

# Evaluation of NO<sub>x</sub> Emissions in the Western US using WRF-Chem Model Simulations and Satellite Observations

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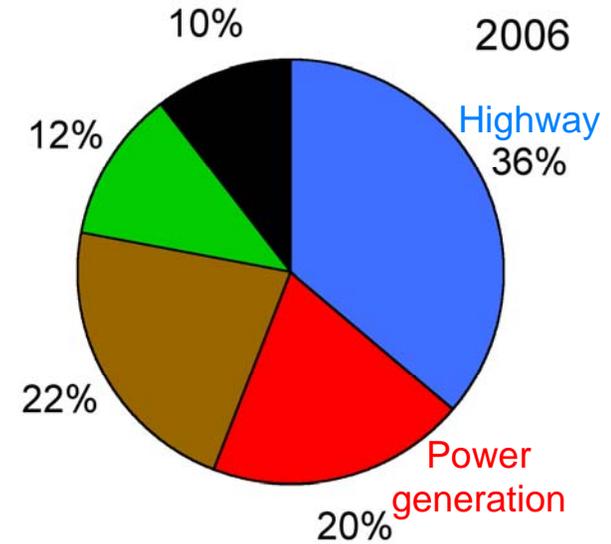
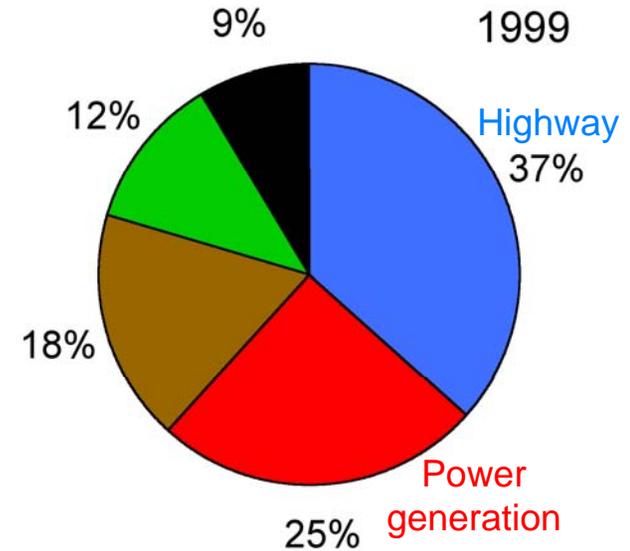
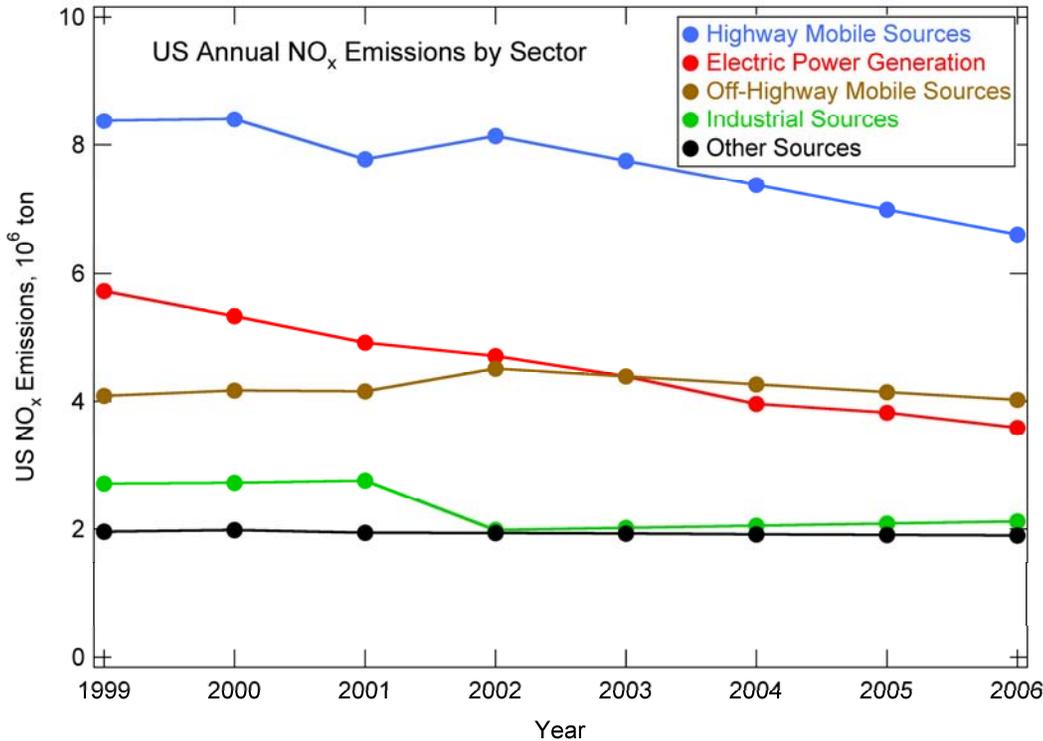
*NASA Goddard Space Flight Center, Greenbelt, Maryland*

## Outline

- Bottom-up assessment of NO<sub>x</sub> emissions
- Satellite and model determination of atmospheric NO<sub>2</sub> columns
- Review previous work: NO<sub>x</sub> emission controls at Eastern US power plants
- Analysis of NO<sub>x</sub> emissions from Western US power plants and urban areas



# EPA Assessments of US NO<sub>x</sub> Emission Trends



EPA assessments of NO<sub>x</sub> emission trends based on bottom-up inventories

- US NO<sub>x</sub> emissions have decreased 20% since 1999
- Largest decreases in two biggest sectors
  - Highway mobile sources: *emission models*
  - Electric power generation: *stack measurements*
- Power generation now smaller contributor

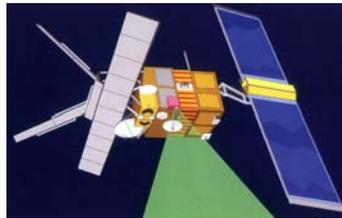
# Satellite Measurements of NO<sub>2</sub> Vertical Columns

NO<sub>x</sub> emissions  $\propto$  NO<sub>2</sub> columns (summer day  $\Rightarrow$  short NO<sub>x</sub> lifetime)

## GOME

Global **O**zone **M**onitoring **E**xperiment

- On ERS-2
- August 1995 - June 2003
- Horizontal resolution: 320 × 40 km<sup>2</sup>
- Global coverage: 3 days
- Overpass time: 10:30 am local solar



## SCIAMACHY

**SC**anning **I**maging **A**bsorption spectro**M**eter  
for **A**tmospheric **CH**artograph **Y**

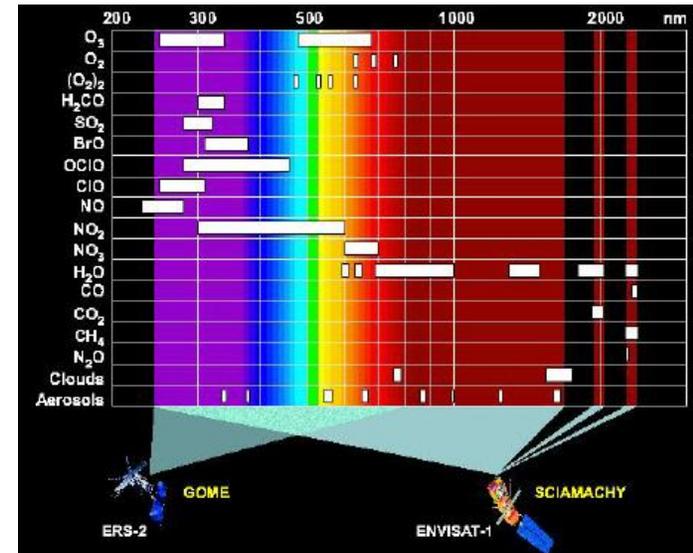
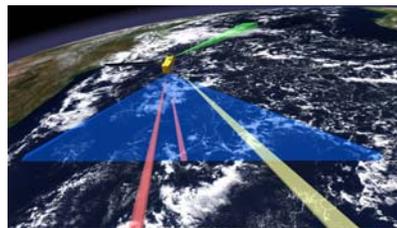
- On ENVISAT
- March 2002 ~
- Horizontal resolution: 60 × 30 km<sup>2</sup>
- Global coverage: 6 days
- Overpass time: 10:30 am local solar



## OMI

Ozone **M**onitoring **I**nstrument

- On EOS-Aura
- November 2004 ~
- Horizontal resolution: 13 × 24 km<sup>2</sup>
- Global coverage: 1 day
- Overpass time: 1:30 pm local solar



## Extracting NO<sub>2</sub> vertical columns

- Measure NO<sub>2</sub> absorption: DOAS
- Remove stratospheric component
- Cloud filtering: cloud fraction < 0.15
- Convert tropospheric residual to vertical column
  - vertical sensitivity: radiative transfer model
  - air mass factor: chemical transport model

# WRF-Chem Modeling of NO<sub>2</sub> Vertical Columns

**Weather Research and Forecasting - Chemistry** model

- [www.wrf-model.org/WG11](http://www.wrf-model.org/WG11)
- Simulates atmospheric chemistry online within WRF meteorological model
- Various chemical mechanisms, aerosol modules
- Variety of treatments of planetary boundary layer, microphysics, radiation, and convection

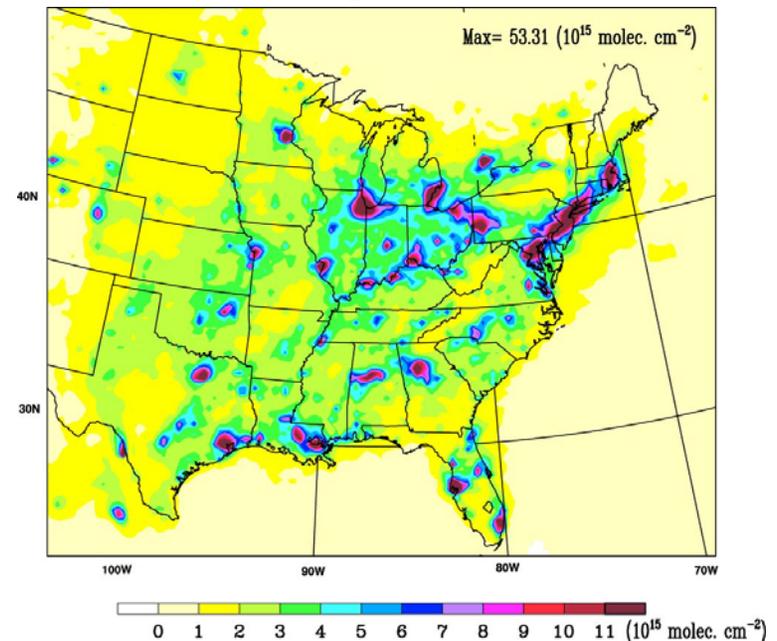
*Setup for these case studies*

- Eastern US
  - Summer 2004 simulation period
  - 27 x 27 km<sup>2</sup> horizontal resolution
- Western US
  - Summer 2005 simulation period
  - 15 x 15 km<sup>2</sup> horizontal resolution
- Emissions
  - EPA NEI1999 updated with 2004/2005 CEMS power plant data

NOAA ESRL High Performance Computing System



WRF-Chem Summer 2004  
Average NO<sub>2</sub> Vertical Columns



## Previous Work: NO<sub>x</sub> Controls at Eastern US Power Plants



Examine effects of NO<sub>x</sub> controls on large point sources in the Eastern US beginning in the late 1990s

- National and regional pollution control programs
- Focus on coal-burning power plants
- Improved burner technology, post-burner ammonia scrubbers

*S.-W. Kim et al. (2006), Satellite-observed US power plant NO<sub>x</sub> emission reductions and their impact on air quality, Geophys. Res. Lett., 33, L22812, doi:10.1029/2006GL02774*

