-C14

### An evaluation of CMAQ NO<sub>2</sub> using observed chemistry-meteorology correlations

Monica Harkey<sup>1</sup>, Tracey Holloway<sup>1</sup>, Jacob Oberman<sup>1</sup>, and Erica Scotty<sup>1</sup>

<sup>1</sup>Nelson Institute Center for Sustainability and the Global Environment, University of Wisconsin-Madison, Madison, Wisconsin, USA

JGR

**AGU PUBLICATIONS**

## Journal of Geophysical Research: Atmospheres

RESEARCH ARTICLE  
10.1002/2015JD023250

**Key Points:**

- NO<sub>2</sub> and HCHO from satellites can characterize O<sub>3</sub> production regimes and trends
- Transitional regime is dominated over eastern China in ozone season
- Cities in China are becoming increasingly VOC limited

### Spatial and temporal variability of ozone sensitivity over China observed from the Ozone Monitoring Instrument

Xiaomeng Jin<sup>1</sup> and Tracey Holloway<sup>1</sup>

<sup>1</sup>Center for Sustainable and Global Environment, Nelson Institute of Environmental Studies, University of Wisconsin-Madison, Madison, Wisconsin, USA

JGR

