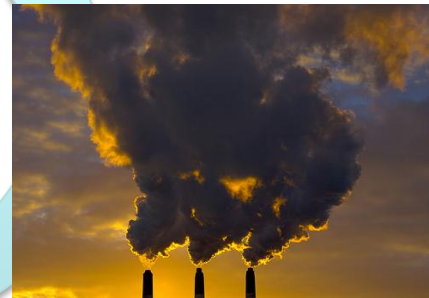
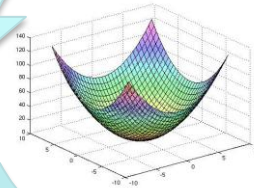
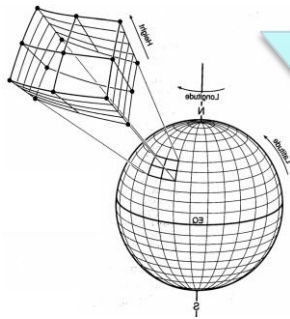
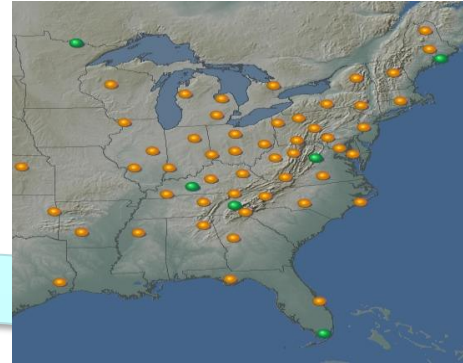


# Modeling and Observational Constraints of $\text{NH}_3$ Emissions and Sources of Nitrogen Deposition



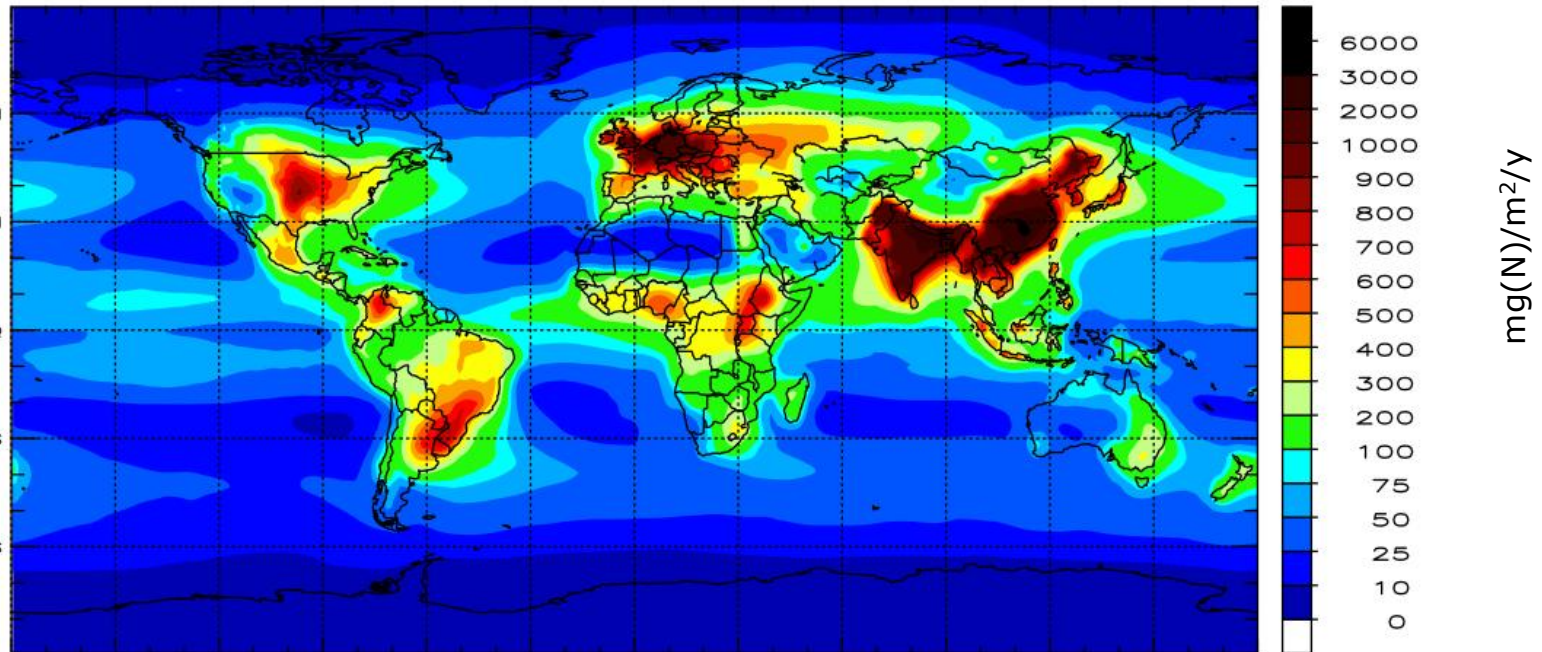
Daven K. Henze

University of Colorado, Boulder

Hyungmin Lee, Juliet Zhu, Jana Milford (CU Boulder)  
Aika Davis, Ted Russell (GIT), Gill-Ran Jeong (KIAPS)  
Fabien Paulot, Daniel Jacob, Katie Travis (Harvard)  
Jesse Bash, Robert Pinder, Riche Scheffe, James Kelly (US EPA)  
Bret Schichtel, John Vimont (NPS), Linda Pardo (USFS)

# Environmental impacts of NH<sub>3</sub>

Estimated N deposition from NH<sub>x</sub>, Dentener et al. (2006)



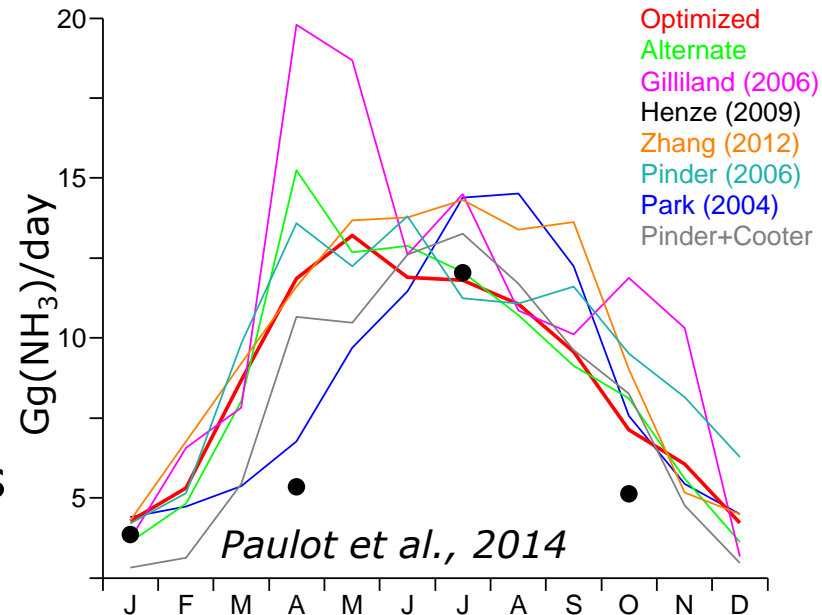
Areas where color approaches dark red --> deposited levels are hazardous to ecosystem.

NH<sub>3</sub> emissions:

- increased by factor of 2 – 5 since preindustrial era.
- to double by 2050 (*IPCC*, Denman et al., 2007; Moss et al., 2010).
- contribute to 46 Tg gap in global N budget (Schlesinger, 2009)?