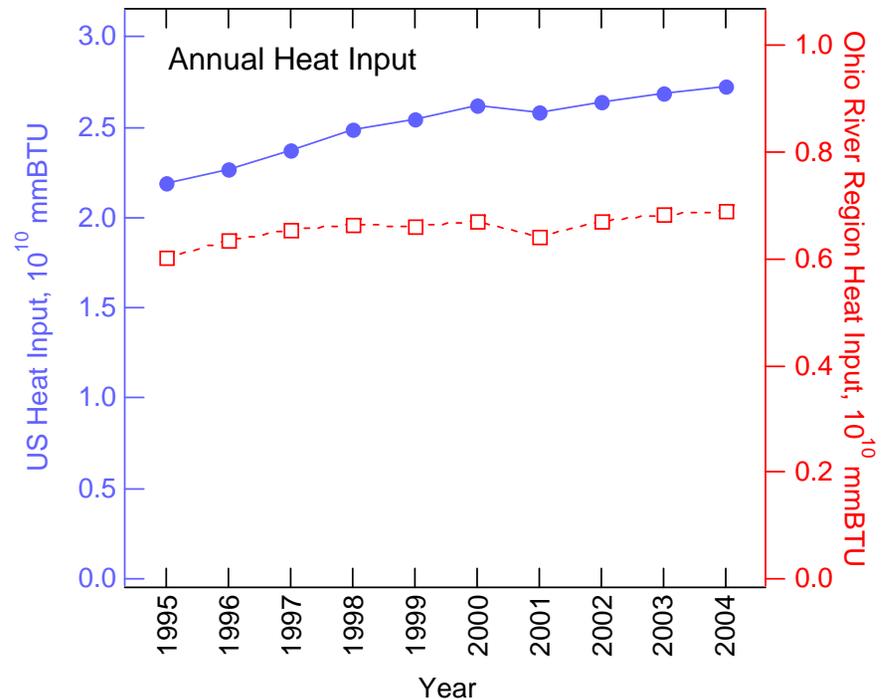
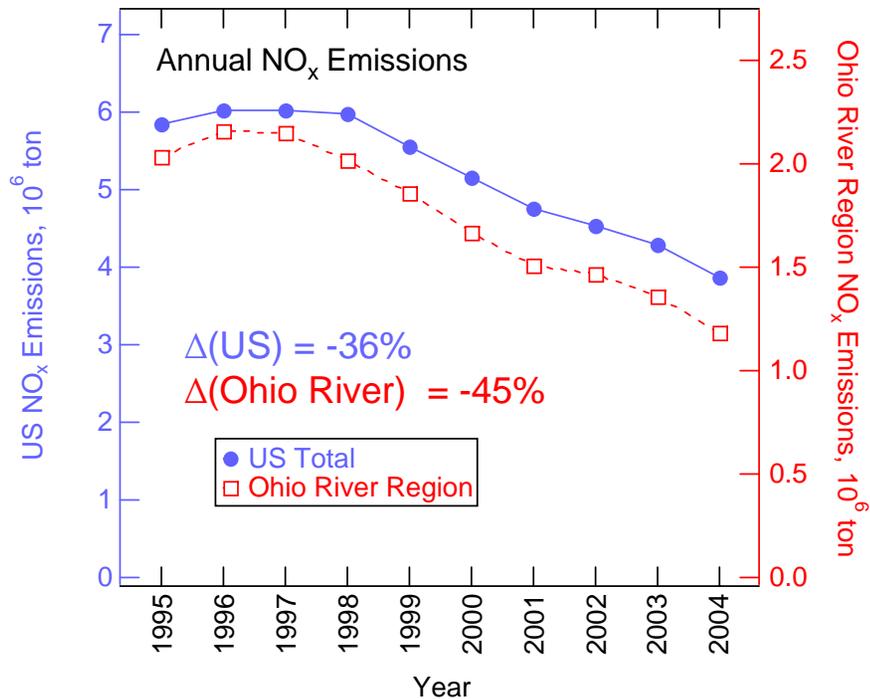


# Power Plant NO<sub>x</sub> Emission Decreases Measured by CEMS

## Continuous Emission Monitoring Systems (CEMS)

- Stack measurements of hourly NO<sub>x</sub>, SO<sub>2</sub>, and CO<sub>2</sub> emissions made by utility companies
- Data for 966 facilities in 1999 and 1427 facilities in 2004

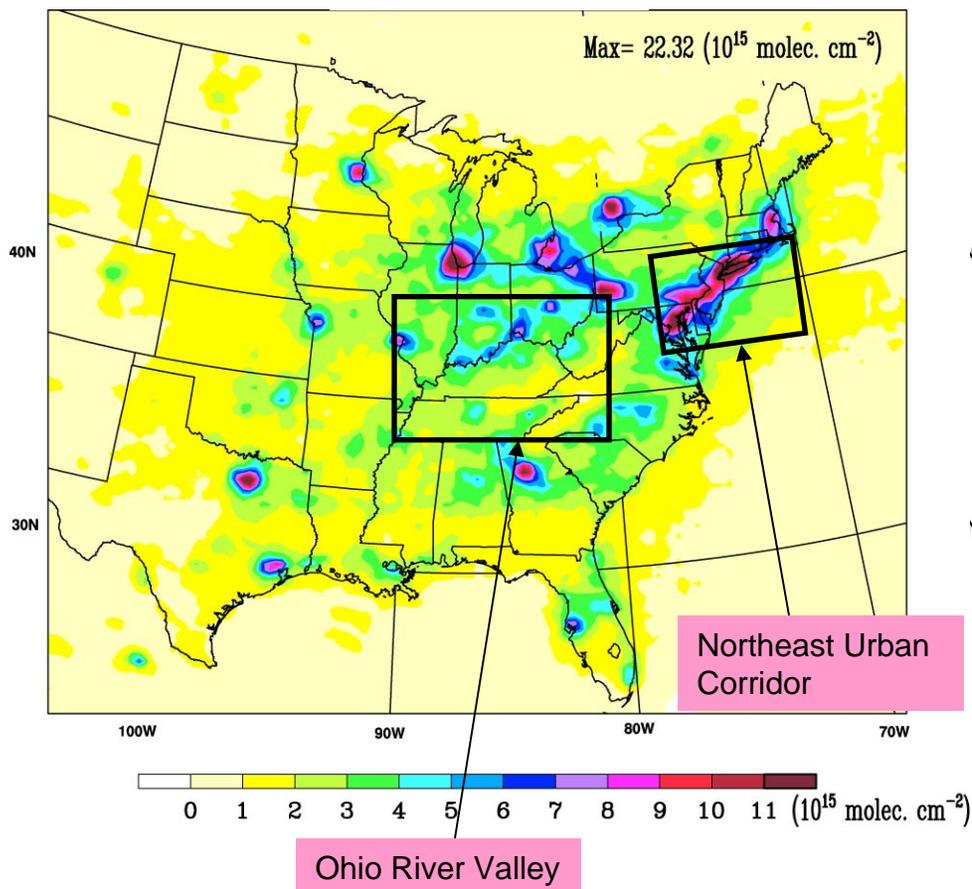
**Annual trends** ➤ Substantial NO<sub>x</sub> emission reductions since late 1990's while maintaining amount of electric power generated



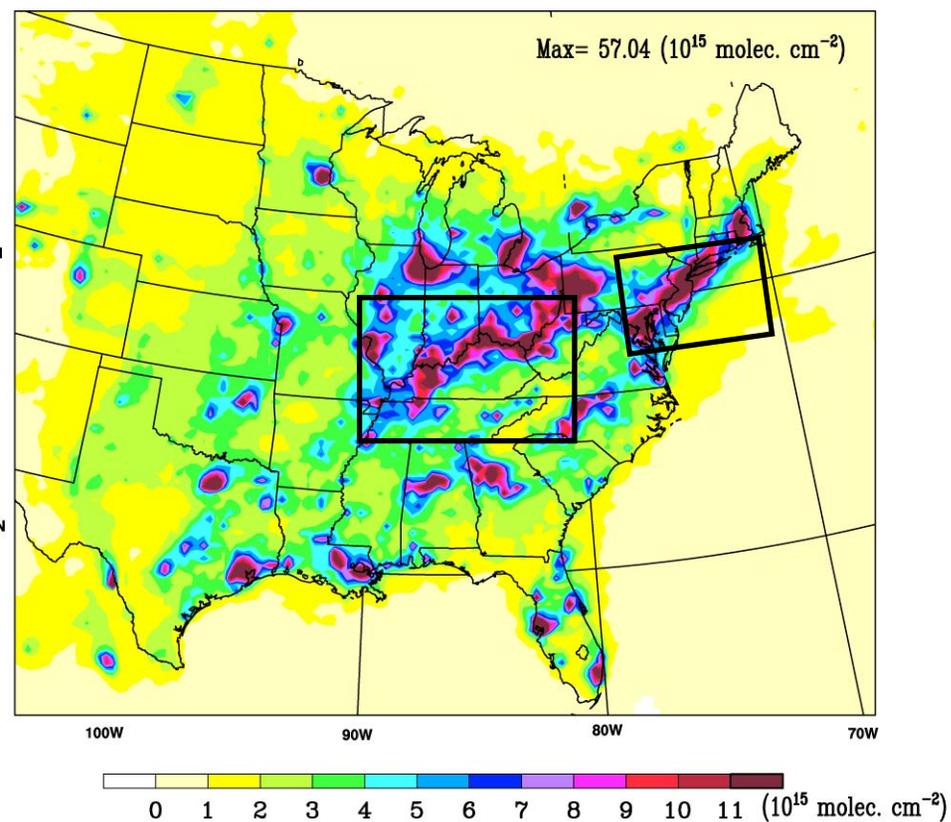
# Eastern US Power Plant NO<sub>x</sub> Emission Reductions Detected by Satellite

Summer 2004 Average NO<sub>2</sub> Vertical Columns

SCIAMACHY



WRF-Chem, Reference Emissions (NEI 99)

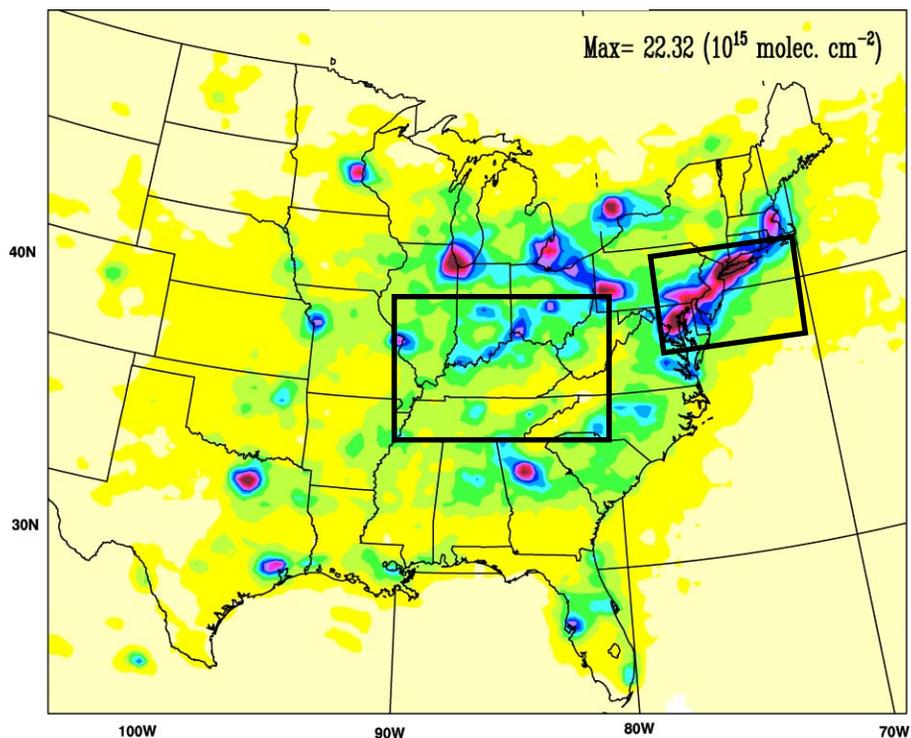


- Model reproduces satellite NO<sub>2</sub> vertical columns over urban areas
- Model NO<sub>2</sub> columns too large over power plants using 1999 emissions

