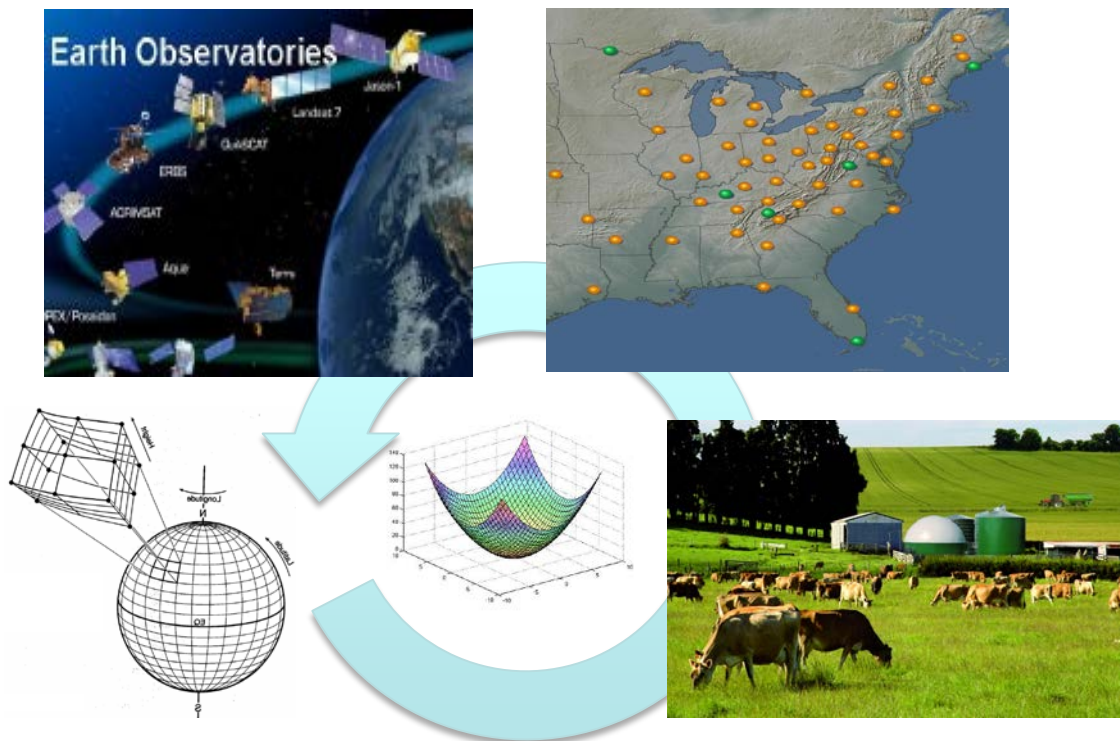


# Top-down constraints on $\text{NH}_3$ emissions



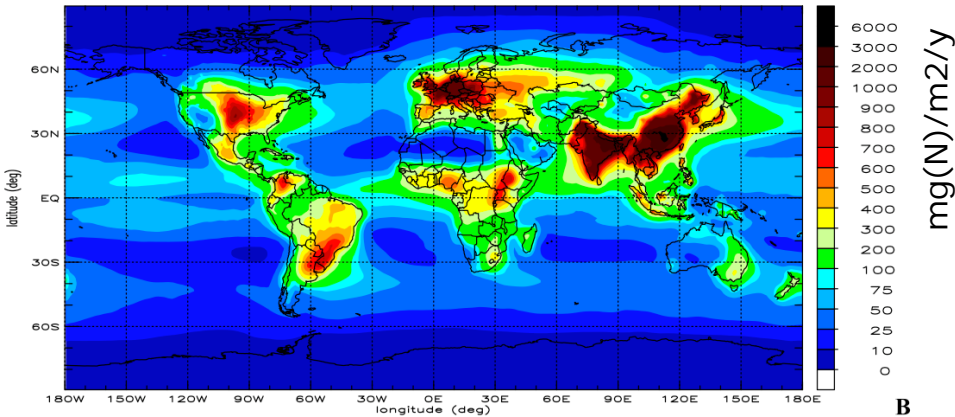
Daven K. Henze  
University of Colorado, Boulder

Liye (Juliet) Zhu, CU Boulder; Rob Pinder, Jesse Bash, US EPA; Karen Cady-Pereira, AER; Mark Shepard, EC; Ming Luo, JPL  
EPA STAR RD834559. This work does not reflect official agency views, policies.

# Impacts of $\text{NH}_3$

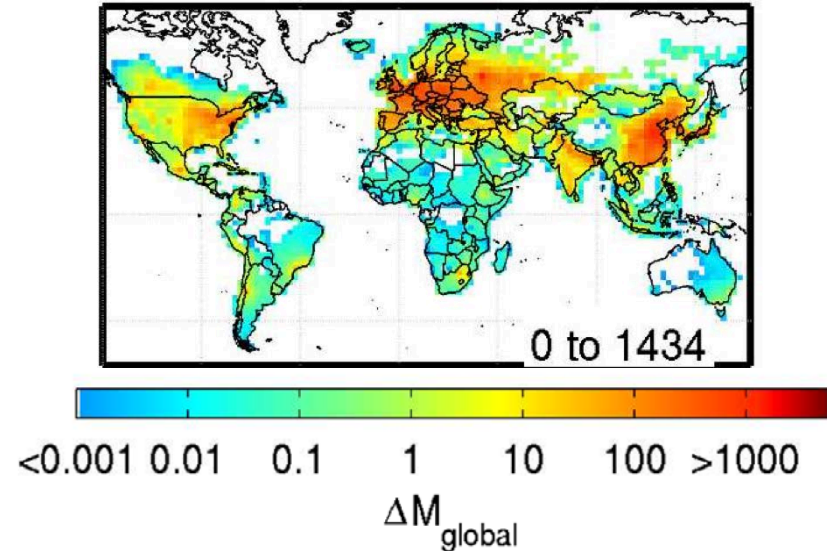
## Deposition

Estimated N deposition from  $\text{NH}_x$   
(Dentener et al., 2006)



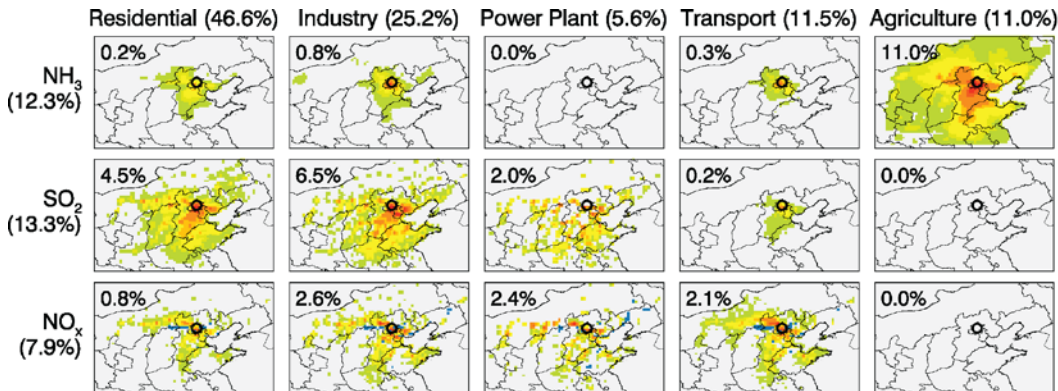
## Health

Impacts of 10%  $\Delta$ emissions  
(Lee et al., ES&T, 2015)



## Air Quality

Source attribution of Jan.  $\text{PM}_{2.5}$  event  
(Zhang et al., ERL, 2015)



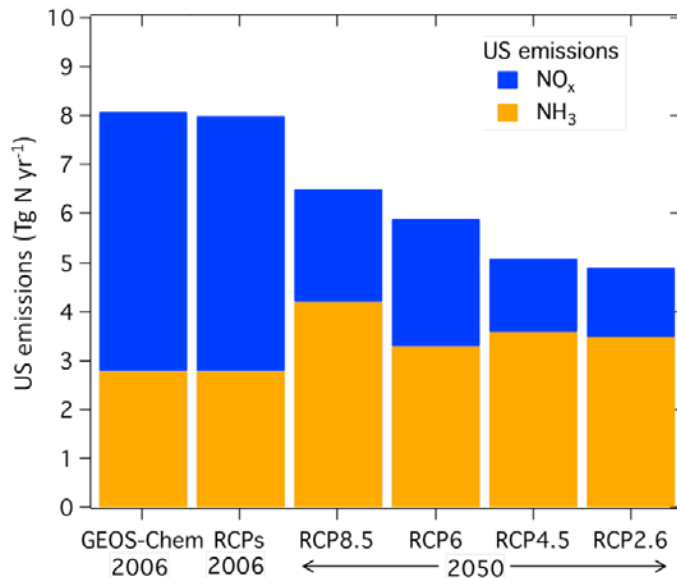
- Agricultural emissions lead to 20% of global premature deaths from ambient air pollution (Lelieveld et al., Nature, 2015) – largely the impact of  $\text{NH}_3$  emissions on  $\text{PM}_{2.5}$ .

# NH<sub>3</sub> is a growing concern

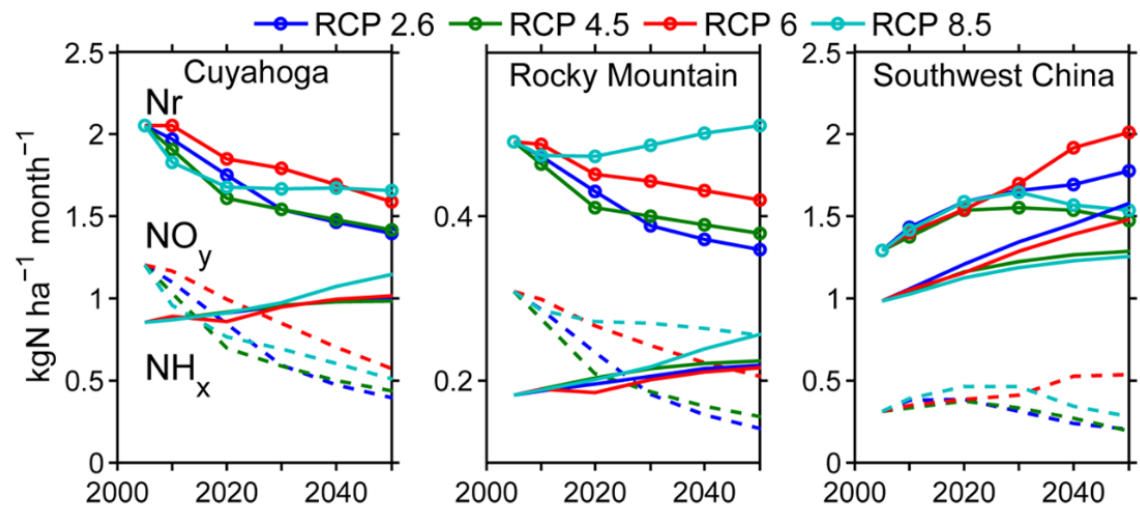
Denman et al. (2007), *IPCC*: NH<sub>3</sub> emissions have increased by x2-x5 since preindustrial times and are estimated to double by 2050.