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

- Global inventories also uncertain (e.g., Beuson et al., 2008)
- Substantial variability in estimates of total US NH<sub>3</sub> emissions.
- Large uncertainties at regional scales (e.g., Novak et al., 2012; Walker et al., 2012)



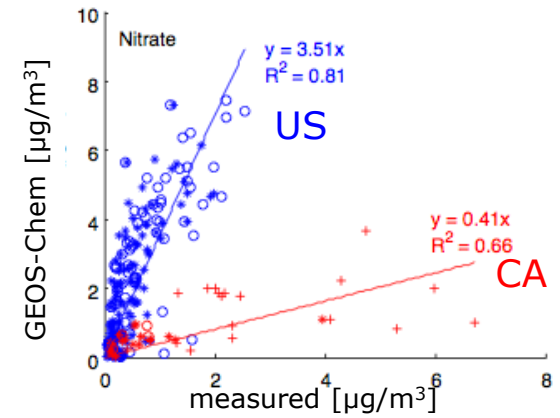
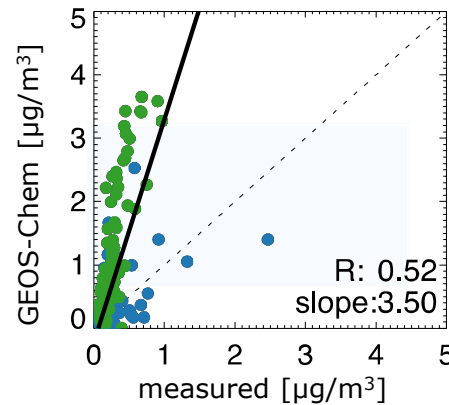
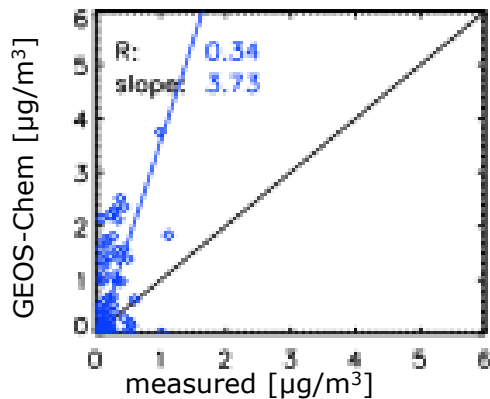
## Why so uncertain?

- lack of direct source measurements (hard, expensive)
- difficulty in relating associated species to NH<sub>3</sub> sources
  - constraints from observations of [NH<sub>4</sub><sup>+</sup>] or [NH<sub>x</sub>]  
complicated by model/measurement error, precipitation
  - observations of [NH<sub>3</sub>] less prevalent

# Uncertainties in NH<sub>3</sub> emissions: Implications for air quality and environment

- contribute to errors in assessing PM<sub>2.5</sub>

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 SO<sub>x</sub>, NO<sub>x</sub> to control N<sub>r</sub> dep (e.g., Koo et al., 2012)
- uncertainties in projections of aerosol direct radiative forcing impacts (Henze et al., 2012)

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

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

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

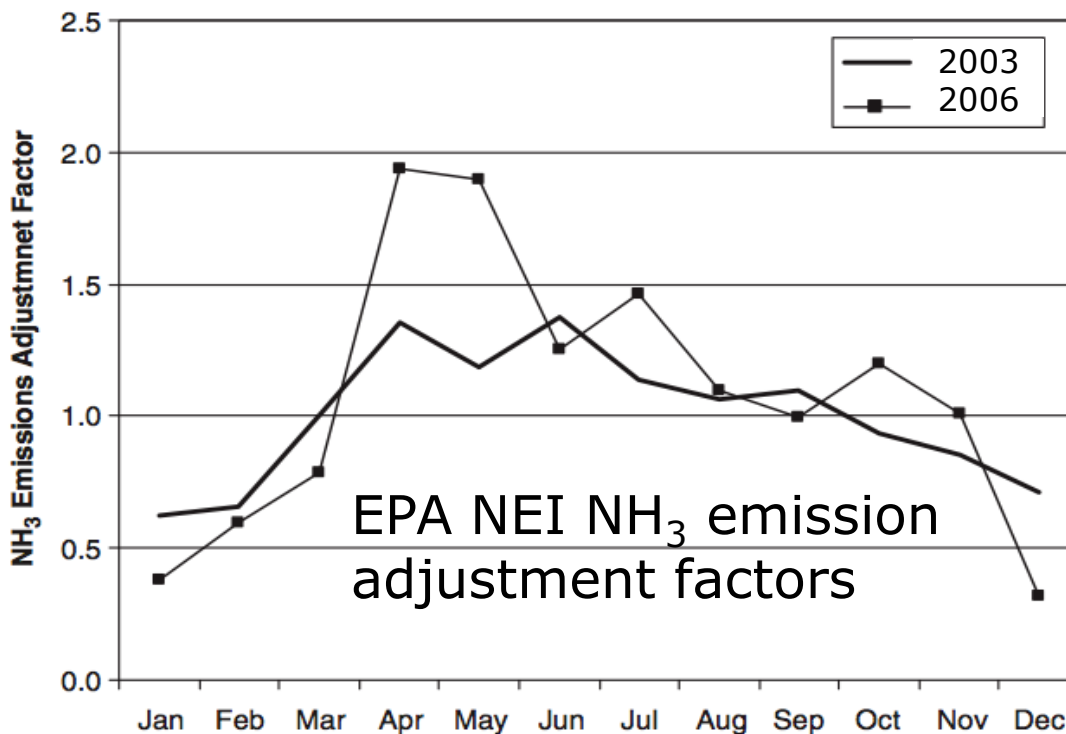
**Method:** adjust (w/Kalman Filter) monthly nationwide scale factors

## Results:

Gilliland et al., 2003;  
Gilliland et al., 2006

## Assumptions:

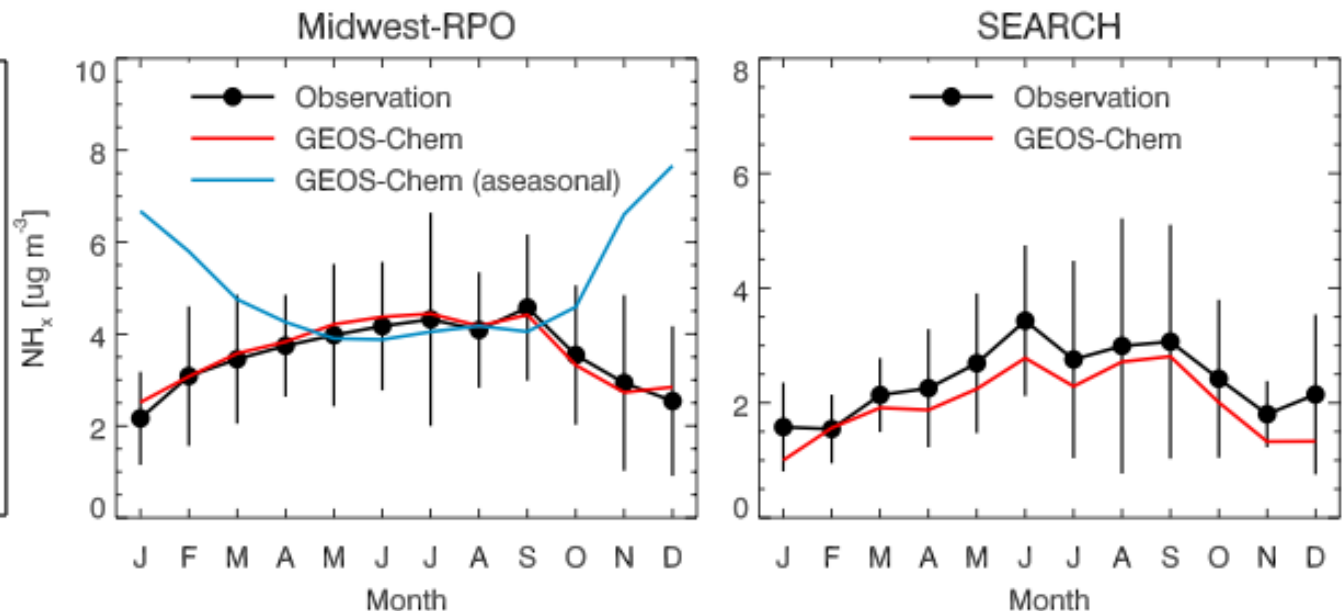
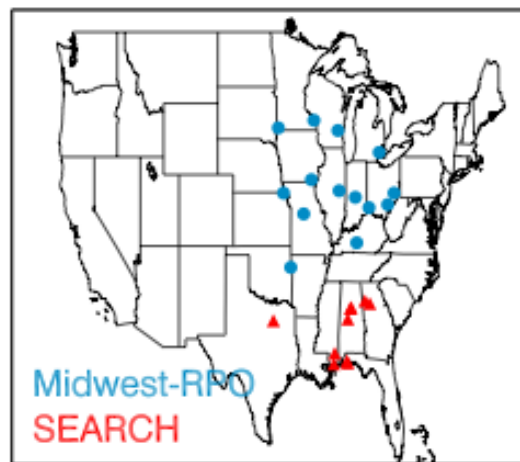
- uniform seasonality throughout broad regions of US