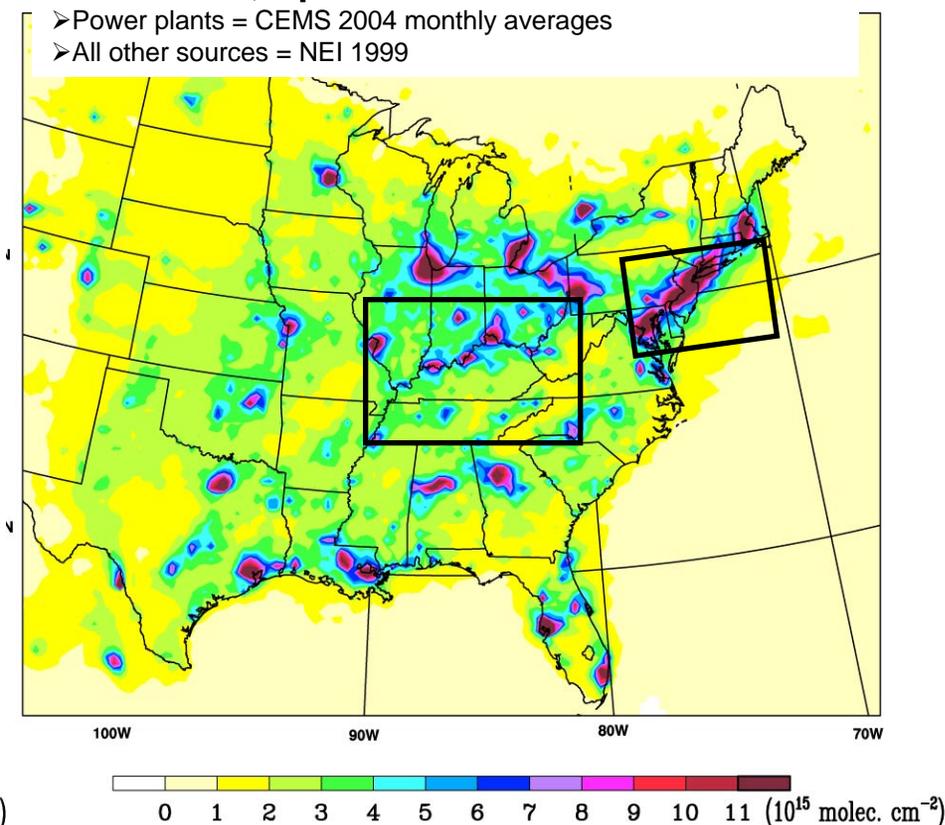
# Eastern US Power Plant NO<sub>x</sub> Emission Reductions Detected by Satellite

Summer 2004 Average NO<sub>2</sub> Vertical Columns

## SCIAMACHY



## WRF-Chem, Updated Power Plant Emissions

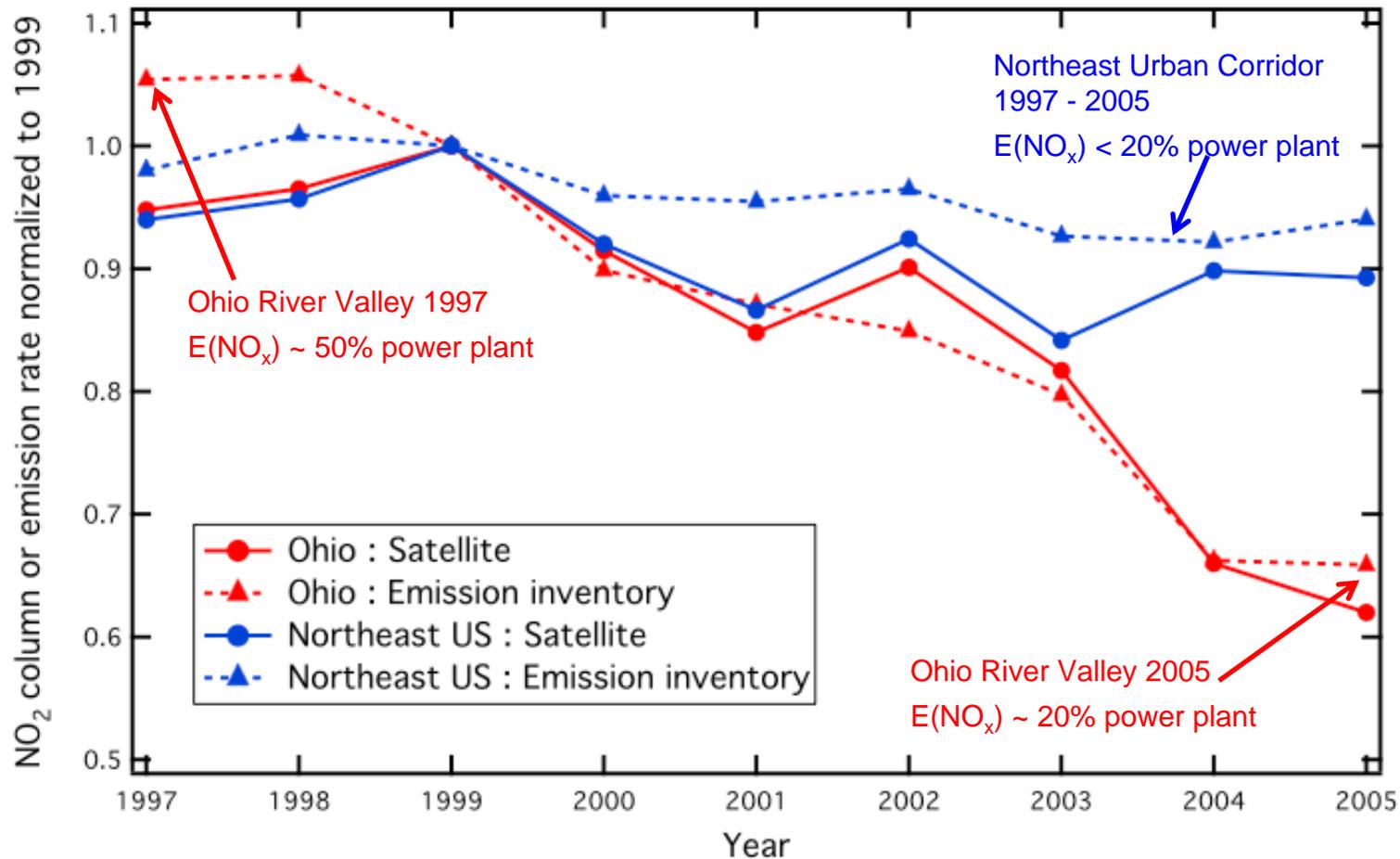


➤ Model with summer 2004 power plant emissions agrees much better with satellite NO<sub>2</sub> columns over power plants

➤ *Satellite detects changes in Ohio River Valley from recent power plant NO<sub>x</sub> emission controls*

S.-W. Kim et al. (2006), Satellite-observed US power plant NO<sub>x</sub> emission reductions and their impact on air quality, *Geophys. Res. Lett.*, 33, L22812, doi:10.1029/2006GL027749

# Year-to-Year Trends in Eastern US Satellite NO<sub>2</sub> and Emissions



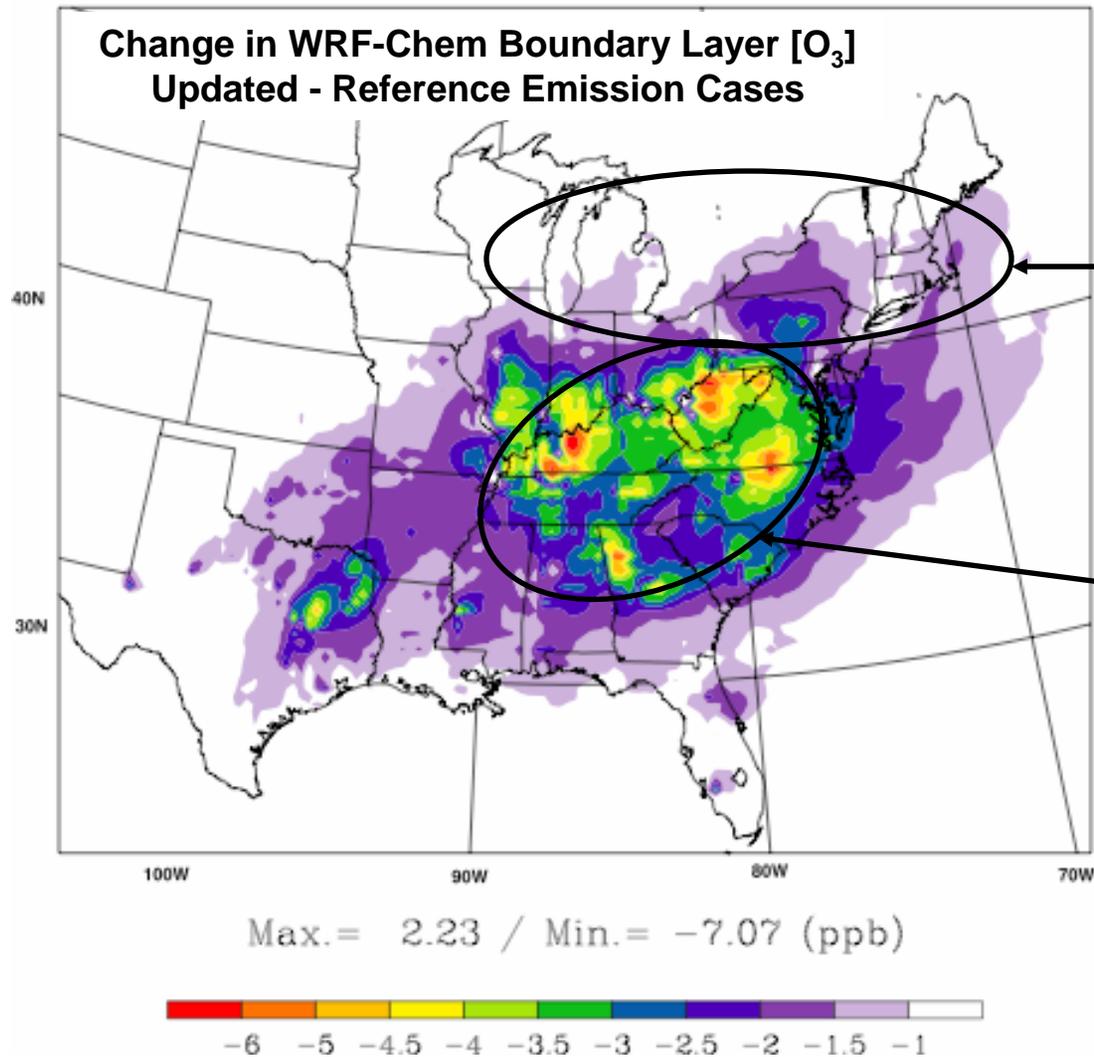
- **Satellite NO<sub>2</sub> columns:** GOME (1997-2002) & SCIAMACHY (2003-2005)
- **Bottom-up NO<sub>x</sub> emissions trend** derived from monthly CEMS reports assuming all other NO<sub>x</sub> sources constant at summer 1999
- June-August averages
- 1997-2005 trends normalized to 1999 value

• Similar trends in satellite NO<sub>2</sub> columns and NO<sub>x</sub> emissions

➤ *Power plant NO<sub>x</sub> controls have decreased NO<sub>2</sub> columns*

➤ *Mobile NO<sub>x</sub> emission changes smaller than those from power plants*

# Boundary Layer O<sub>3</sub> Response to NO<sub>x</sub> Emission Reductions



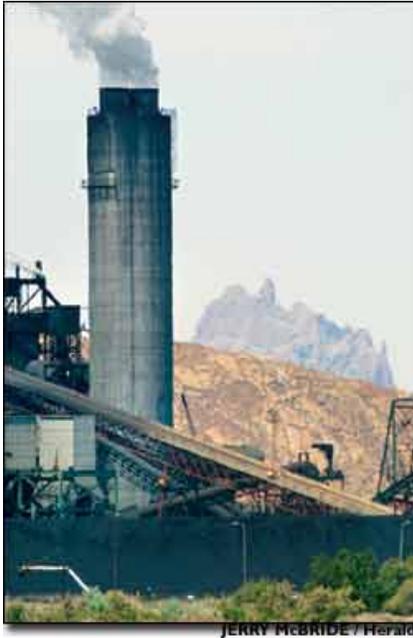
➤ O<sub>3</sub> generally decreases in response to power plant NO<sub>x</sub> emission reductions

➤ Small  $\Delta[O_3]$  in northern US  
⇒ persistent cold fronts and unusually cold conditions in summer 2004

➤ Up to 10% [O<sub>3</sub>] decreases in Ohio River Valley, VA, NC, and GA

Average of all model output between 0 & 1 km at 20 UTC  
(1500 EST) for all days June-August 2004

# NO<sub>x</sub> Emissions from Western US Power Plants and Cities



Use discrete satellite signals in Western US to evaluate NO<sub>x</sub> emissions from individual power plants and urban areas