NH<sub>3</sub> projected to soon overtake NO<sub>x</sub> as the driver of Nr deposition:

Emissions (Ellis et al., 2013)



Deposition (Paulot et al., 2013)



Transition may have occurred already in the US  
(Li et al., PNAS 2016; Sun et al., PNAS, 2016; Liu et al., PNAS, 2016)

## Uncertainties in NH<sub>3</sub> emissions

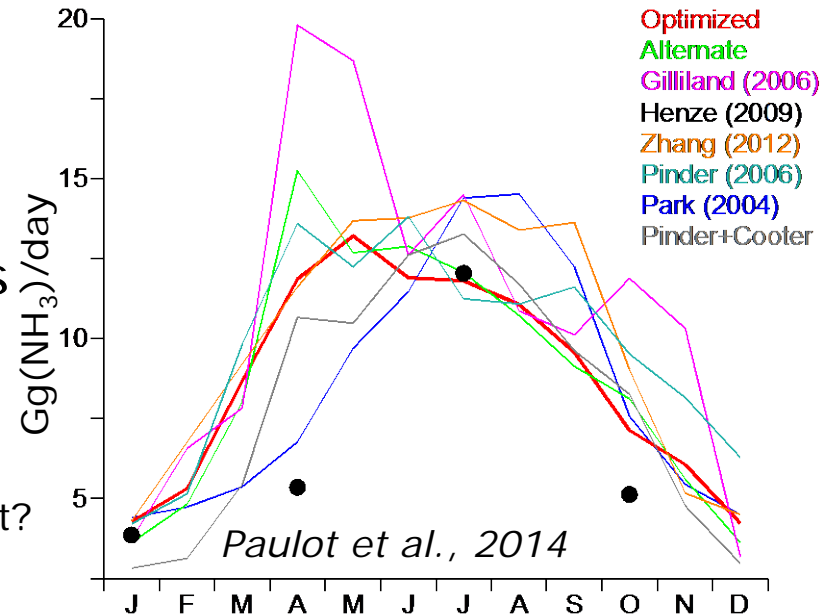
Substantial variability in estimates of total US NH<sub>3</sub> emissions →

Larger uncertainties at regional scales  
(e.g., Novak et al., 2012; Walker et al., 2012)

## Global inventories also uncertain

(e.g., Beuson et al., 2008)

- Schlesinger (PNAS, 2009): a 46 Tg gap in N budget?



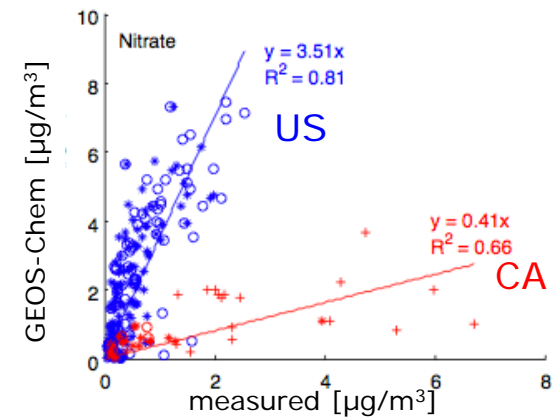
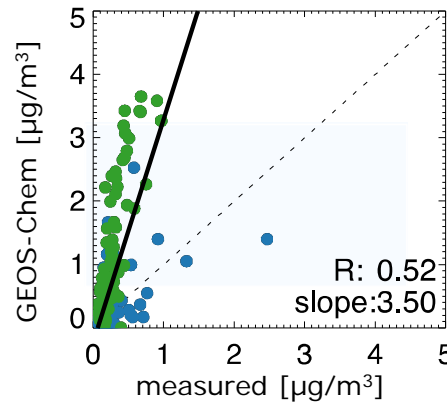
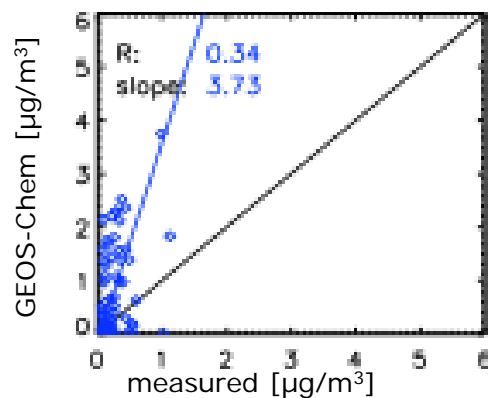
# Why so uncertain?

- lack of direct source measurements (hard, expensive)
- difficulty in relating associated species to  $\text{NH}_3$  sources
  - constraints from observations of  $[\text{NH}_4^+]$  or  $[\text{NH}_x]$  complicated by model/measurement error, precipitation
  - observations of  $[\text{NH}_3]$  less prevalent

# Uncertainties in $\text{NH}_3$ emissions: Implications for air quality and environment

- contribute to errors in assessing  $\text{PM}_{2.5}$

Ex: GEOS-Chem overestimates nitrate at IMPROVE / CASTNET (July)



Zhu et al., 2013

Heald et al., 2012

Walker et al., 2012

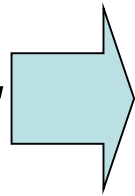
(also Liao et al., 2007; Henze et al., 2009; Zhang et al., 2012)

- undermine regulatory capabilities for secondary standards on  $\text{SO}_x$ ,  $\text{NO}_x$  to control  $\text{N}_r$  dep (e.g., Koo et al., 2012)

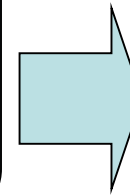
# Top-down constraints

Air quality model  
(e.g., CMAQ, GEOS-Chem)

Prior emissions  
(gas)  $\text{SO}_2$ ,  $\text{NO}_x$ ,  
 $\text{NH}_3$

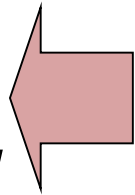


Gas-phase chemistry  
Heterogeneous chem  
Aerosol thermo  
Deposition

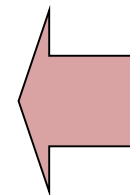


Predictions  
 $\text{NH}_3$   
 $\text{NH}_4^+$   
 $\text{NH}_x$  deposition

Top-down  
(aka posterior,  
optimized)  
emissions



Inversion algorithm  
(e.g., Kalman Filter, mass  
balance, linear regression,  
4D-Var)



+

Measurements  
- Field campaigns  
- Monitoring networks  
- Satellites

Adjust emissions to minimize  
(predictions – measurements)<sup>2</sup>

Evaluation:

- Independent data
- Bottom-up inventories
- Other models

# Constraints on $\text{NH}_x$ deposition from inverse modeling

*Many US air quality models get  $\text{NH}_x$  deposition correct via assimilation.*

**Observations:** wet  $\text{NH}_x = \text{aerosol } \text{NH}_4^+ + \text{gas } \text{NH}_3$

**Method:** adjust (w/Kalman Filter) monthly nation-wide scale factors

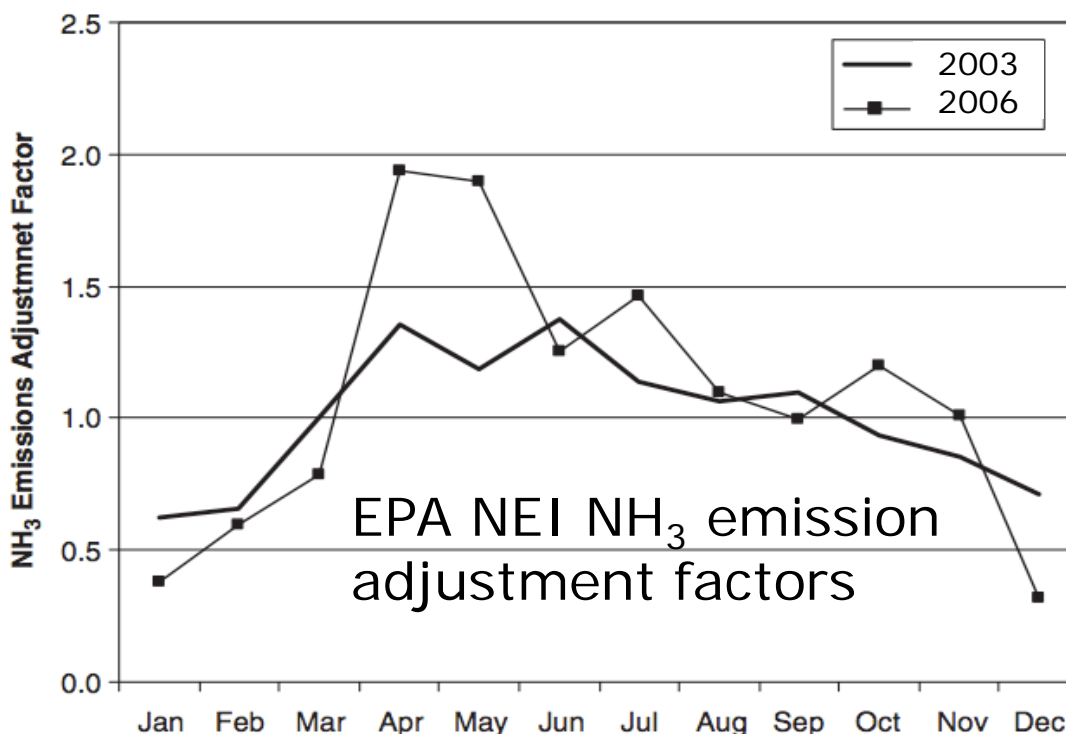
## Results:

Gilliland et al., 2003;

Gilliland et al., 2006

## Assumptions:

- uniform seasonality throughout broad regions of US

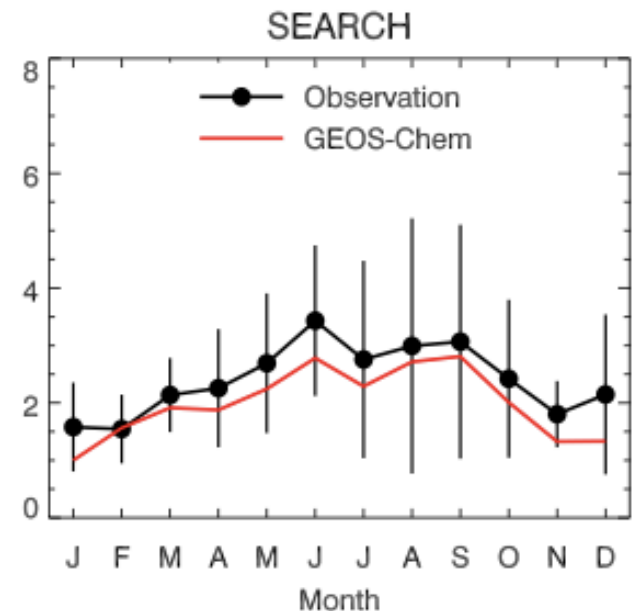
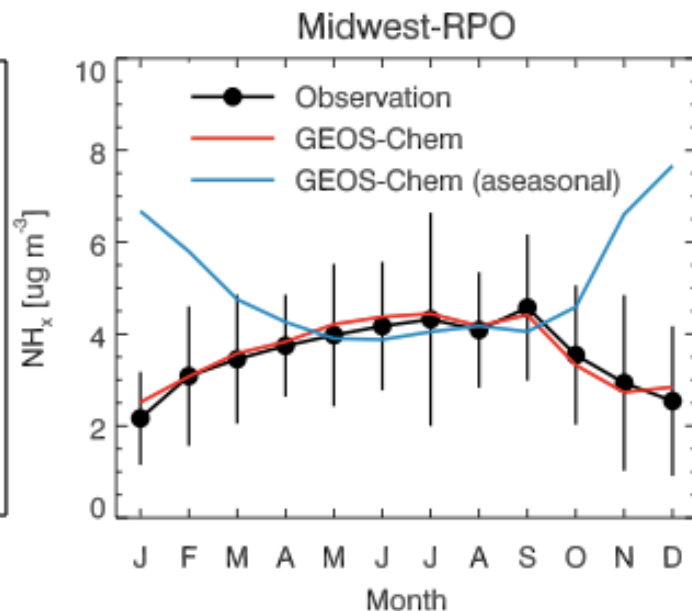
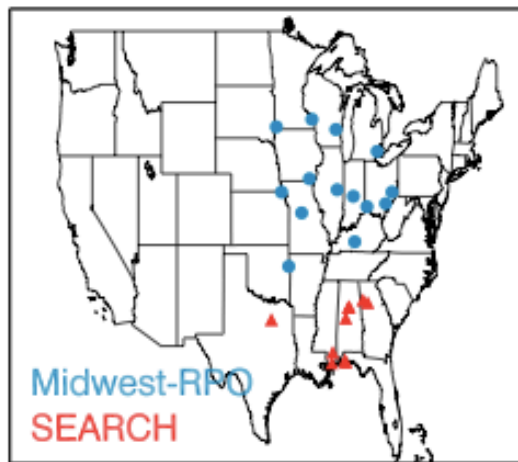




# Top-down constraints based on $\text{NH}_x$

Mendoza-Dominguez and Russell, 2001: constraints on  $\text{NH}_3$  sources in the SE

Zhang et al., 2012: Seasonality of  $\text{NH}_3$  sources adjusted so that Modeled matched RPO and SEARCH  $\text{NH}_x$  measurements



- Resulting annual  $\text{NH}_x$  and  $\text{NO}_3$  deposition unbiased.
- Enforces a spatially uniform seasonality / correction factor across the US.



# Potential for making new inroads on this problem: ambient measurements of $\text{NH}_3$

Remote sensing with TES (Beer et al., 2008):

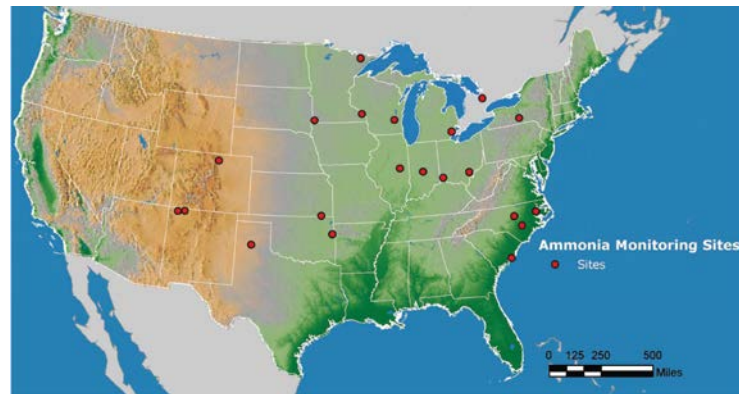
- 5 km x 8 km footprint
- sensitive to boundary layer  $\text{NH}_3$
- detection limit of  $\sim 1$  ppb
- bias of  $+0.5$  ppb

July, 2005

Passive surface measurements:

EPA's AMoN sites ( $>2007$ )  
(Puchalski et al., 2011)  
+LADCO, SEARCH, CSU,  
ANARChE

2009 AMoN Sites



# Potential for making new inroads on this problem: ambient measurements of $\text{NH}_3$

Remote sensing with TES (Beer et al., 2008):

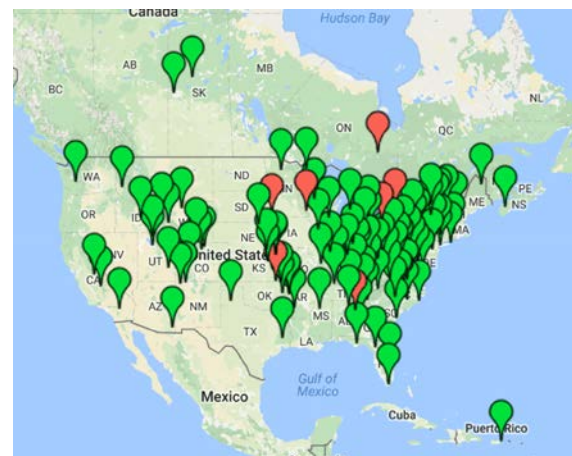
- 5 km x 8 km footprint
- sensitive to boundary layer  $\text{NH}_3$
- detection limit of  $\sim 1$  ppb
- bias of  $+0.5$  ppb

Now: AMoN

July, 2005

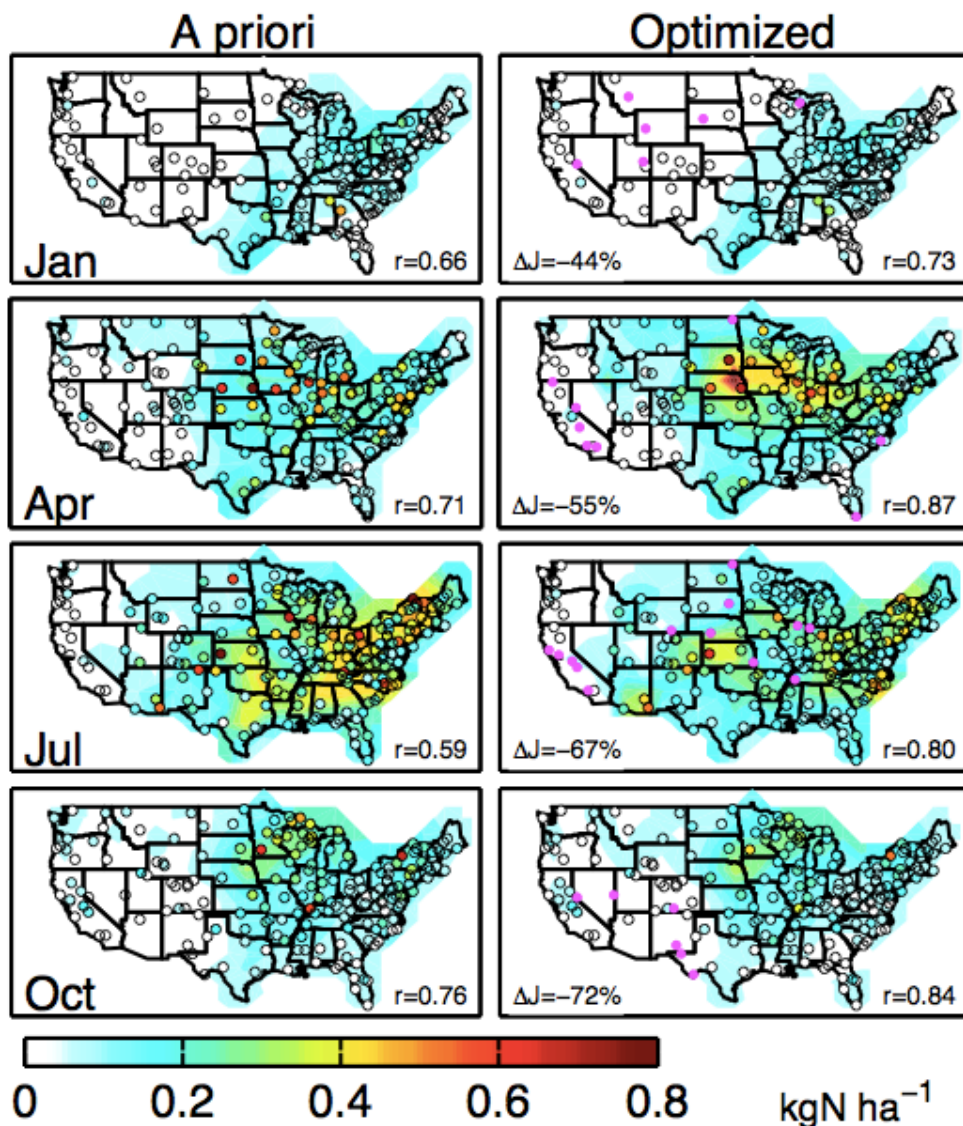
Passive surface measurements:

EPA's AMoN sites (>2007)  
(Puchalski et al., 2011)  
+LADCO, SEARCH, CSU,  
ANARChE



Now: aircraft (e.g. DISCOVER-AQ) and  
mobile surface (e.g., M. Zondlo, R. Volkamer)

# Constraints from $\text{NH}_x$ deposition, and an alternate bottom up inventory

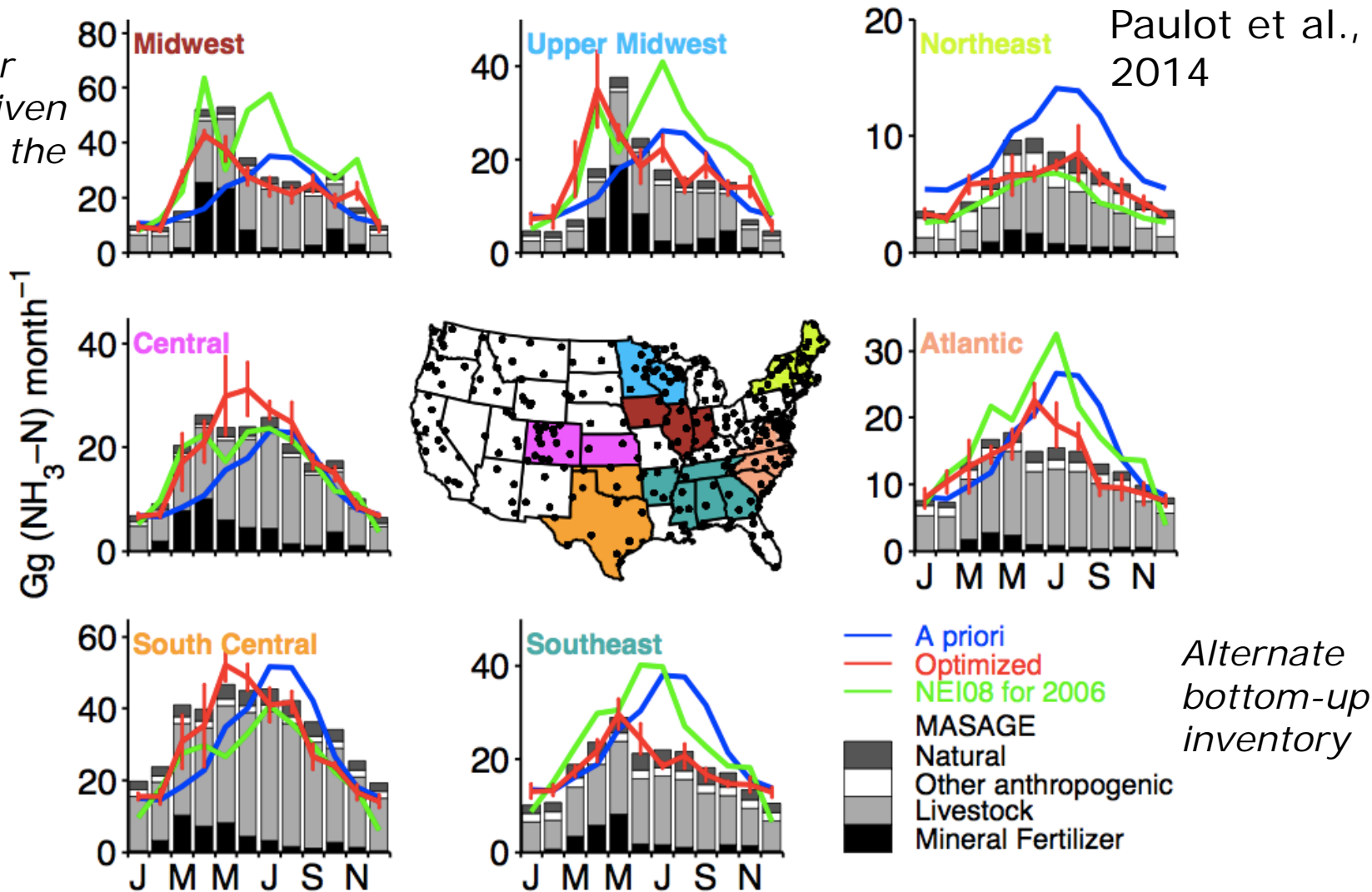


Paulot et al., 2014

- GEOS-Chem 4D-Var (Henze et al., 2007)
- Global 2x2.5
- Assimilate NTN, EMEP, ...

# Constraints from $\text{NH}_x$ deposition, and an alternate bottom up inventory

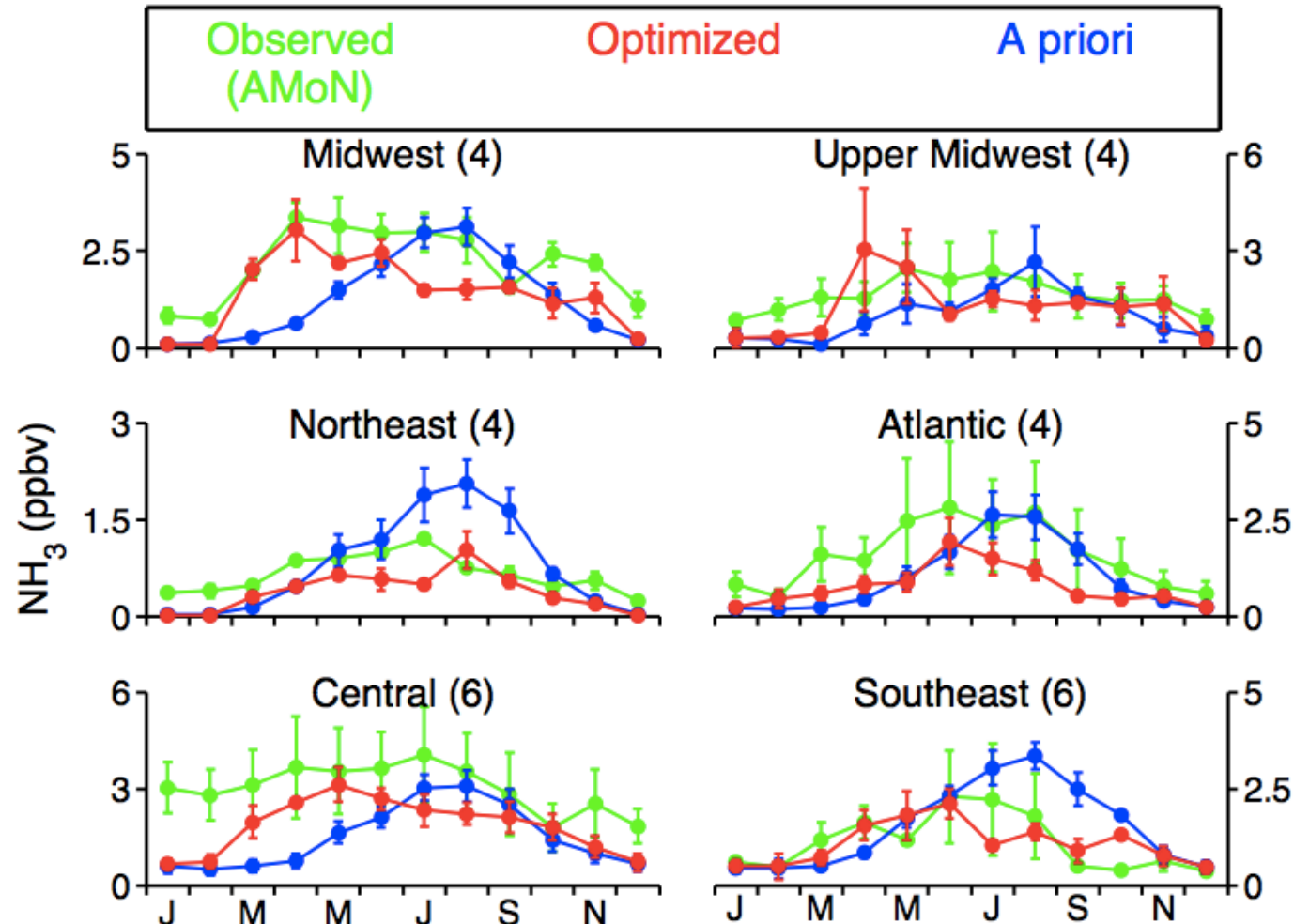
*Evidence for  
fertilizer-driven  
Emission in the  
Midwest?*



No support for homogeneous seasonality in the US. Alternate bottom-up inventory has some success reproducing patterns of optimized emissions.