# 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



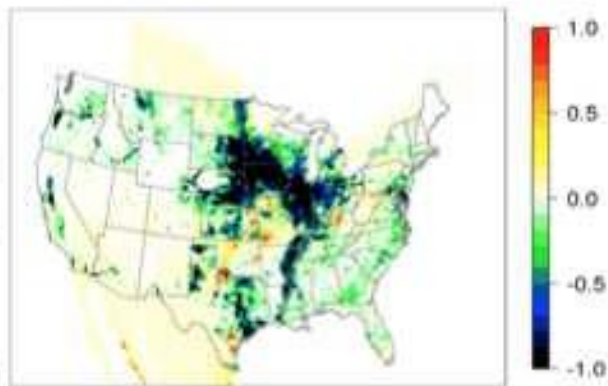
- Resulting annual  $\text{NH}_x$  and  $\text{NO}_3$  deposition unbiased.
- Enforces a spatially uniform seasonality / correction factor across the US.



# Spatial heterogeneity in source-receptor relationships for $\text{NH}_3$

Consider emissions perturbation,  $\Delta\text{emiss}$ :

April



$\Delta[\text{NH}_3]$

$\Delta$  wet dep [ $\text{NH}_x$ ]

0.83

0.54

July



0.17

-0.06

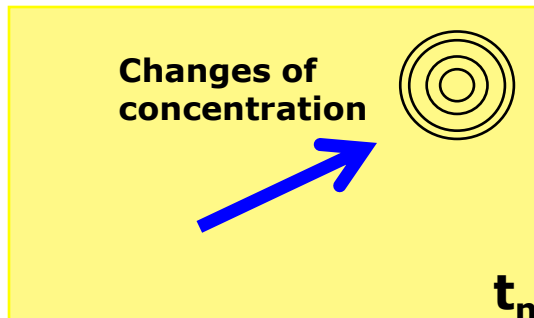
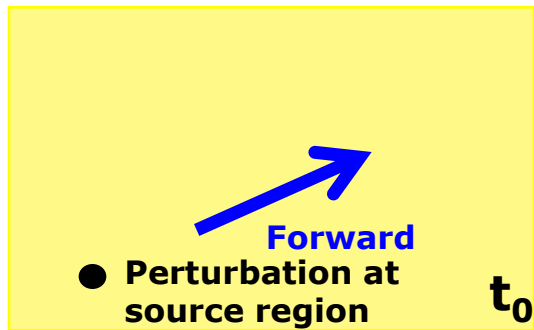
Kg  $\text{NH}_3$ /ha/month

Spatially heterogeneous impacts of  $\text{NH}_3$  emissions – can be accounted for using 4D-Var / adjoint inversions

# Source attribution techniques

## Forward Model (source-oriented)

Sensitivity of all model concentrations to one model source or sector

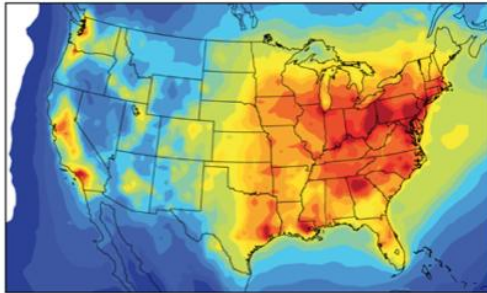




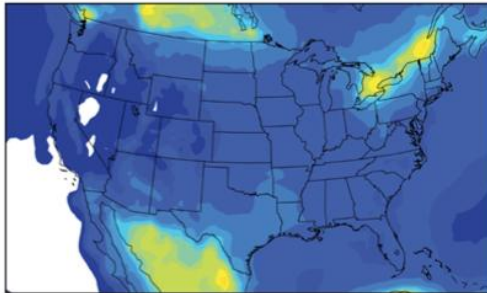
# Source attribution techniques

## Forward Model (source-oriented)

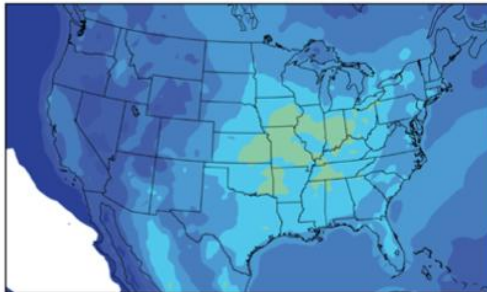
Nitrogen deposition enhancement



US  
Anthropogenic  
5.0 Tg N / yr



Foreign  
Anthropogenic  
0.42 Tg N / yr



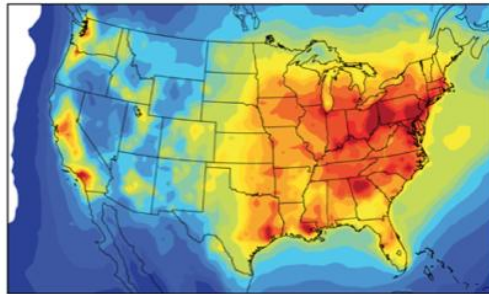
Natural  
1.0 Tg N / yr



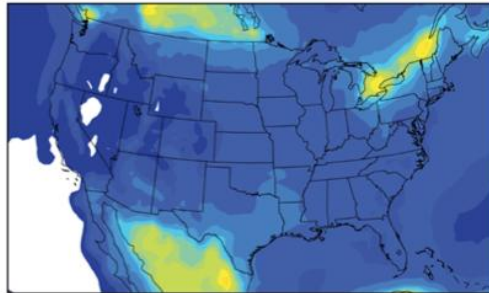
# Source attribution techniques

## Forward Model (source-oriented)

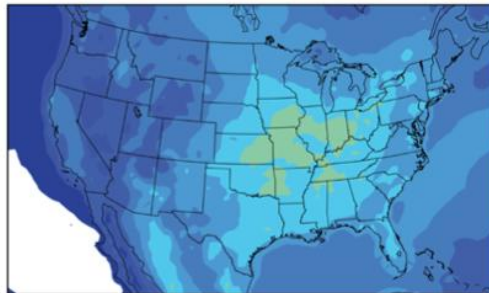
Nitrogen deposition enhancement



US  
Anthropogenic  
5.0 Tg N / yr



Foreign  
Anthropogenic  
0.42 Tg N / yr



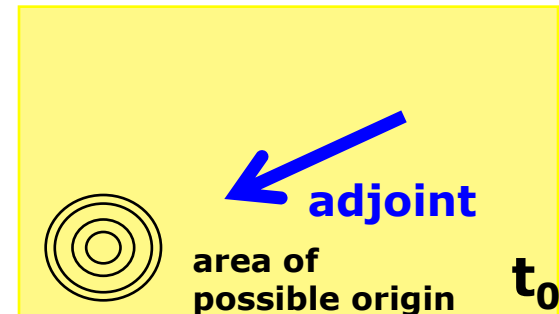
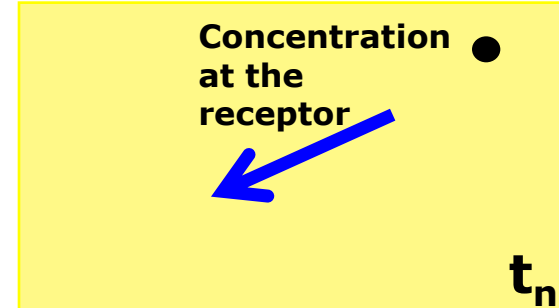
Natural  
1.0 Tg N / yr