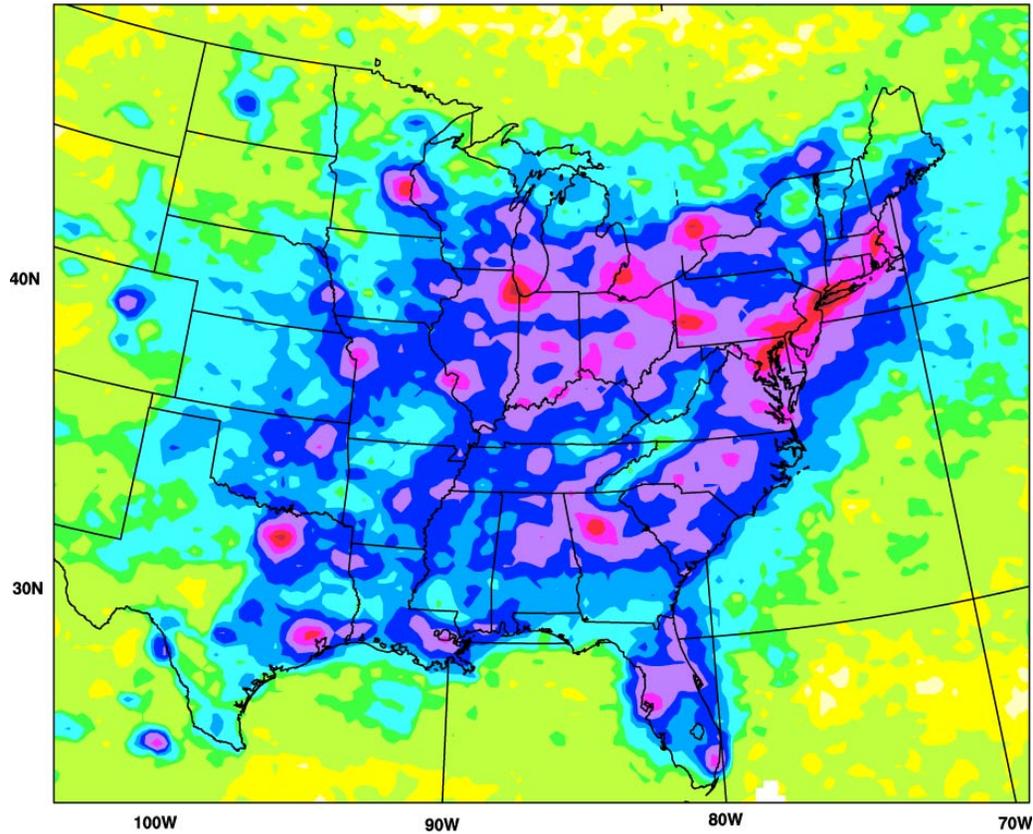
- Steady, well-known power plant emissions
  - “Calibrate” satellite and model algorithms
- Rapidly growing urban areas with lots of motor vehicles
  - How well are mobile source NO<sub>x</sub> emissions understood?
  - Are overall NO<sub>x</sub> emissions declining?



# Isolating NO<sub>x</sub> Emissions from Different Source Sectors

SCIAMACHY, Eastern US

Summer 2004 Average



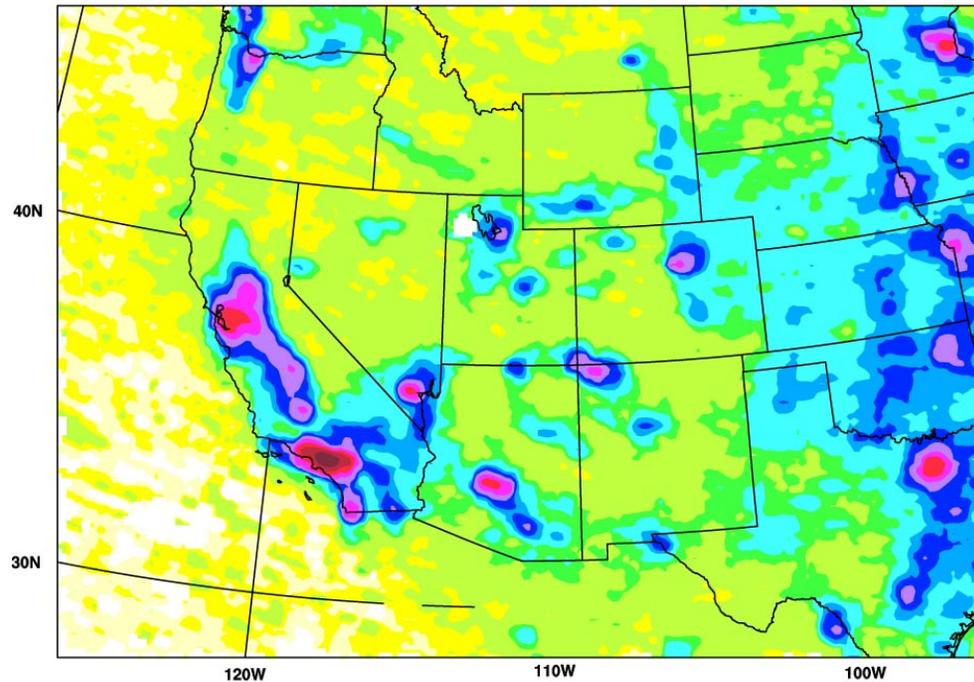
Max= 22.43 ( $10^{15}$  molec.  $\text{cm}^{-2}$ )



# Isolating NO<sub>x</sub> Emissions from Different Source Sectors

## SCIAMACHY, Western US

Summer 2005 Average



Max= 30.01 ( $10^{15}$  molec. cm<sup>-2</sup>)

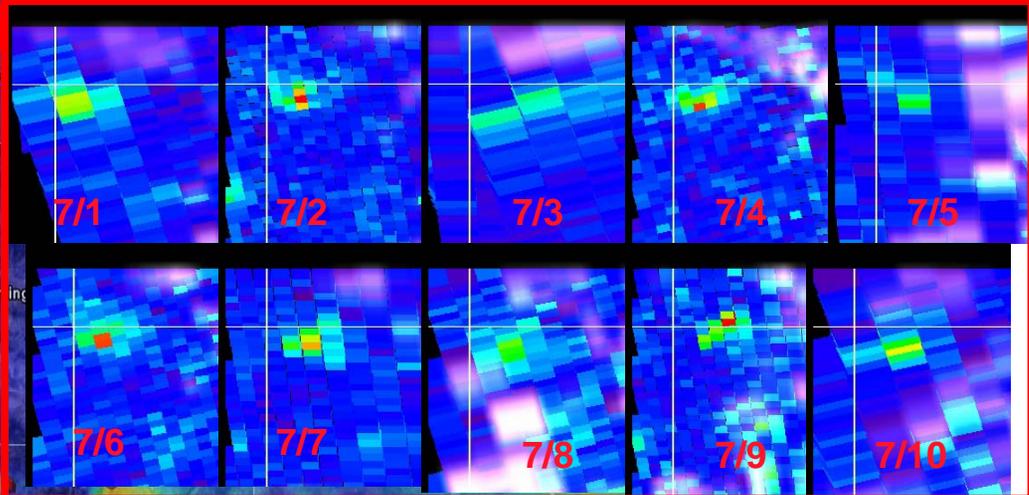
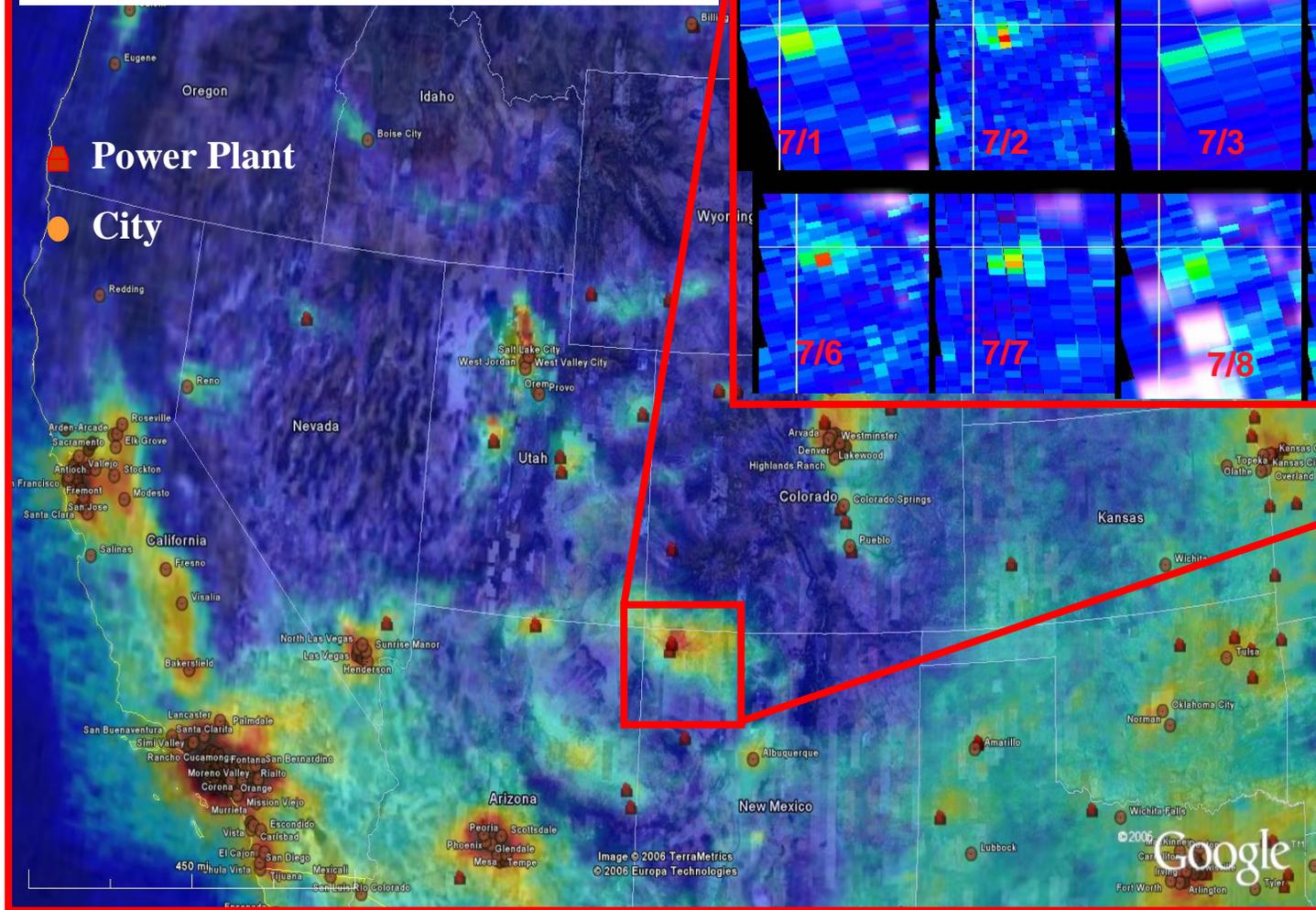
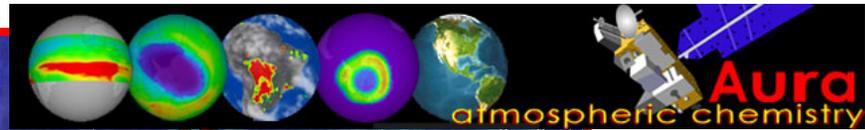


*Satellite signals from Western US NO<sub>x</sub> sources  
more distinct than in Eastern US*

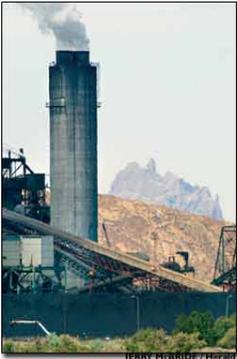
➤ *Isolate and assess different emission sources*

# Isolating NO<sub>x</sub> Emissions from Different Source Sectors

NO<sub>2</sub> Vertical Columns from OMI (Ozone Monitoring Instrument) on Aura satellite (launched July 2004)