# Constraints from $\text{NH}_x$ deposition, and an alternate bottom up inventory

Comparison to surface  $\text{NH}_3$  measurements (Puchaski et al., 2011) before and after assimilation:



Paulot et al.,  
2014



# TES NH<sub>3</sub> visualization

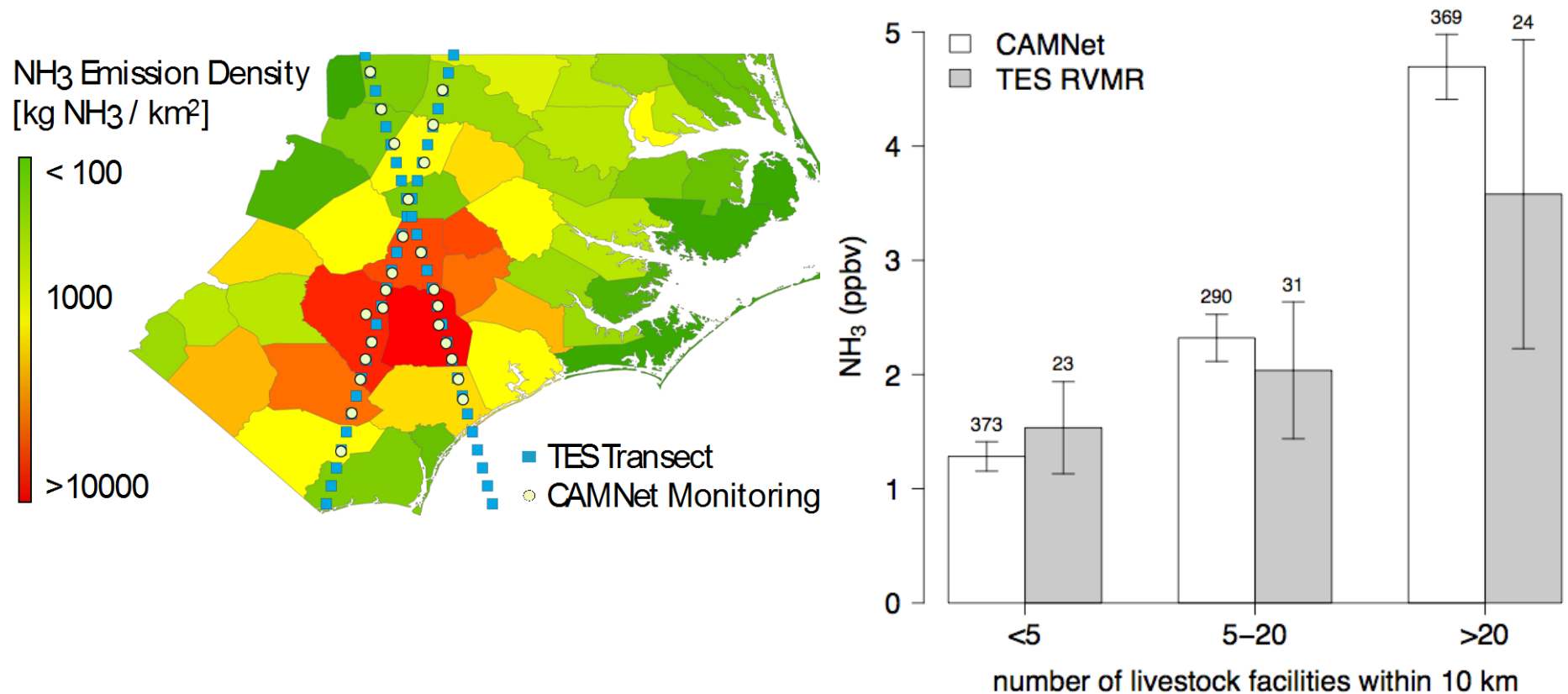


© 2011 Europa Technologies  
Image © 2011 DigitalGlobe  
Image USDA Farm Service Agency

©2010 Google

# Detection of $\text{NH}_3$ gradients with TES

Overlap surface obs with TES Transects for 2009:

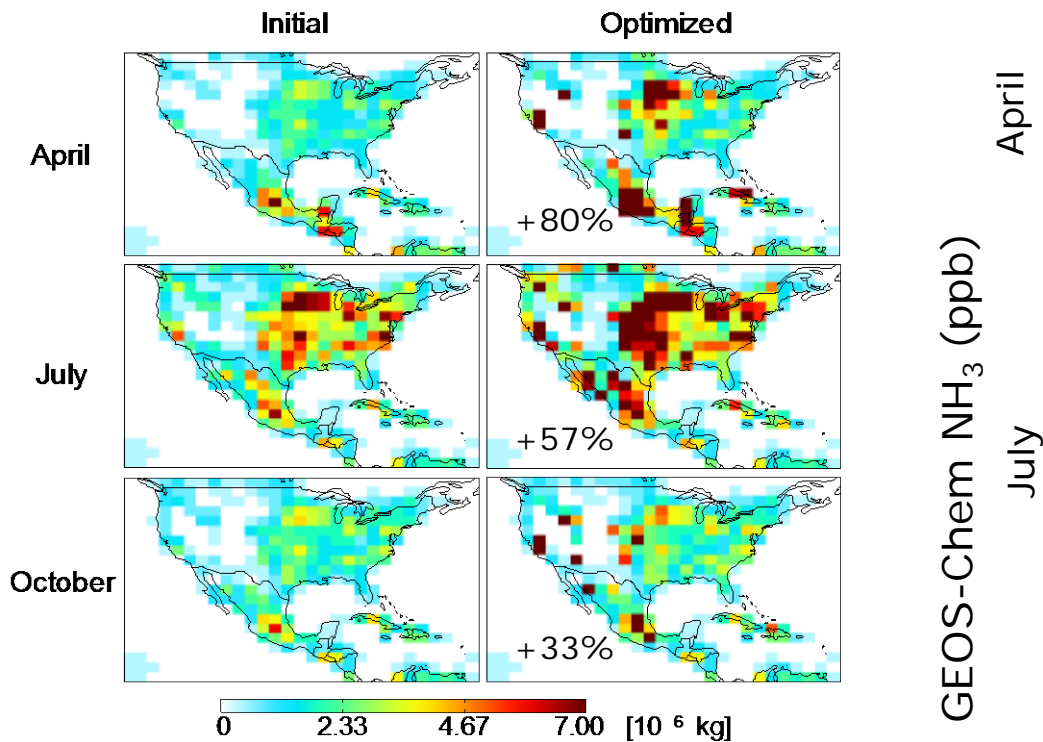


TES reflects real-world spatial gradients and seasonal trends



# Constraining emissions of $\text{NH}_3$ in GEOS-Chem using 4D-Var technique (Zhu et al., 2013)

$\text{NH}_3$  emissions in GEOS-Chem

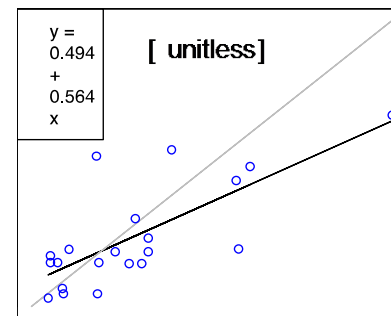


Agrees with constraints using  $\text{NH}_x$  deposition & new bottom up inventory from Paulot in April (+/- 20%) but not in July

April

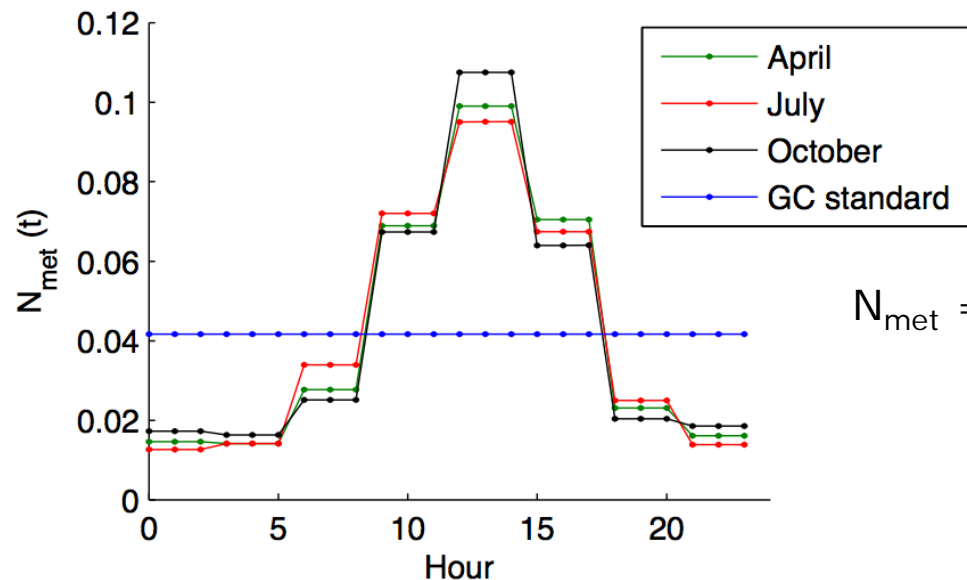
July

October

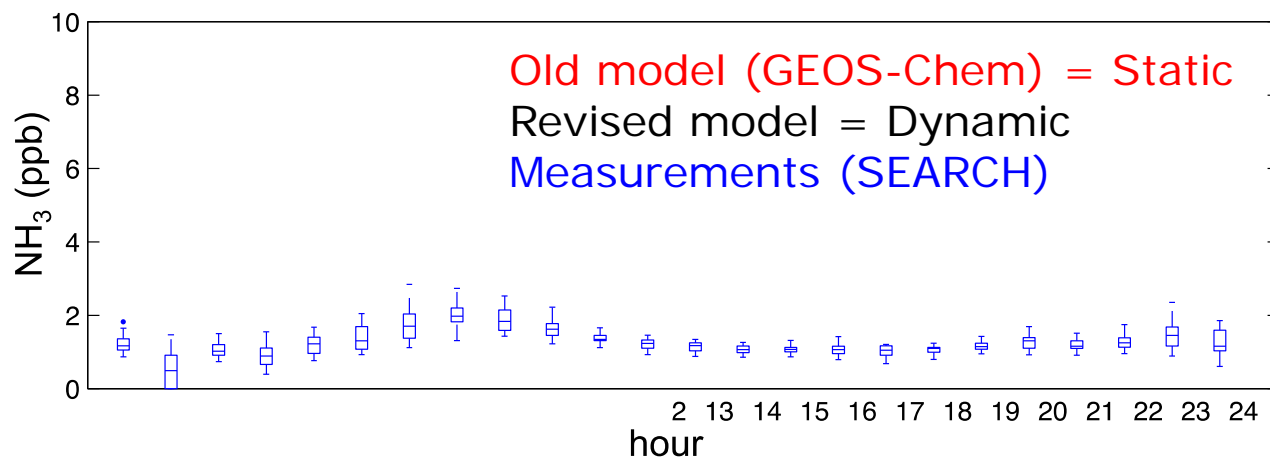


AMoN surface obs (ppb)