Zhang et al., 2012 [kg N ha<sup>-1</sup> a<sup>-1</sup>]

## Adjoint Model (receptor-oriented)

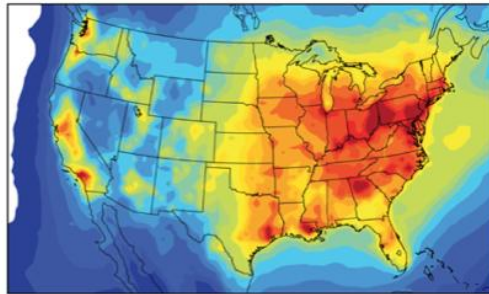
Sensitivity of model concentration in specific location to many model sources and sectors



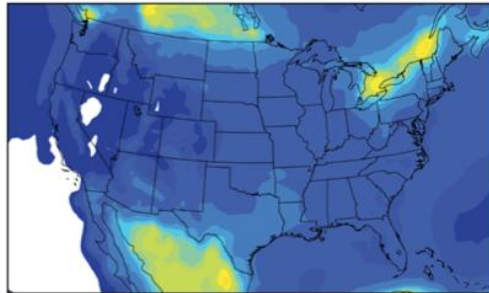
# Source attribution techniques

## Forward Model (source-oriented)

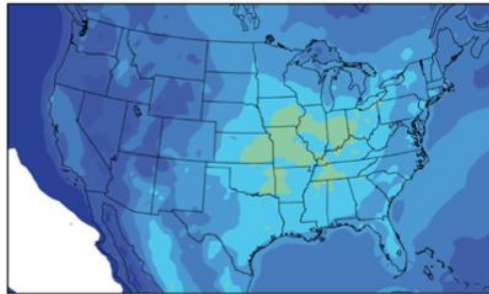
Nitrogen deposition enhancement



US  
Anthropogenic  
5.0 Tg N / yr



Foreign  
Anthropogenic  
0.42 Tg N / yr

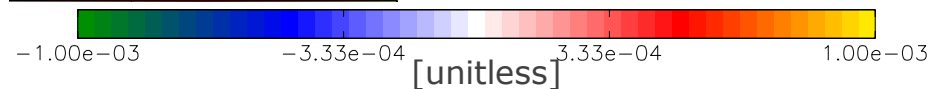
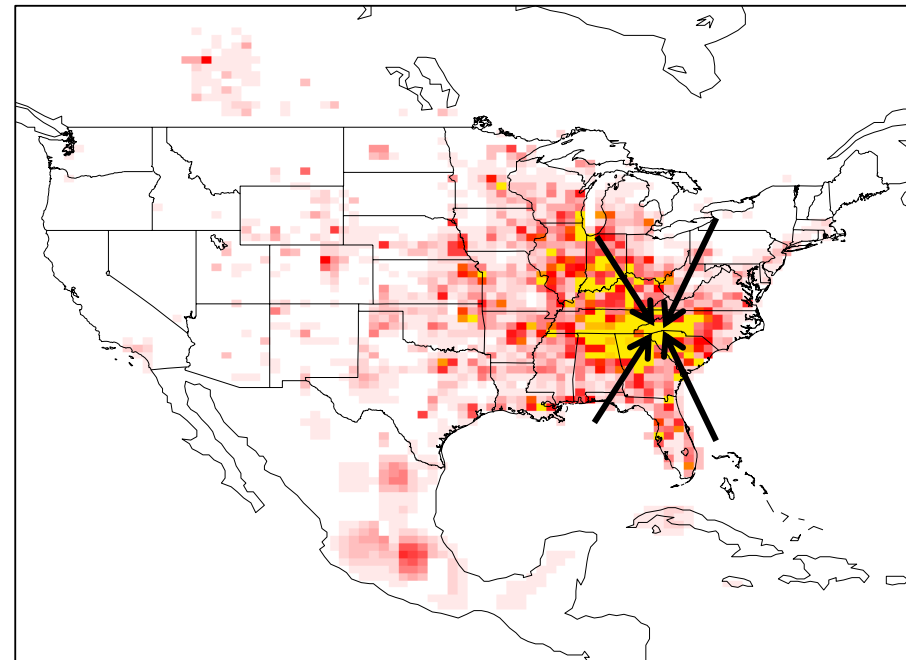


Natural  
1.0 Tg N / yr



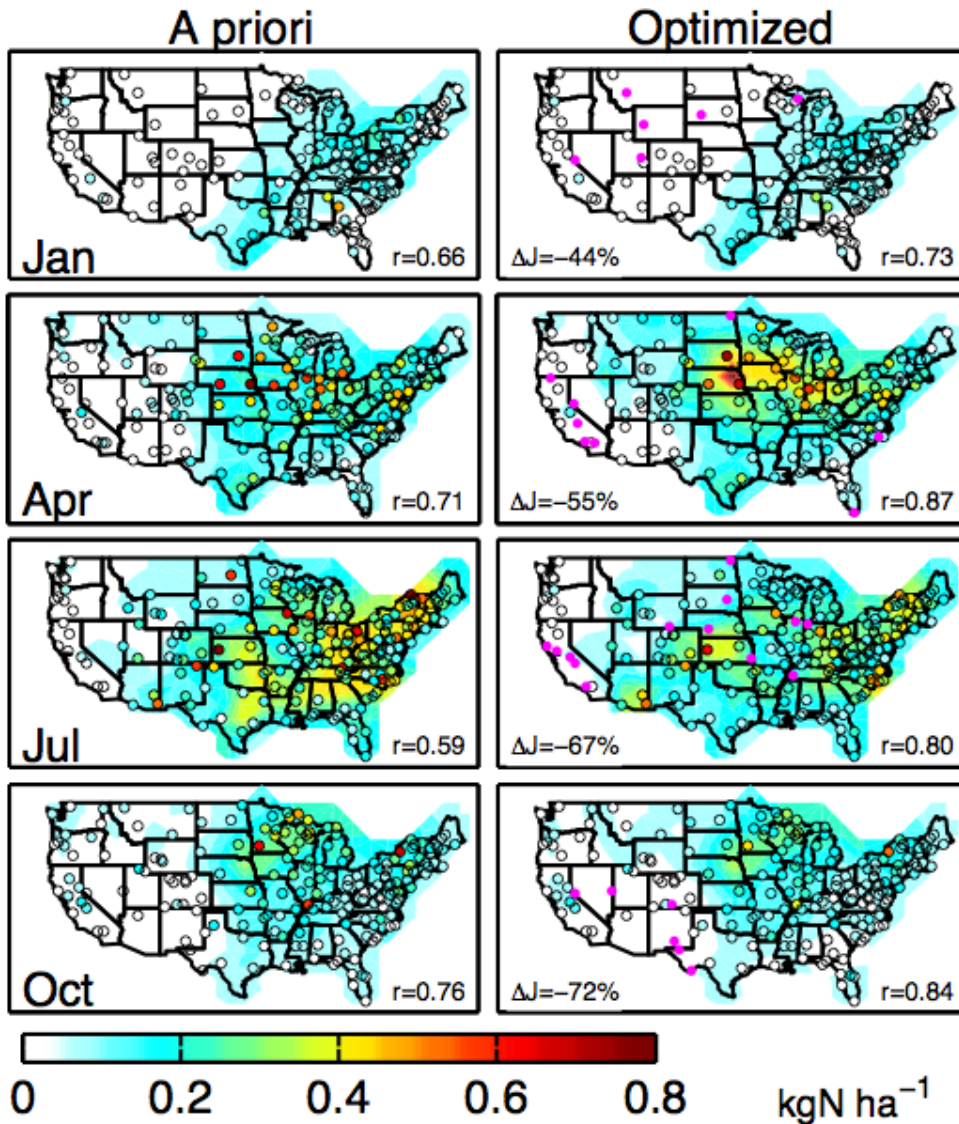
Zhang et al., 2012 [kg N ha<sup>-1</sup> a<sup>-1</sup>]