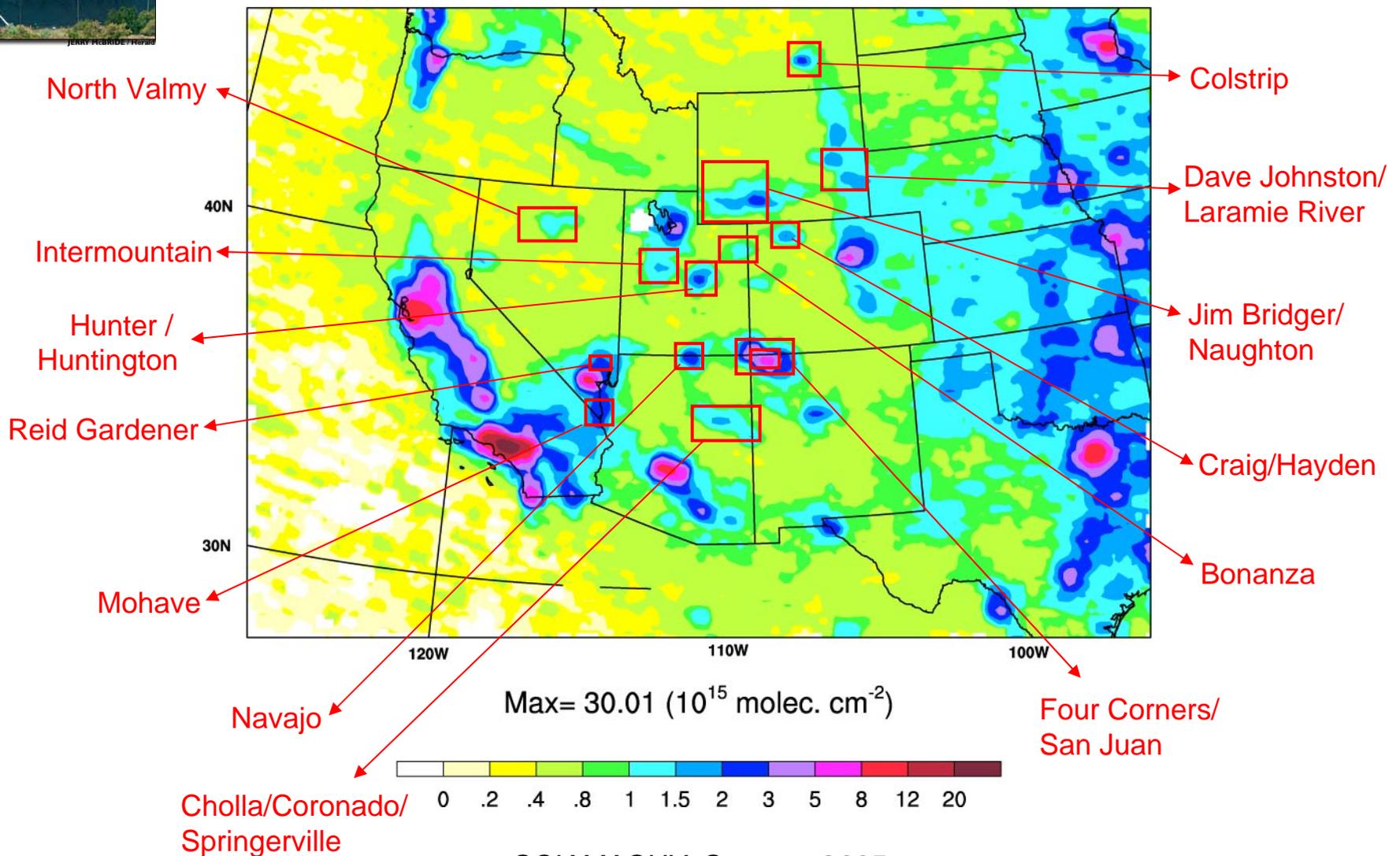


OMI images courtesy of James Gleason (NASA)



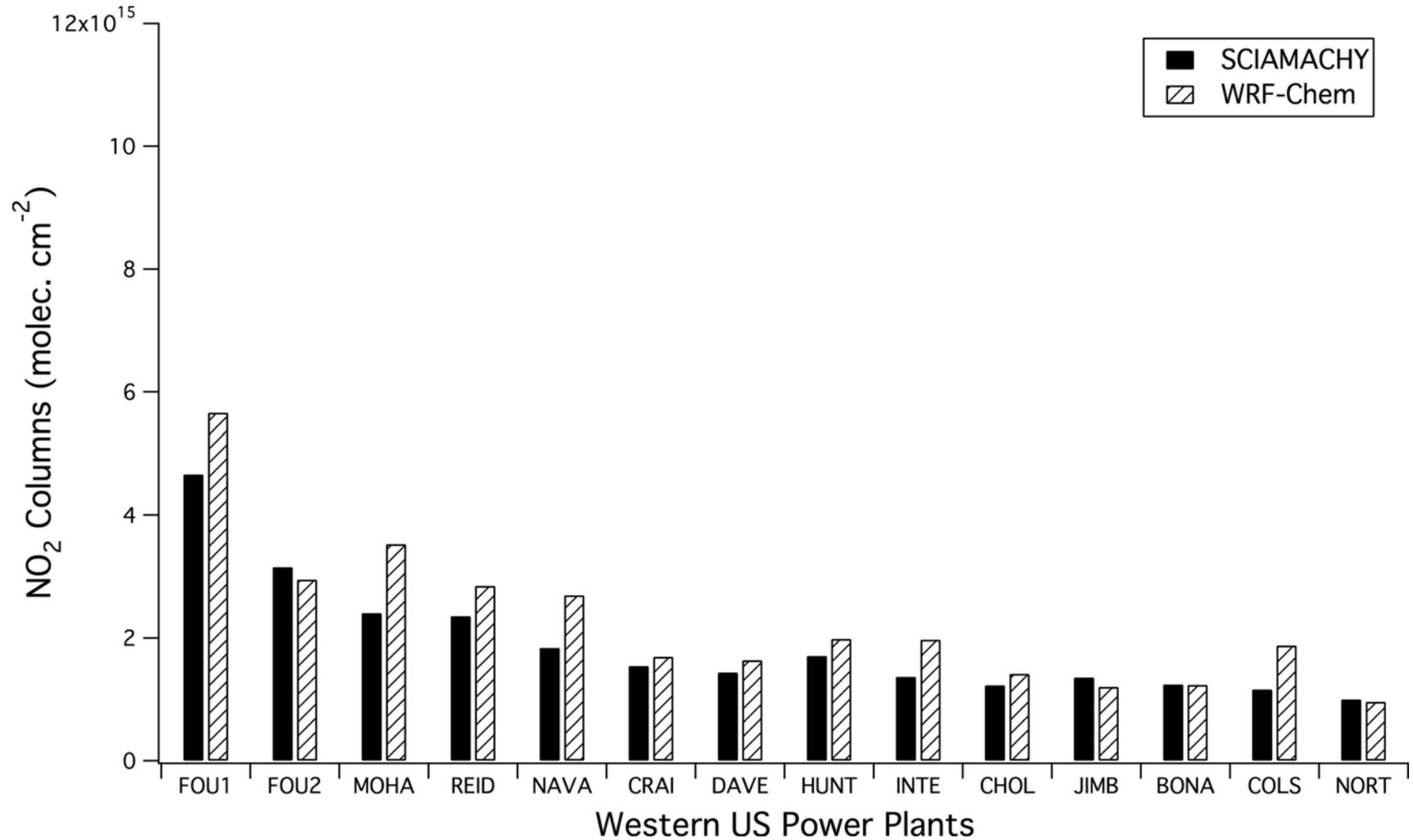
# NO<sub>x</sub> Emissions from Western US Power Plants

- Isolated plants have discrete signatures in satellite retrievals
  - Power plant emissions are measured continuously at each stack
  - Currently no NO<sub>x</sub> pollution controls on large coal-burning plants
- “Calibration” for satellite-model comparison



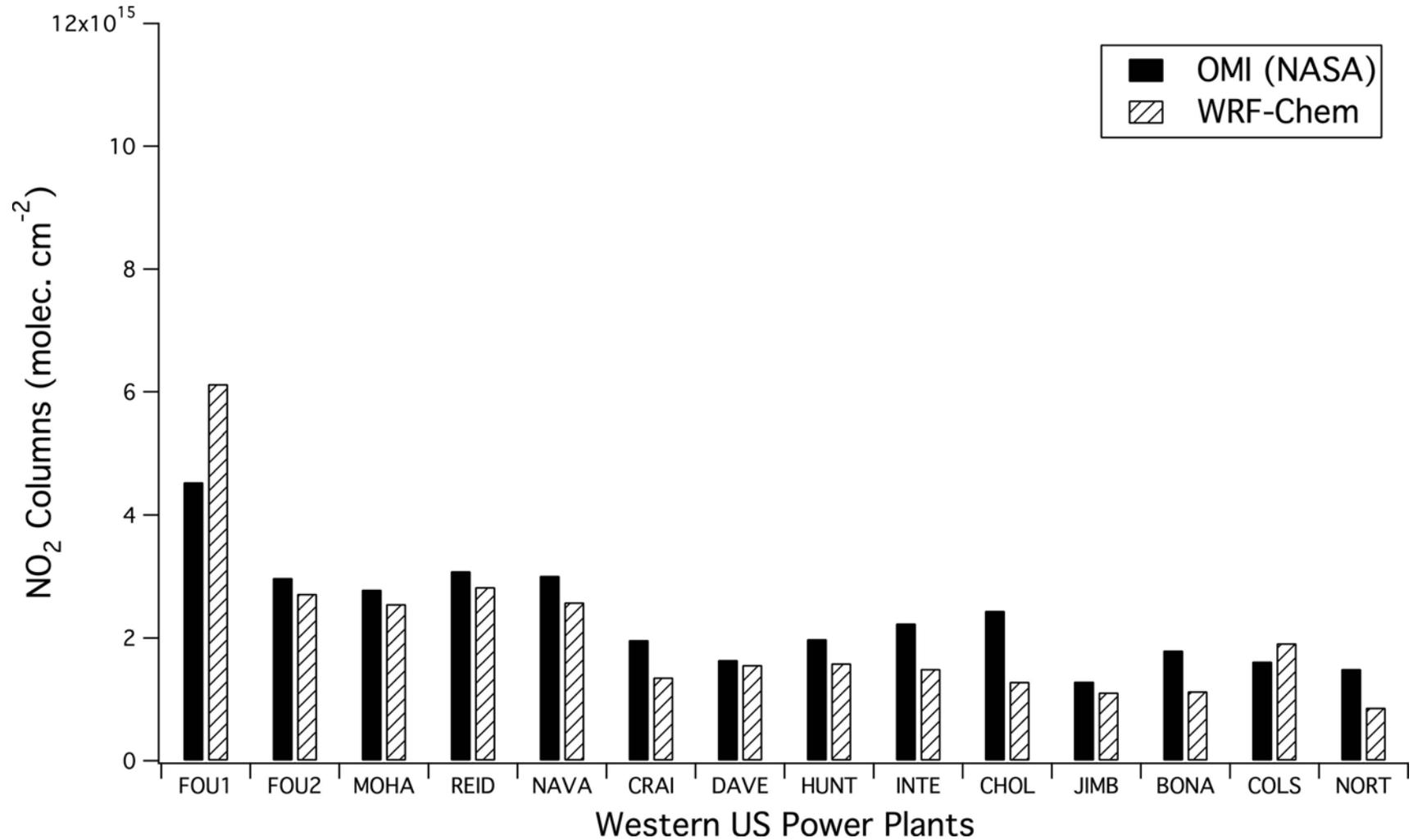
# Satellite - Model NO<sub>2</sub> Column Comparison: Power Plants