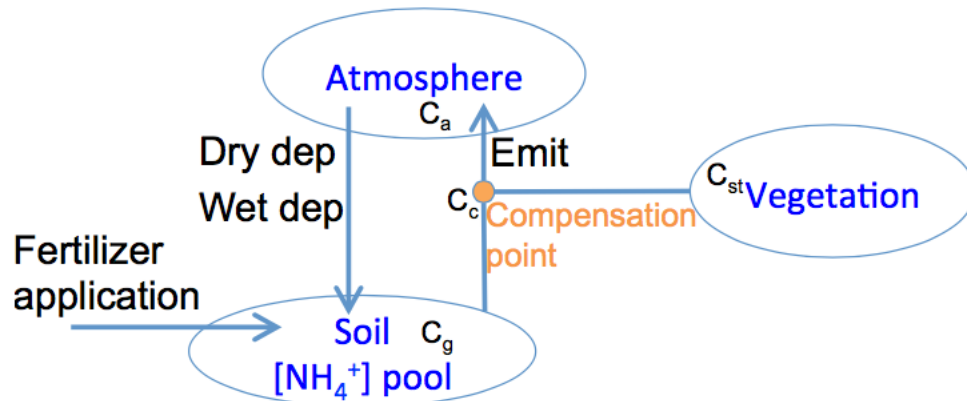
# Revised diurnal variability of $\text{NH}_3$ emissions



$N_{\text{met}}$  = fraction of daily  $\text{NH}_3$  emission



# NH<sub>3</sub> bidirectional exchange



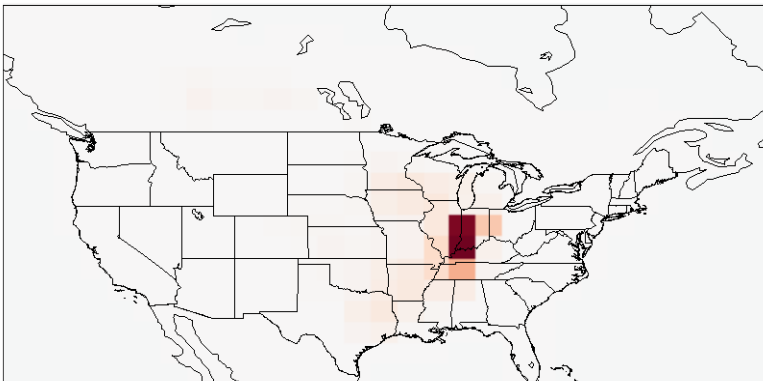
Implemented for the 1<sup>st</sup> time in a global model (Zhu et al., 2014)

Based on scheme developed for CMAQ (Bash et al., 2013)

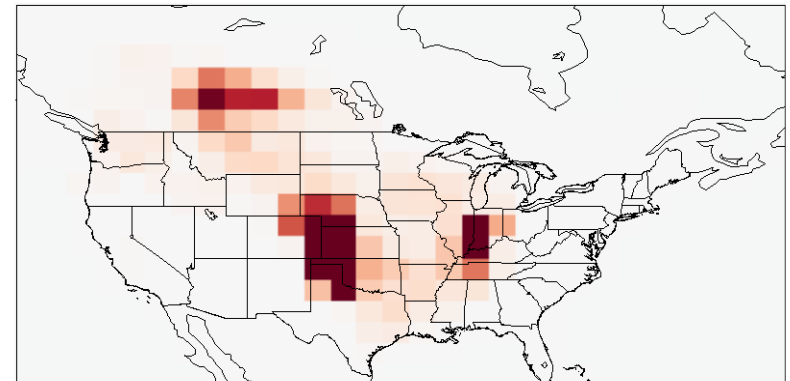
Bidi-exchange increases the "lifetime" of NH<sub>3</sub>:

$$\frac{\partial J(\text{NH}_3)}{\partial \sigma_{\text{NH}_3}}$$

BASE

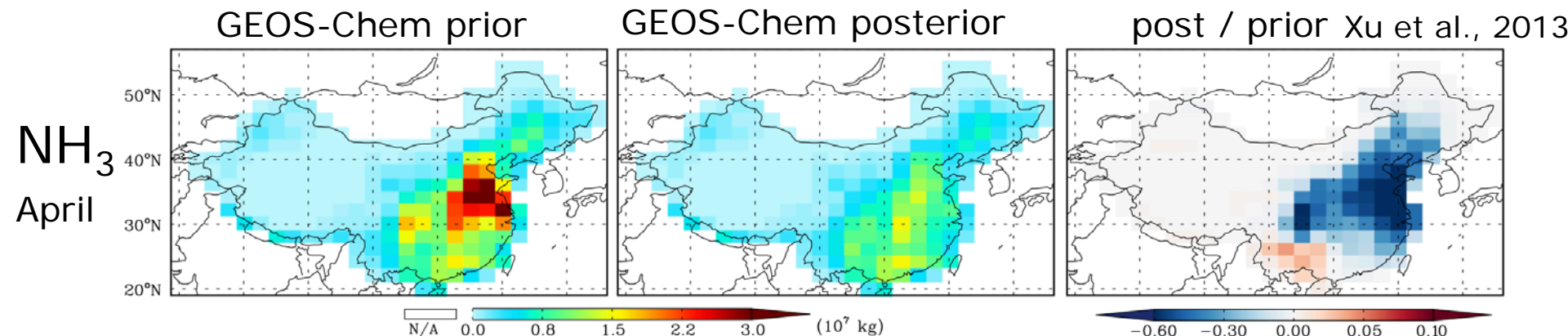


BIDI

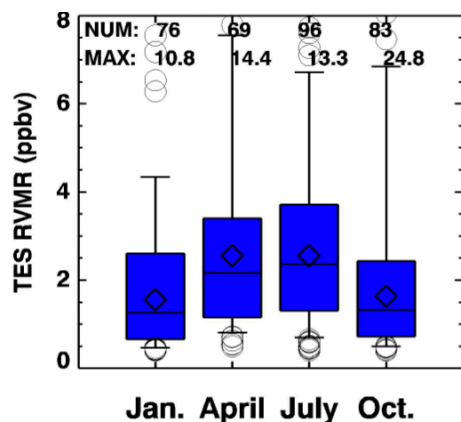


-600 -200 200 600 [kg/box]

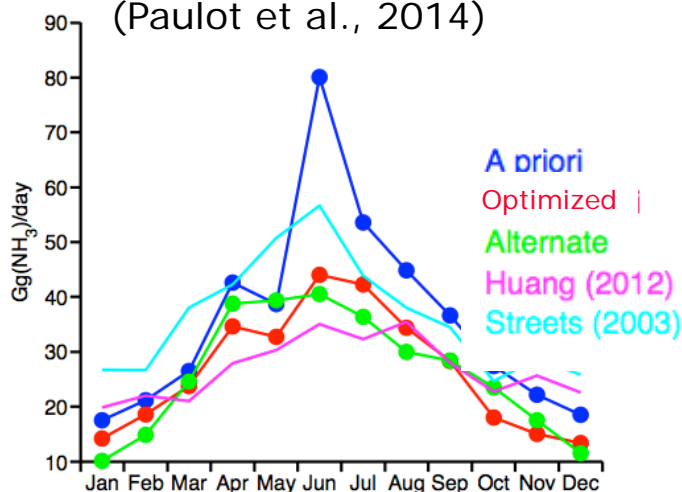
# Constraining speciated aerosol sources using MODIS AOD



TES NH<sub>3</sub>  
observations  
(Shephard et al., 2011)



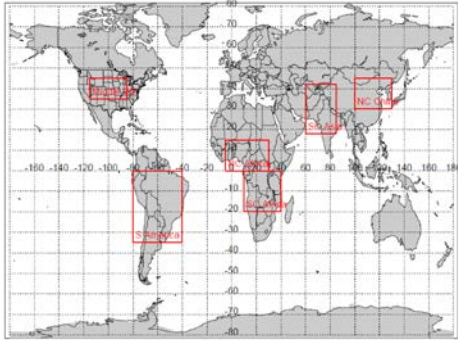
Inversion using wet NH<sub>x</sub> deposition  
(Paulot et al., 2014)



Top-down constraints agree with recent bottom up inventories: Huang (2012) and Alternate.

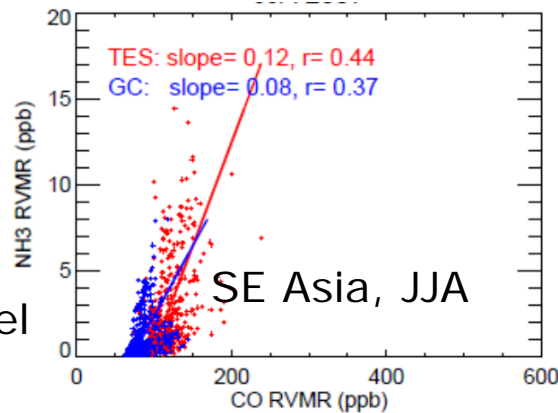
Constraints on NH<sub>3</sub> from AOD-based inversion consistent with satellite NH<sub>3</sub> and NH<sub>x</sub> deposition inversion.