## Adjoint Model (receptor-oriented)



Using receptor = sum of squared model error, these relationships can be used for high resolution inverse modeling

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

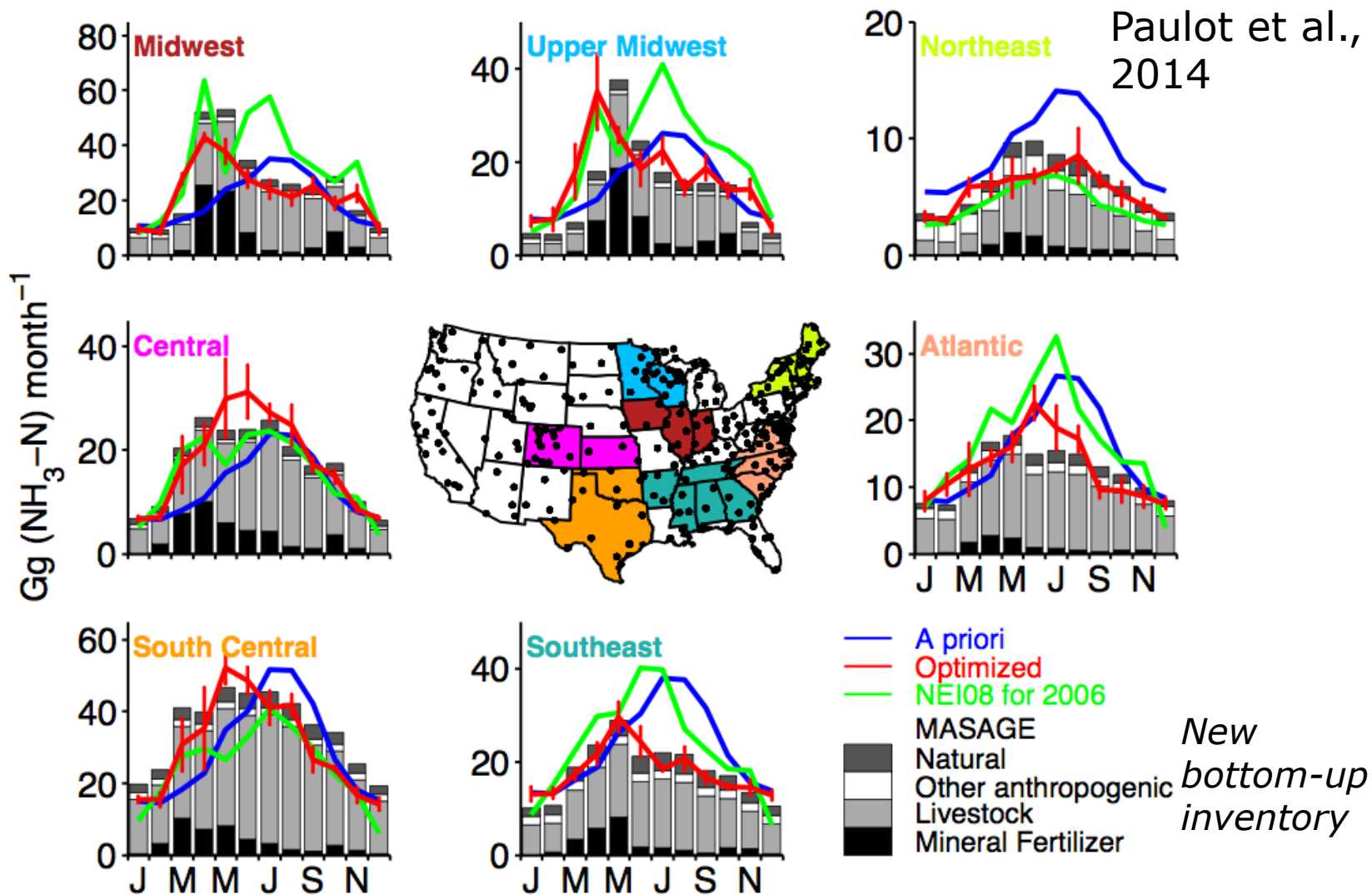


Paulot et al., 2014

- 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

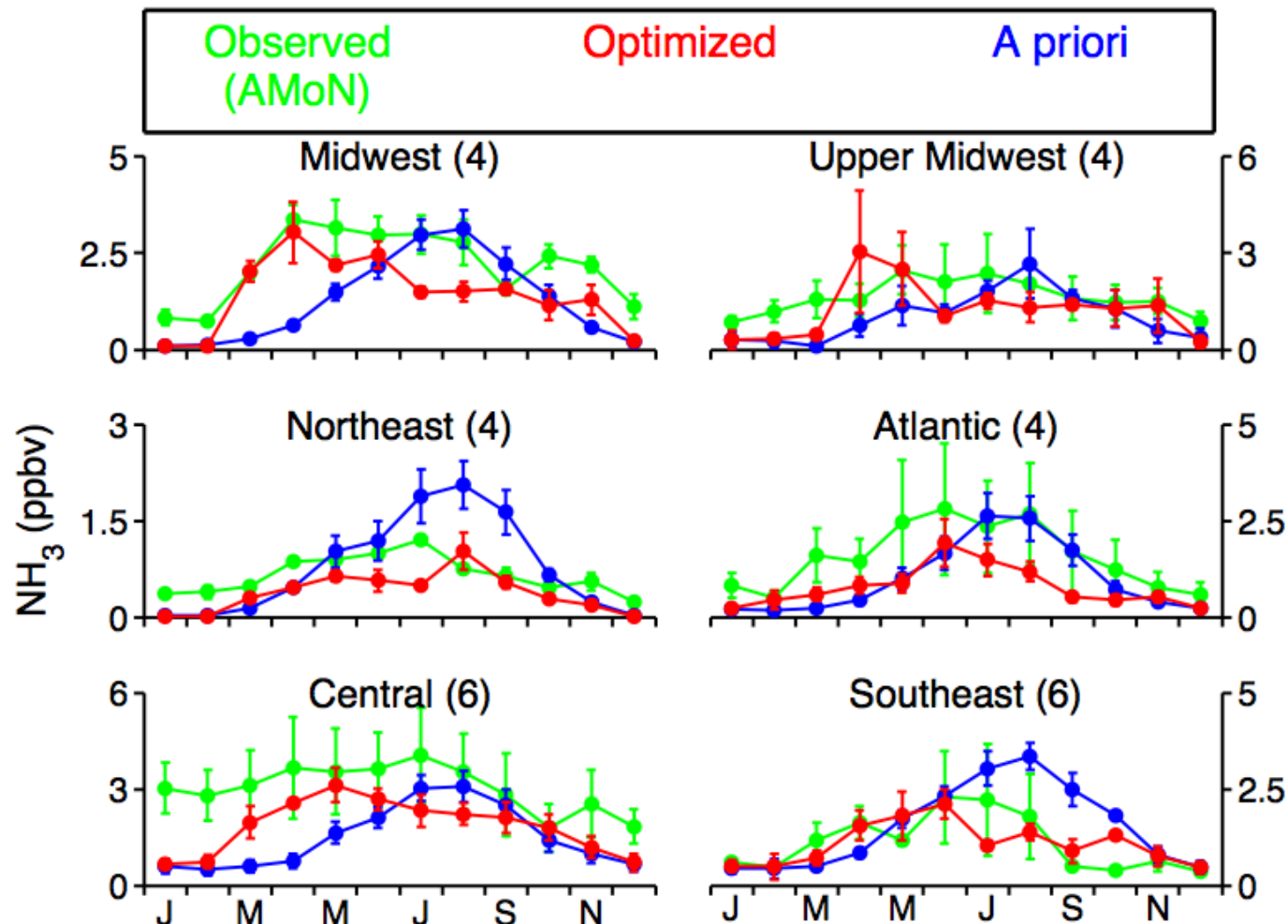


No support for homogeneous seasonality in the US.

New bottom-up inventory (MESSAGE) can reproduce optimized emissions in some areas.

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

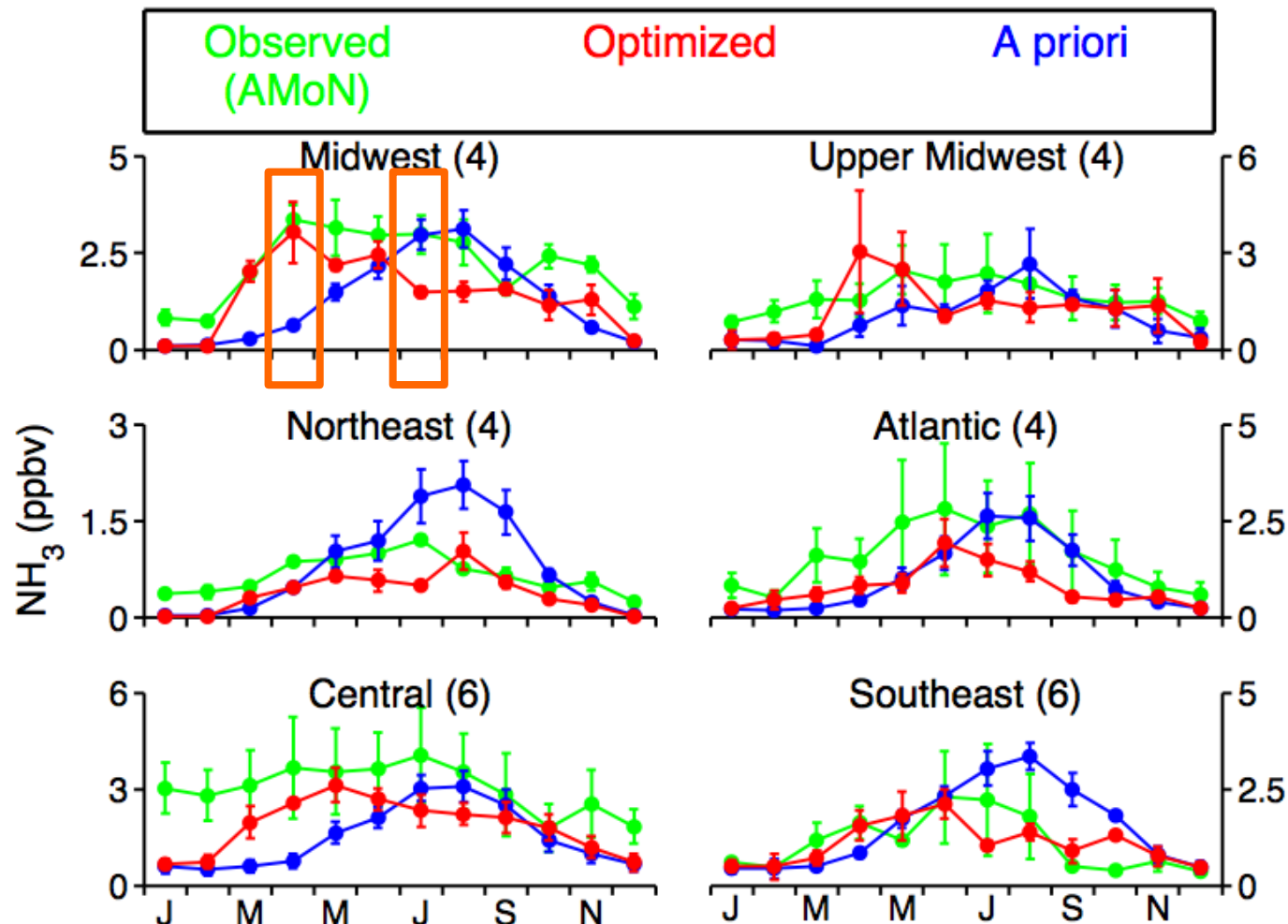