Summer 2005 average NO<sub>2</sub> columns over boxes shown on previous map



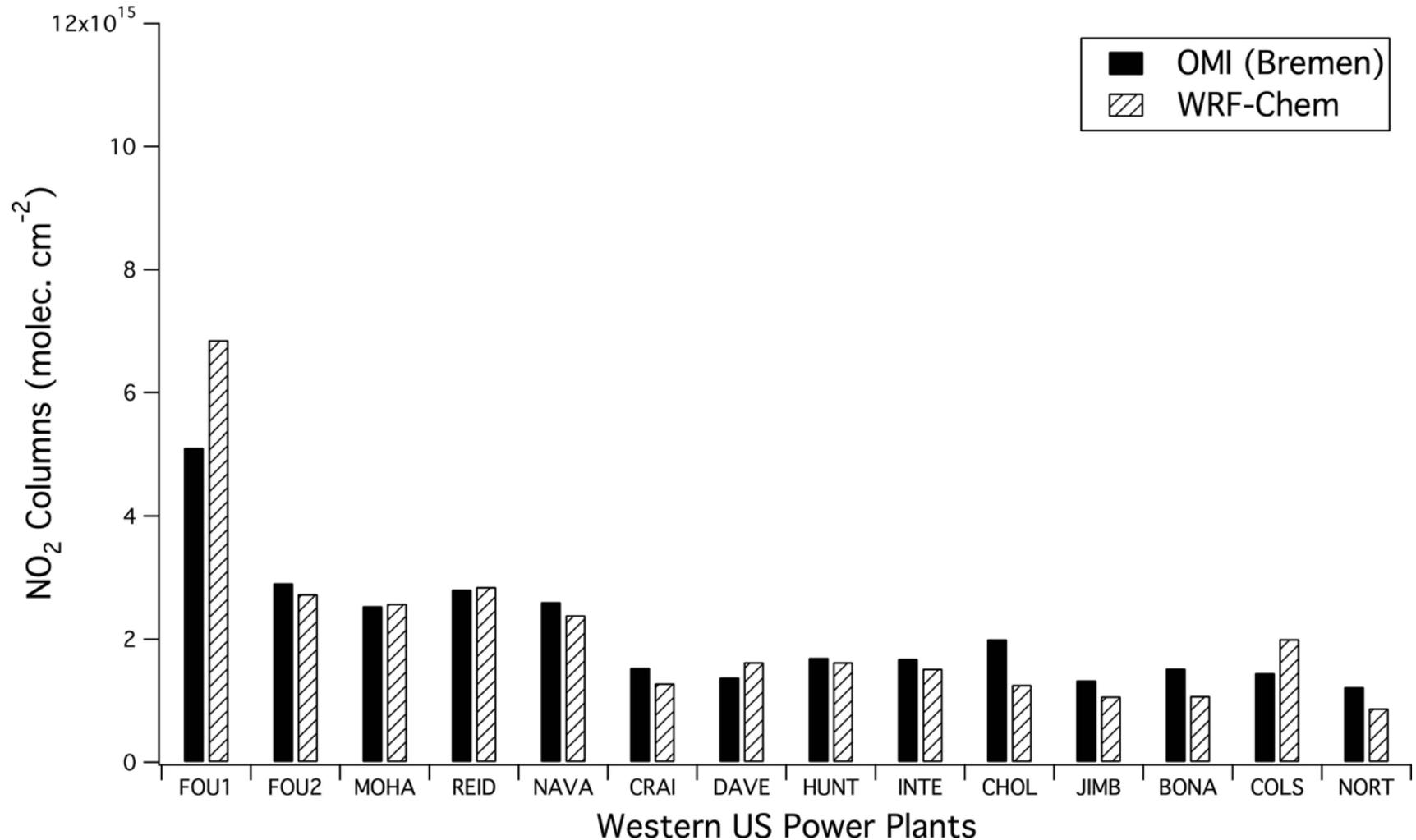
# Satellite - Model NO<sub>2</sub> Column Comparison: Power Plants

Summer 2005 average NO<sub>2</sub> columns over boxes shown on previous map



# Satellite - Model NO<sub>2</sub> Column Comparison: Power Plants

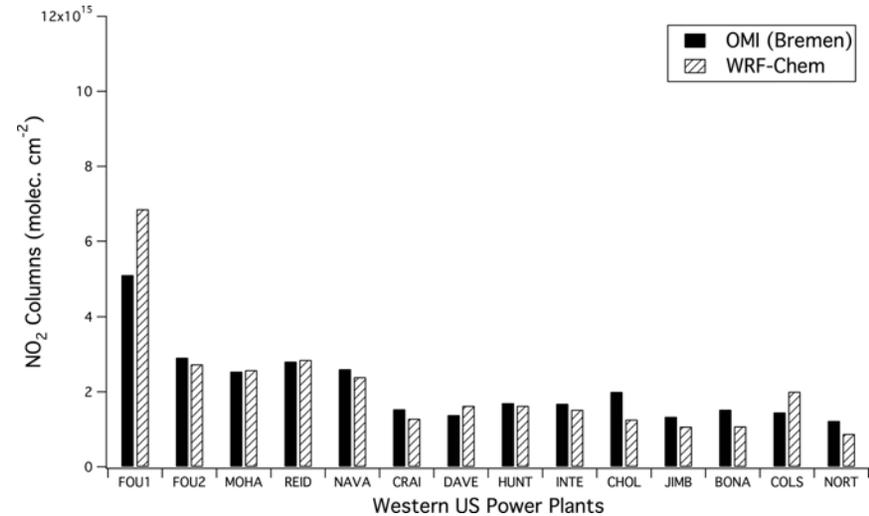
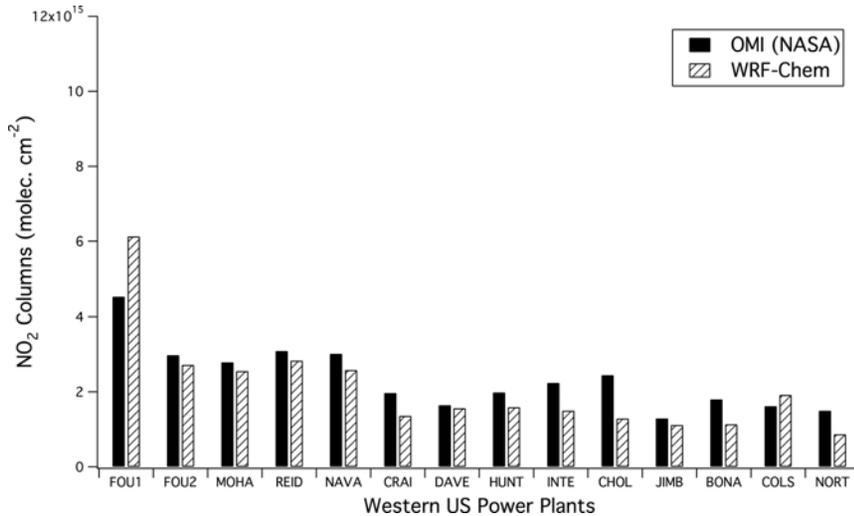
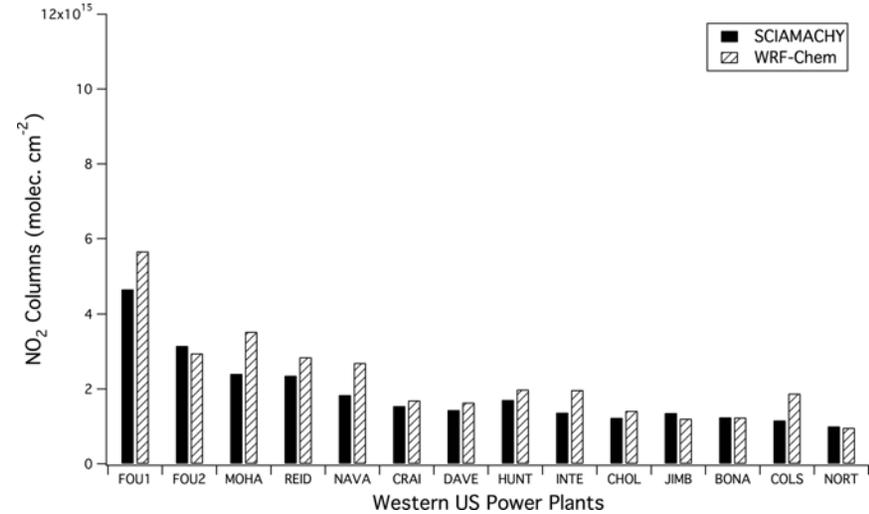
Summer 2005 average NO<sub>2</sub> columns over boxes shown on previous map



# Satellite - Model NO<sub>2</sub> Column Comparison: Power Plants

Good agreement between satellite and model NO<sub>2</sub> columns over Western US power plants

- Optimize satellite column retrievals and model parameterizations
- Model enables comparison of different satellite retrieval approaches
- Consistency for different retrievals gives confidence in conclusions about emissions