# Evaluation of $\text{NH}_3/\text{CO}$ ratios

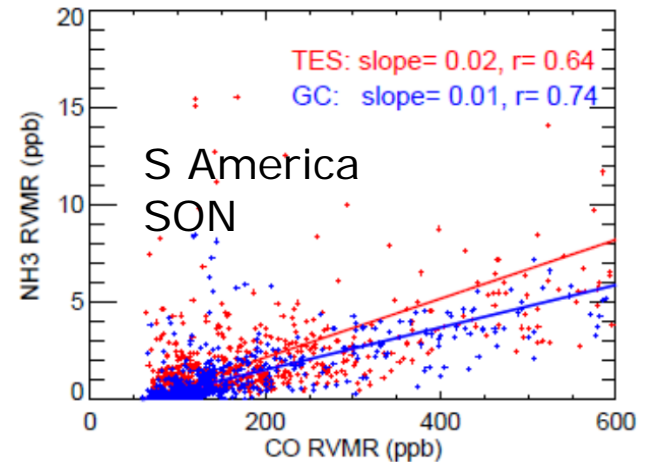
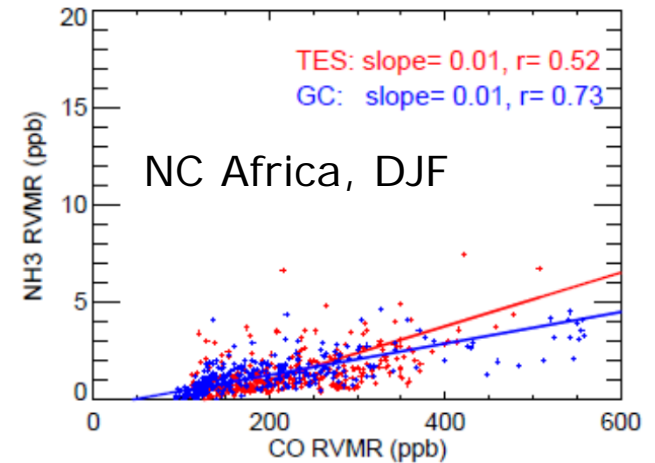


TES = satellite  
GC = GEOS-Chem model

Non-biomass  
burning impacted  
region/season



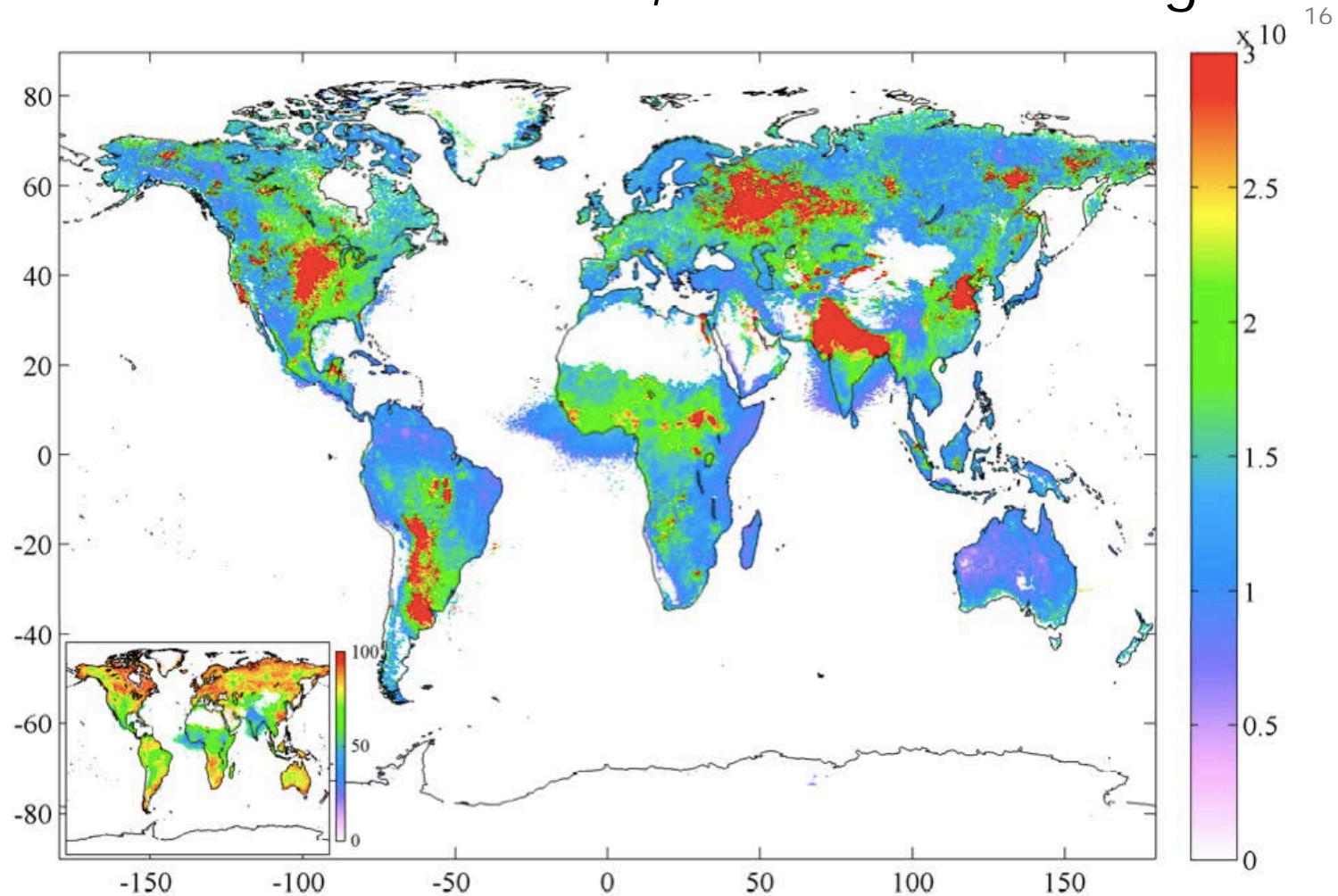
Biomass burning impacted  
region/season



- Evaluate model emissions factors
- Higher slopes indicative of biomass burning sources

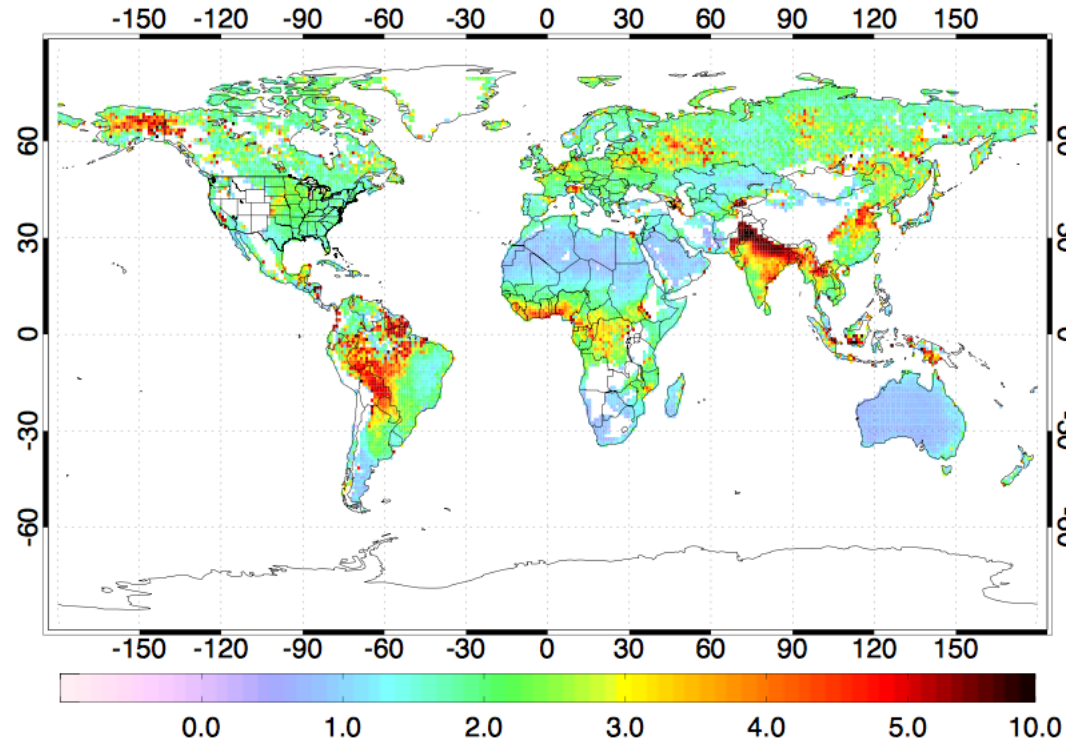
# Remote sensing of $\text{NH}_3$ : IASI

$\text{NH}_3$  total columns, 2007-2012 average



# Remote sensing of $\text{NH}_3$ : AIRS

$\text{NH}_3$  VMRs at 918 hPa, 2002-2015 average



Warner et al., ACP, 2016

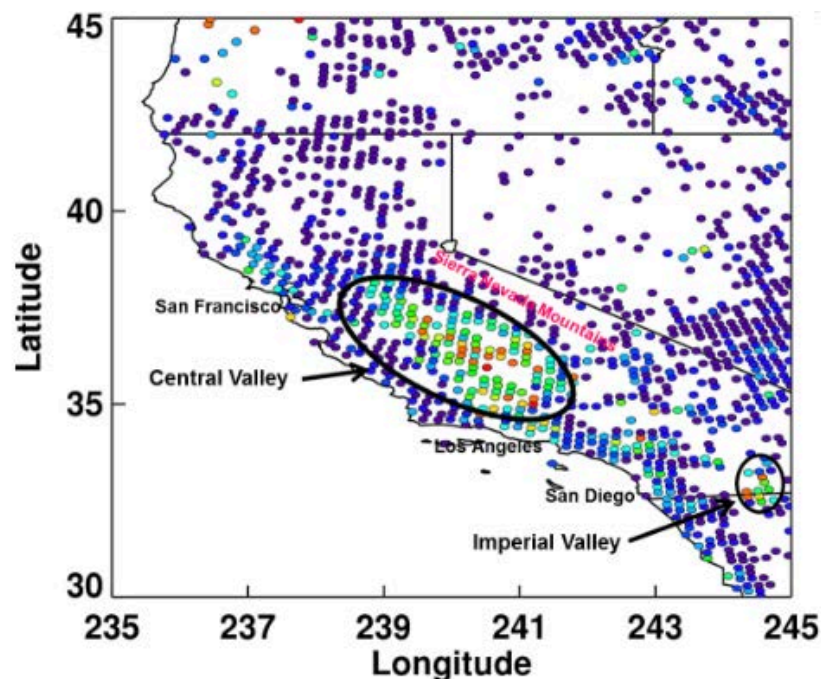


# Remote sensing of $\text{NH}_3$ : CrIS

Shephard and Cady-Pereira, AMT, 2015:

- New retrievals from CrIS (aboard Suomi-NPP)
- Will be produced operationally by end of 2017
- Much greater spatial density (x100) and sensitivity (x4) than TES
- evaluated with in situ and aircraft data

(a) CrIS: June 13, 2012



(b) TES: July 4 – 19, 2005



## Final summary

NH<sub>3</sub> emissions pose a range of concerns on regional to global scales.

In situ measurements providing increased constraints for top-down NH<sub>3</sub> emissions estimates

Inverse modeling shows regionally variable seasonality throughout the US. Also guided other AQ model improvements (diurnal variability, bidi-exchange).