Comparison to surface  $\text{NH}_3$  measurements (Puchalski et al., 2011) before and after assimilation:



Paulot et al.,  
2014

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

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



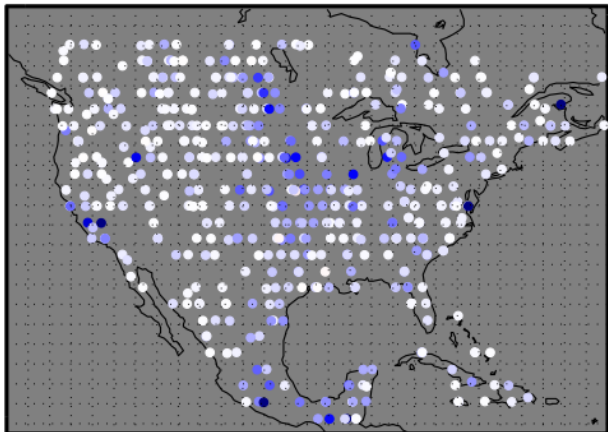
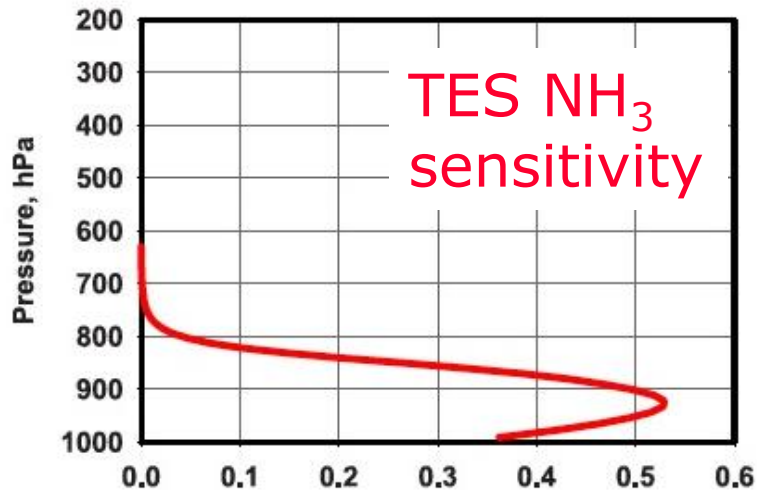
Paulot et al.,  
2014

Closure for  $\text{NH}_x$  deposition does not necessarily imply better model  $\text{NH}_3$



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

## Remote sensing with TES and IASI:



### TES:

- 5 km x 8 km footprint
- sensitive to BL
- detection limit of  $\sim 1$  ppb
- bias of +0.5 ppb