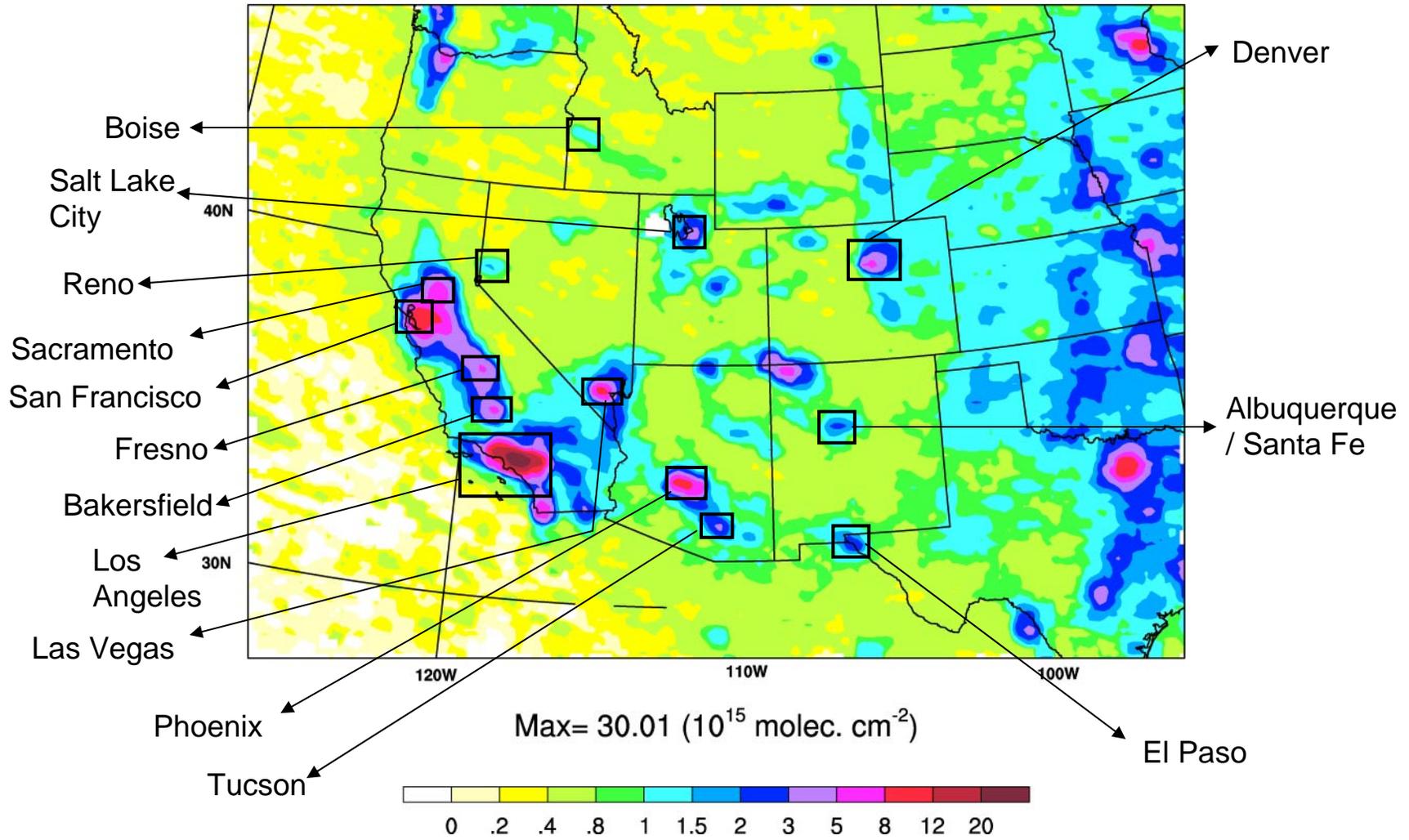




# NO<sub>x</sub> Emissions from Western US Urban Areas

*Build on satellite-model comparisons for power plants*

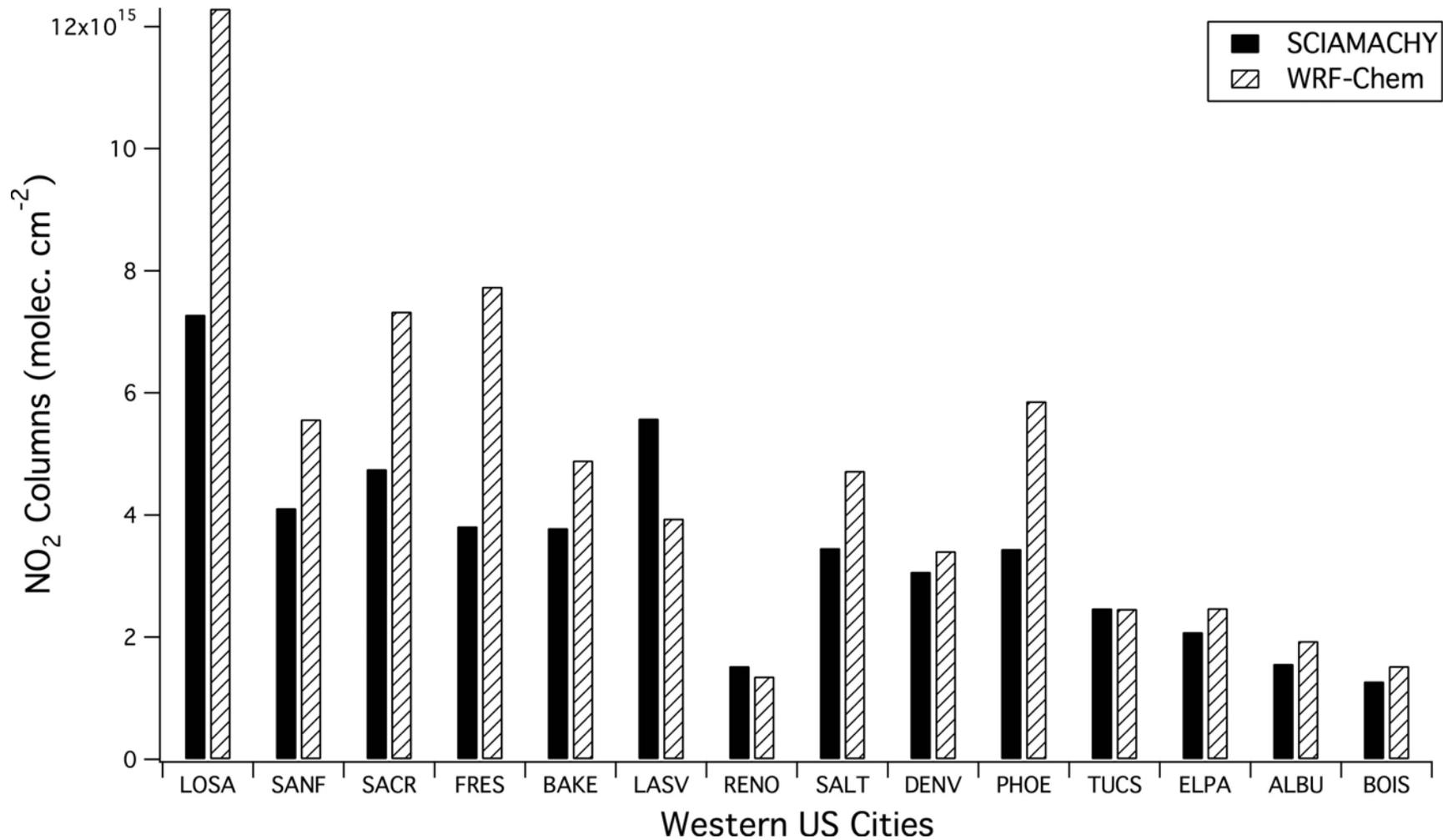
➤ *Evaluate urban area emission inventories and monitor changes*



SCIAMACHY, Summer 2005

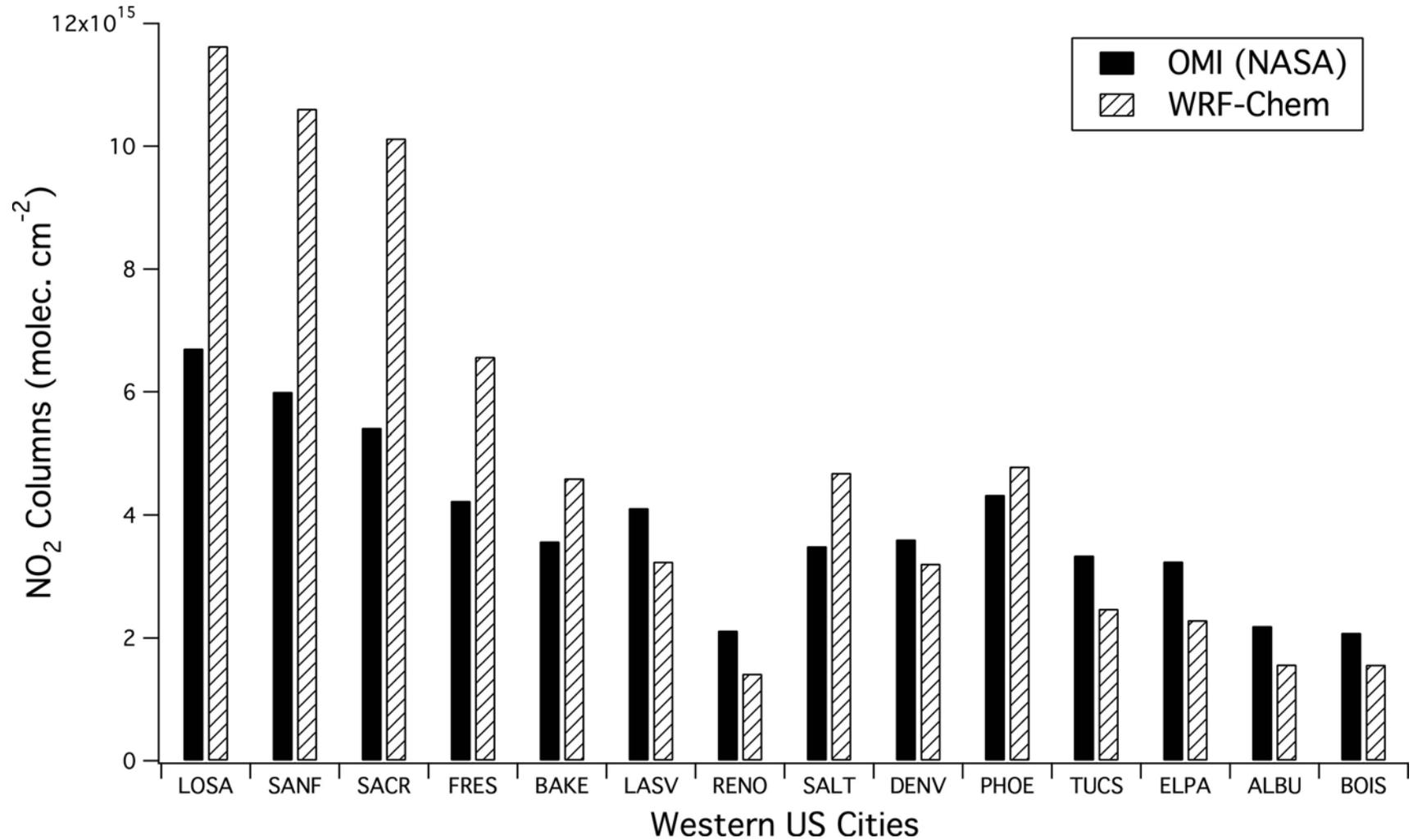
# Satellite - Model NO<sub>2</sub> Column Comparison: Urban Areas

Summer 2005 average NO<sub>2</sub> columns over boxes shown on previous map



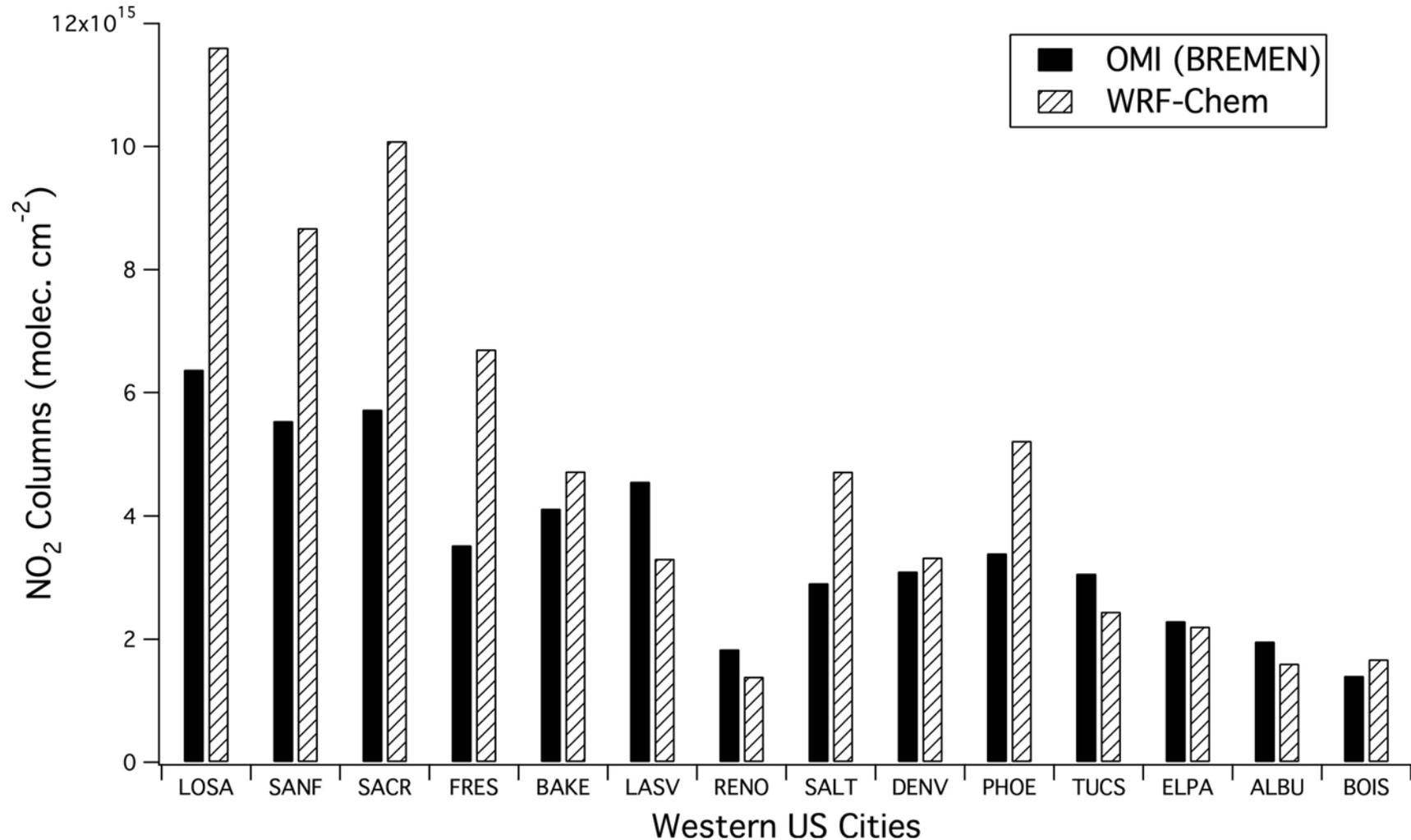
# Satellite - Model NO<sub>2</sub> Column Comparison: Urban Areas

Summer 2005 average NO<sub>2</sub> columns over boxes shown on previous map

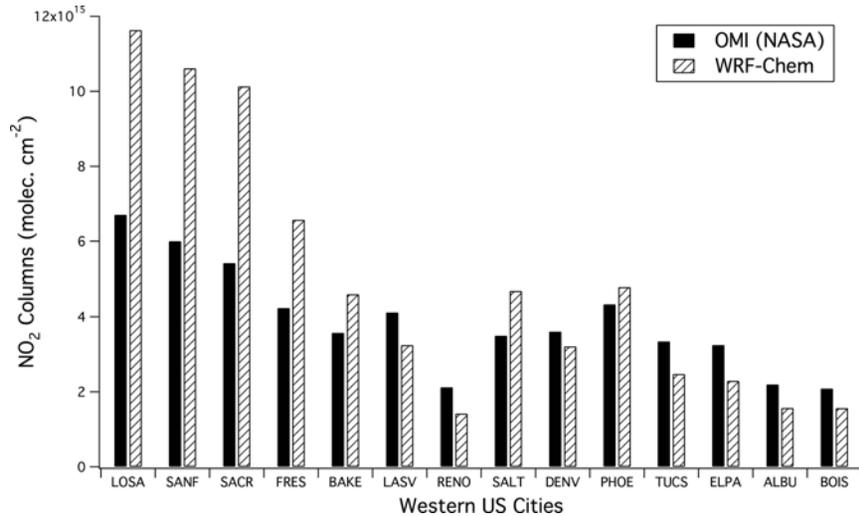
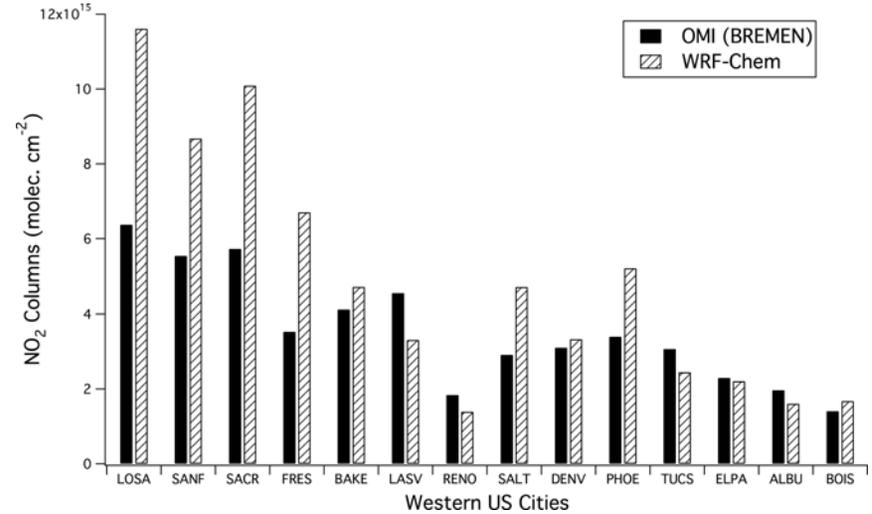
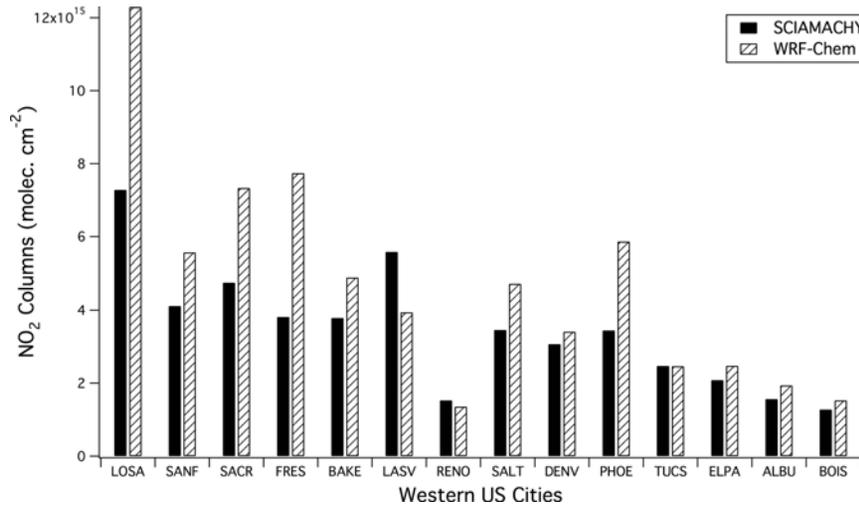