More data is available now (networks, mobile measurements, satellites) to revisit these questions and further evaluate both bottom-up and top down inventories.

# *Questions?*

NH<sub>3</sub> emissions pose a range of concerns on regional to global scales.

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# Atmospheric aerosols

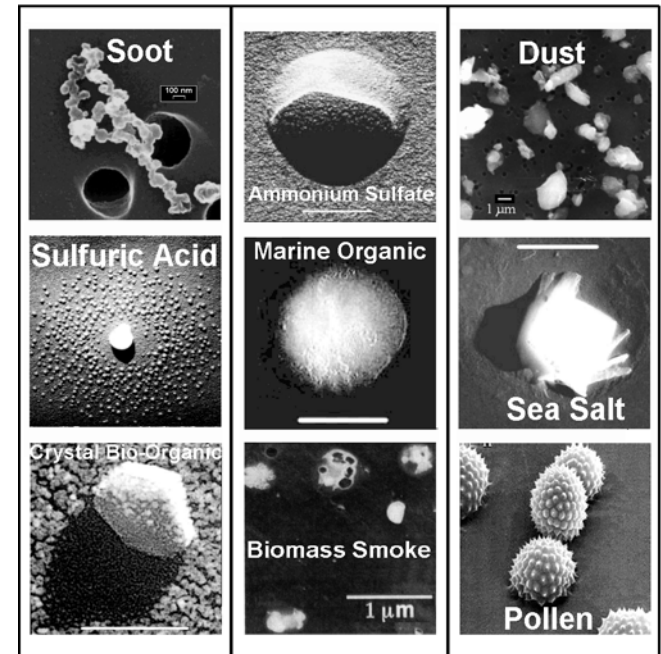
Lifetime of 3 – 10 days

Significant impacts on

- air pollution
- visibility
- climate and meteorology

From emissions of

- dust, sea-salt, BC, OC (solid)
- $\text{SO}_2$ ,  $\text{NH}_3$ ,  $\text{NO}_x$ , VOCs (gas-phase)



Peter Buseck, Arizona State

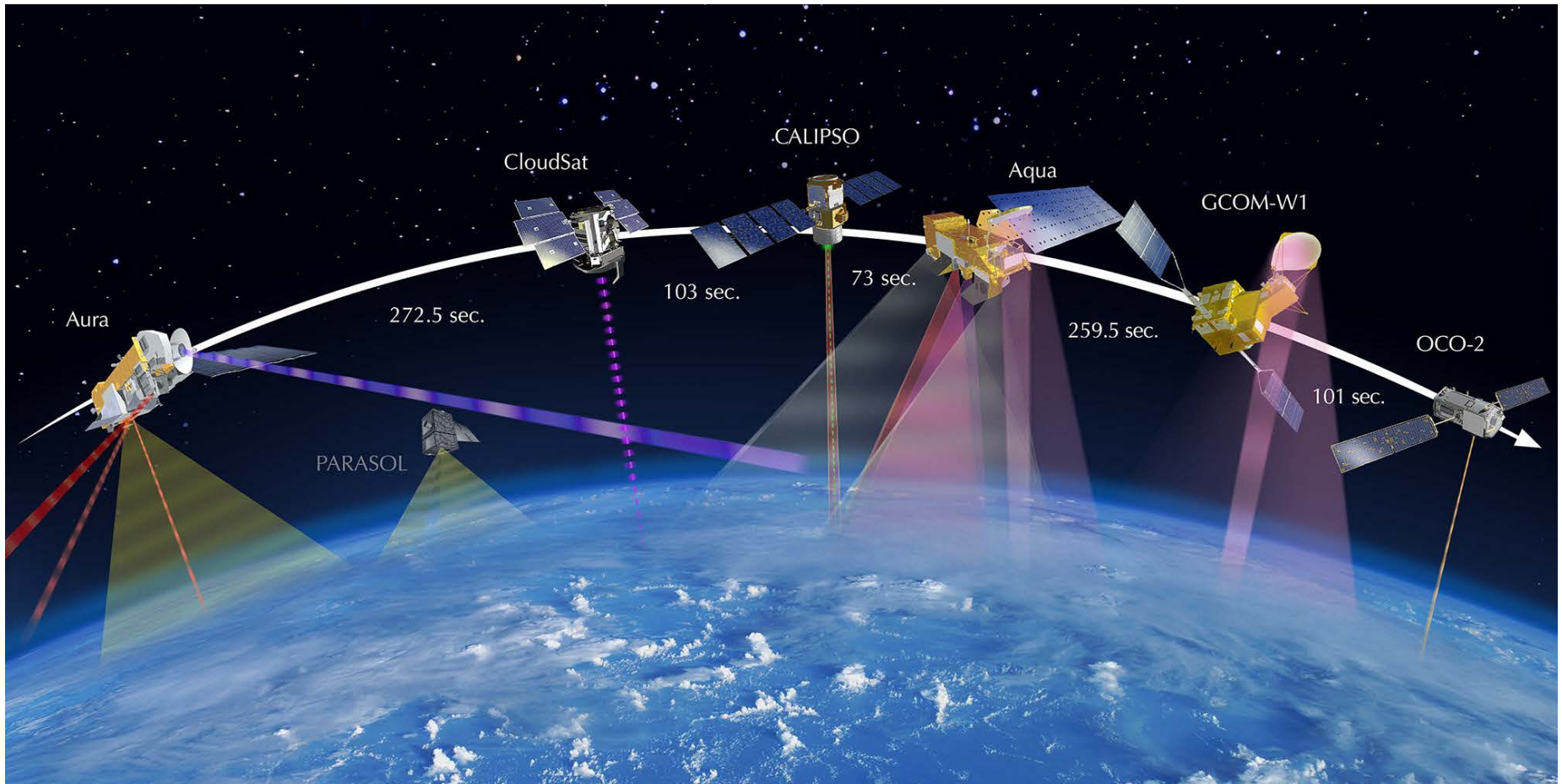
By a mix of anthropogenic and natural sources:  
transportation, energy generation, fires, industry,  
agriculture, residential heating and cooking, ...

- 4.2 (3.7-4.8) million annual premature deaths in 2015,  
#5 death risk factor (Cohen et al., Lancet, 2017).

# Current remote sensing of tropospheric composition

A-TRAIN (NASA)

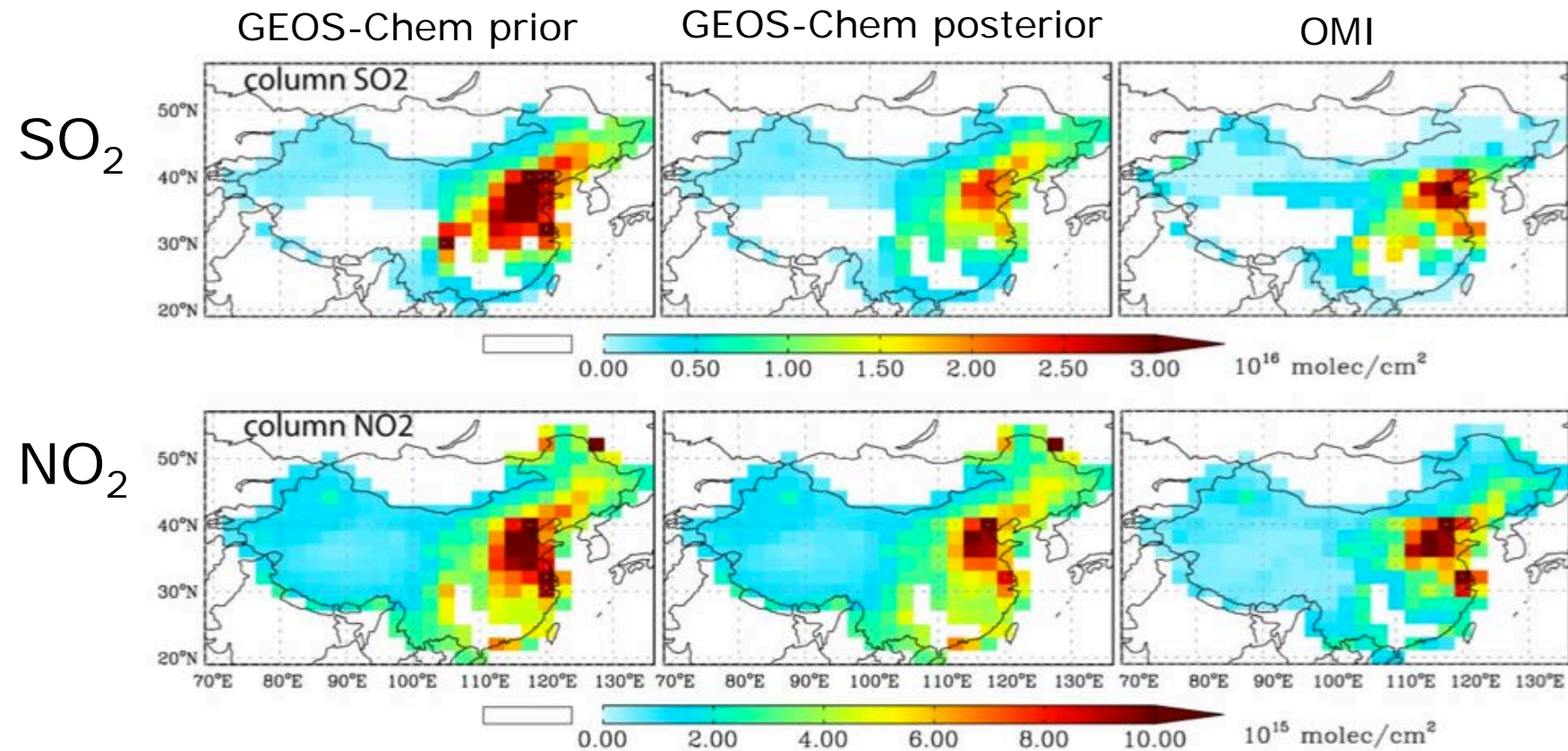
Additional measurements from NOAA (VIIRS, CrIS), ESA (IASI),  
Korea (GOCI)





# Constraining speciated aerosol sources using MODIS AOD

- constrain multiple aerosol precursor emissions with AOD
- evaluate constraints with gas-phase remote sensing



*Questions?*