# Satellite - Model NO<sub>2</sub> Column Comparison: Urban Areas

Summer 2005 average NO<sub>2</sub> columns over boxes shown on previous map



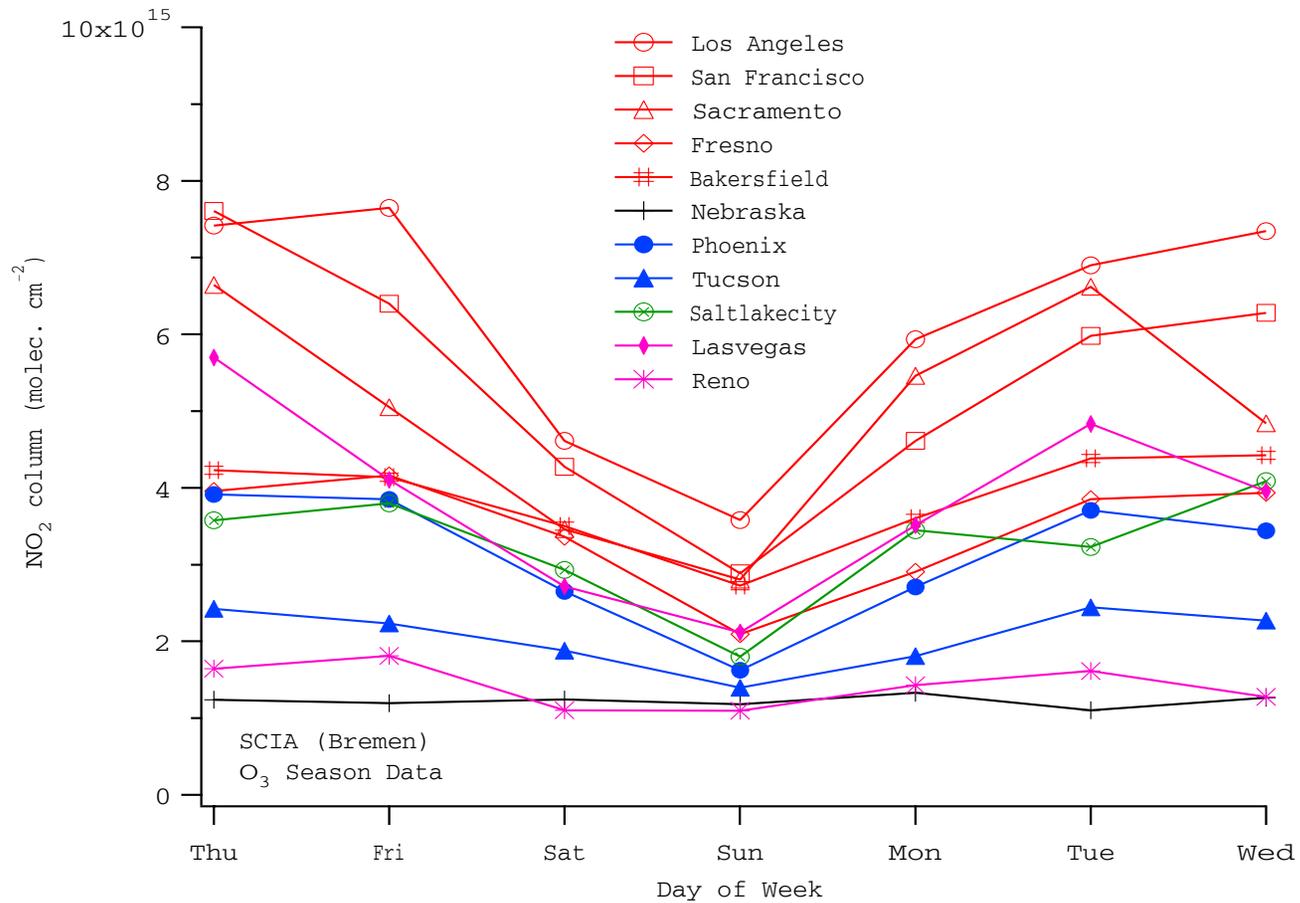
# Satellite - Model NO<sub>2</sub> Column Comparison: Urban Areas



Large differences between satellite and model NO<sub>2</sub> columns over many Western US cities

- Urban emissions not well represented by 1999 inventory
- Trends in NO<sub>x</sub> emissions since 1999?
- Are emission changes mostly due to motor vehicles?

# Day of Week Trends in Satellite NO<sub>2</sub> Columns over Urban Areas



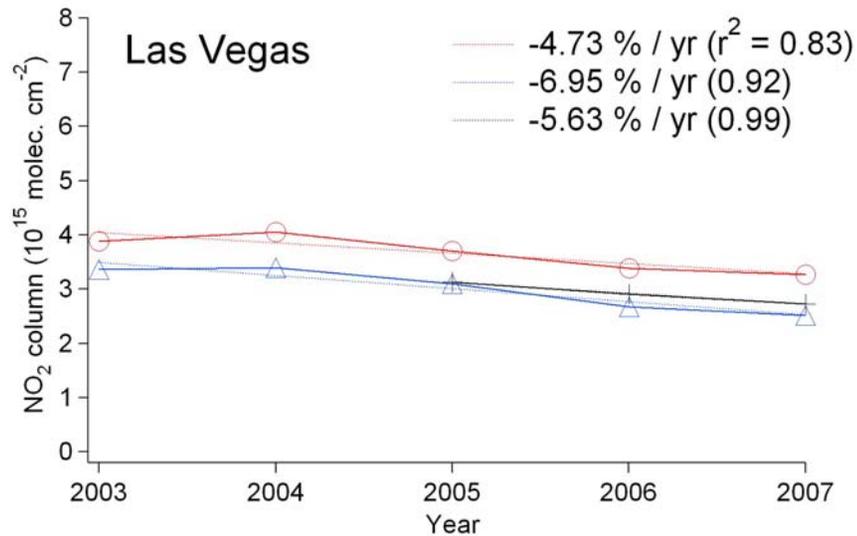
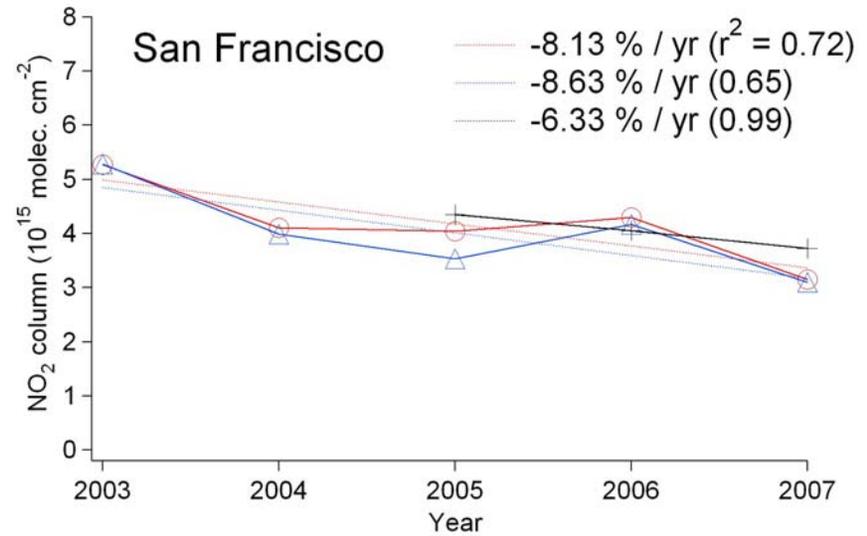
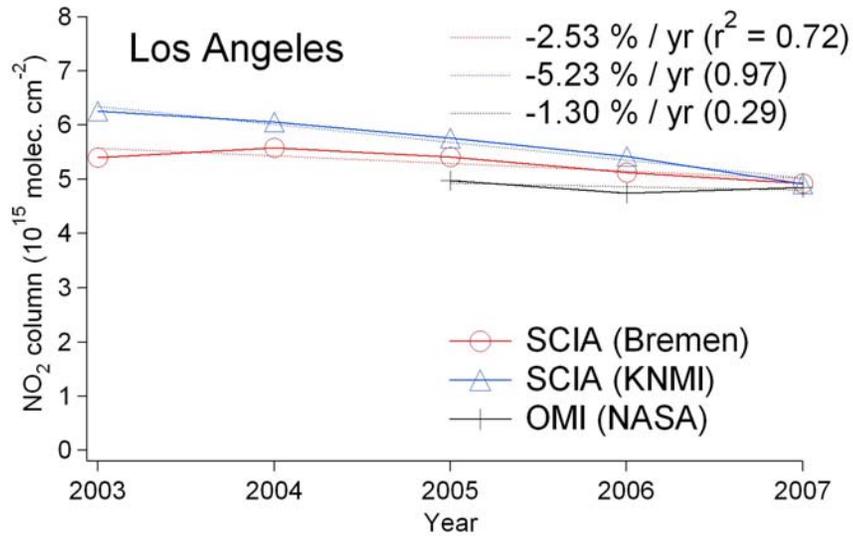
OMI shows weekend decline in urban NO<sub>2</sub> columns

- Reduced traffic, particularly heavy-duty diesel vehicles
- Lower mobile source NO<sub>x</sub> emissions on weekends



Day of week changes in satellite NO<sub>2</sub> columns first reported by:  
S. Beirle et al. (2003), *Weekly cycle of NO<sub>2</sub> by GOME measurements: a signature of anthropogenic sources*, *Atmos. Chem. Phys.*, 3, 2225-2232

# Year-to-Year Trends in Satellite NO<sub>2</sub> Columns over Urban Areas



Satellites demonstrate decline in NO<sub>2</sub> columns over many Western US cities in recent years

- Urban NO<sub>x</sub> emissions appear to be decreasing
- Increasing population and motor vehicle fuel use
- Effect of cleaner engines, especially light-duty gasoline vehicles

# Conclusions

- Combination of space-based instruments and regional air quality model
  - Useful evaluation of NO<sub>x</sub> emission inventories and trends
- Effects of major NO<sub>x</sub> emission reductions at Eastern US power plants
  - Point source pollution control strategies have resulted in widespread, measurable changes to atmospheric pollutant levels
- Relative contributions from Western US NO<sub>x</sub> sources and their long-term trends
  - Power plants serve as calibration for NO<sub>2</sub> vertical columns
  - Impact of cleaner motor vehicles on urban to regional scale appears to be measurable by space-based instruments