*more precise & sparse than IASI*

(Beer et al., 2008; Clarisse et al., 2009;  
Clarisse et al., 2010; Mark Shephard et al.,  
2011)

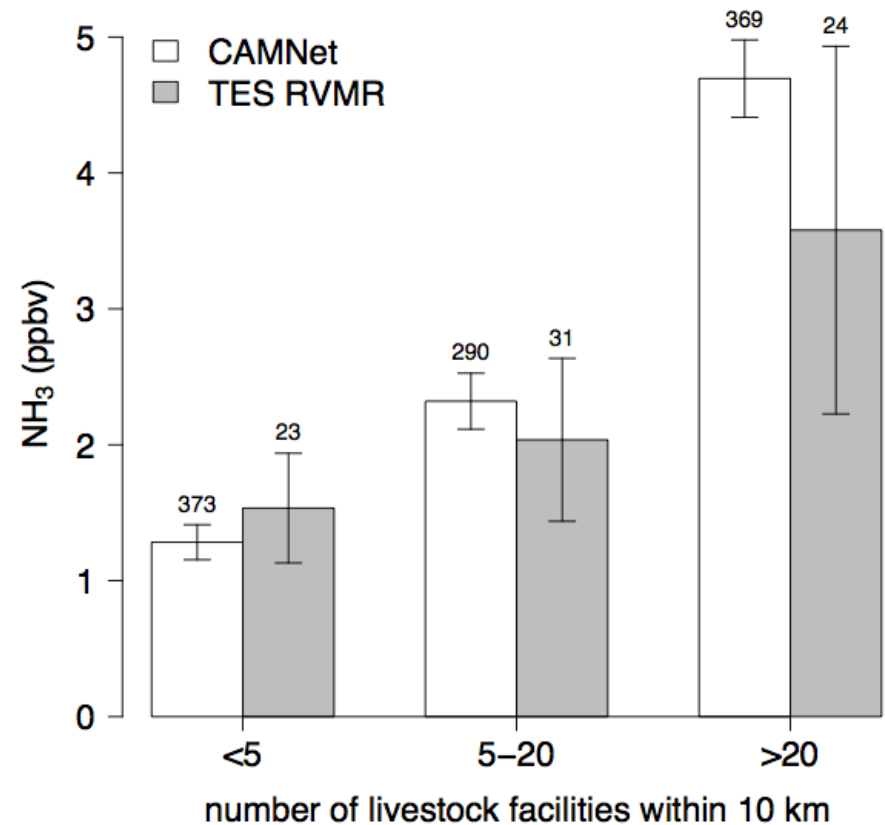
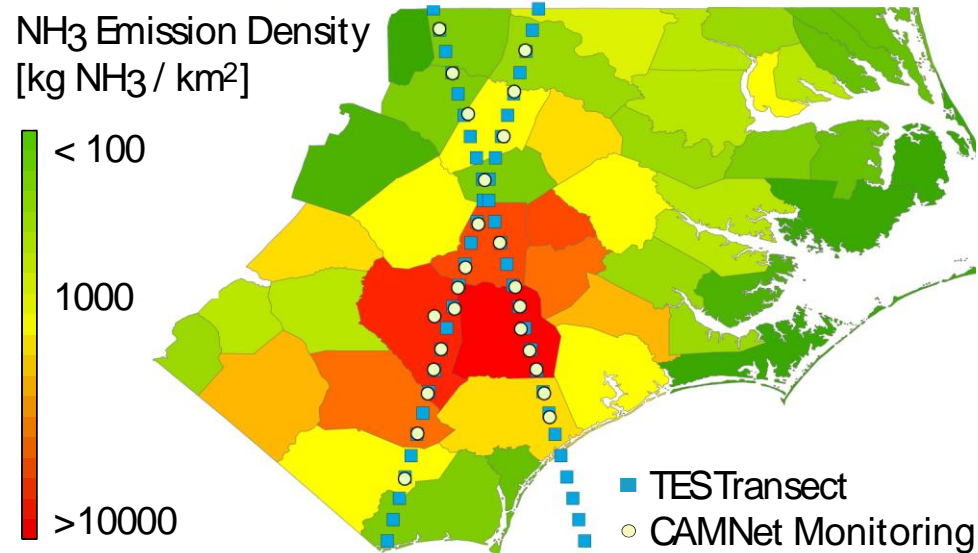
## Passive surface measurements:

EPA's AMoN sites (>2007)  
(Puchalski et al., 2011)

Also LADCO, SEARCH, CSU,  
ANARChE

# Validating TES NH<sub>3</sub> with surface observations

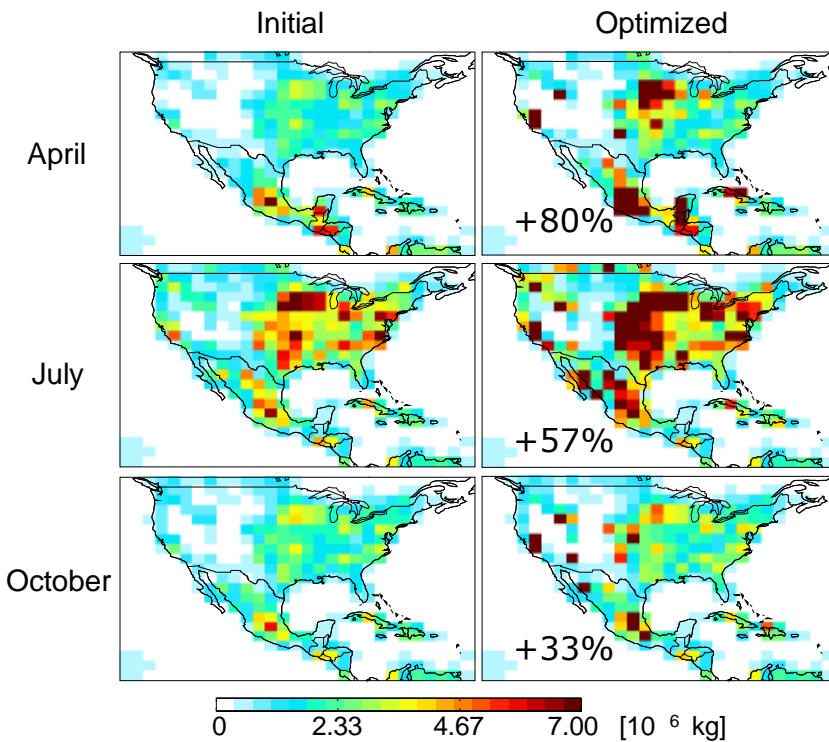
Overlap surface obs with TES Transects for 2009:



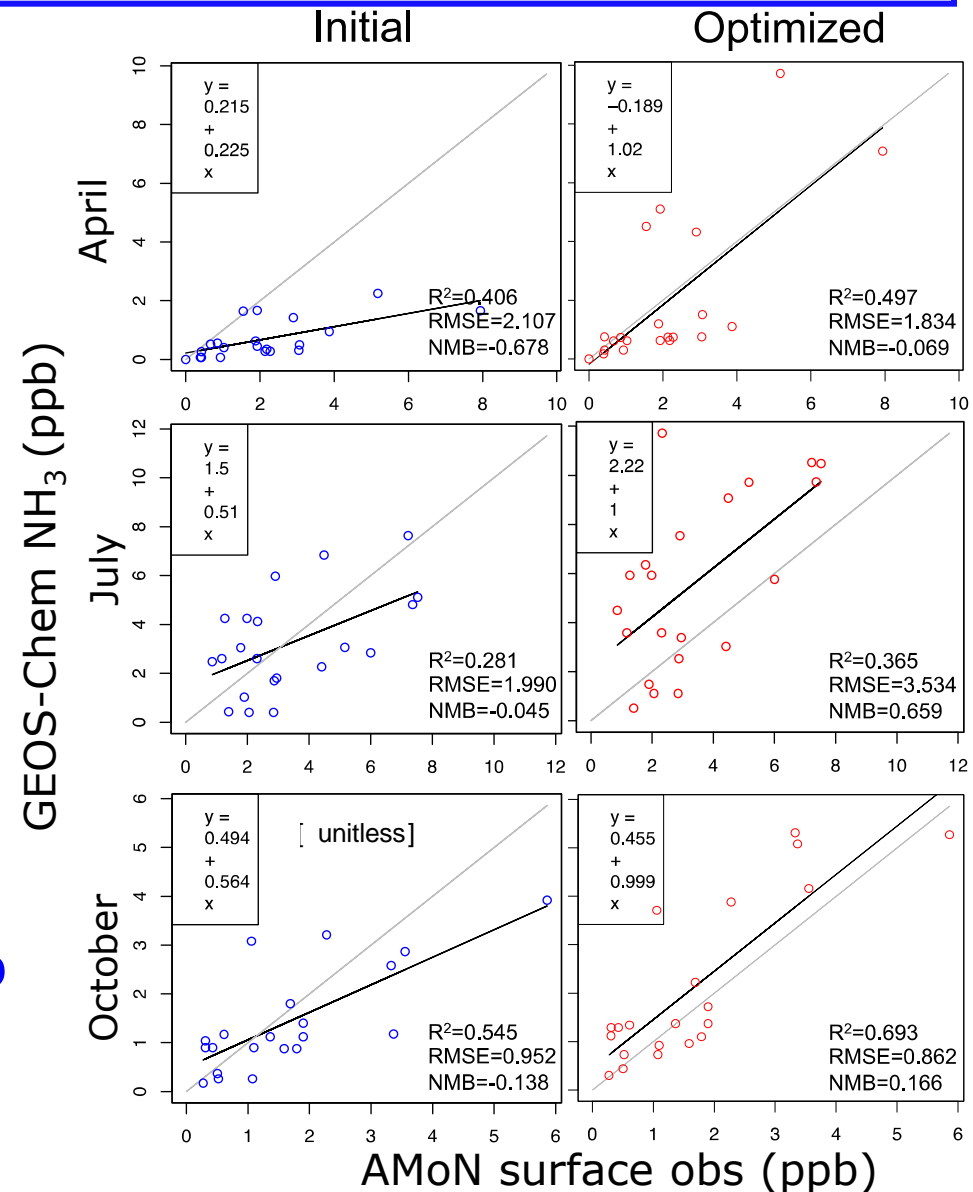
TES reflects real-world spatial gradients and seasonal trends

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

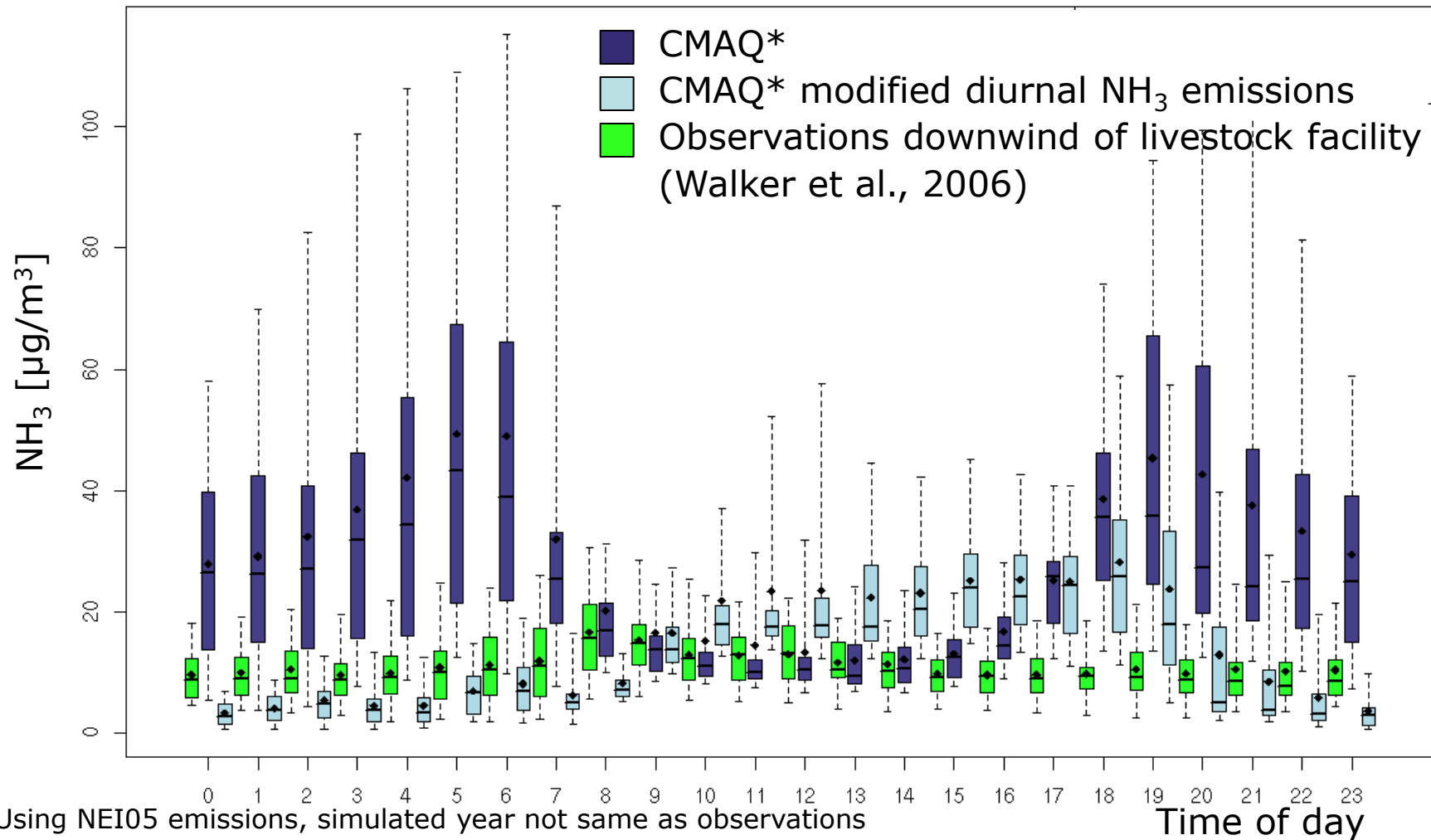
## $\text{NH}_3$ emissions in GEOS-Chem



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



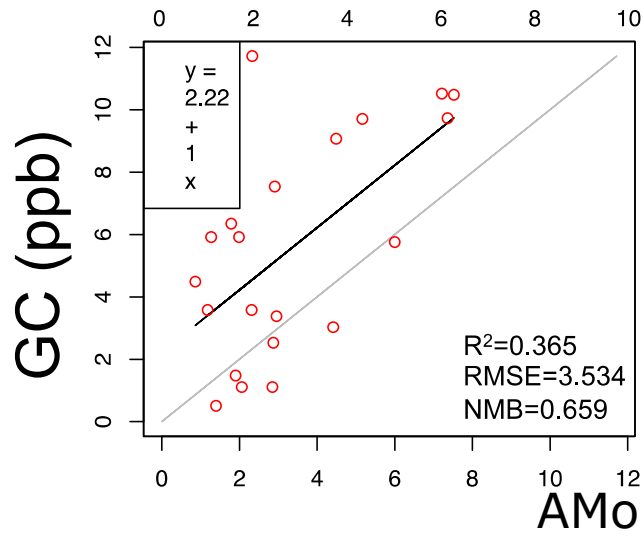
# Diurnal variability of $\text{NH}_3$ : case study in Warsaw, NC, with CMAQ regional model



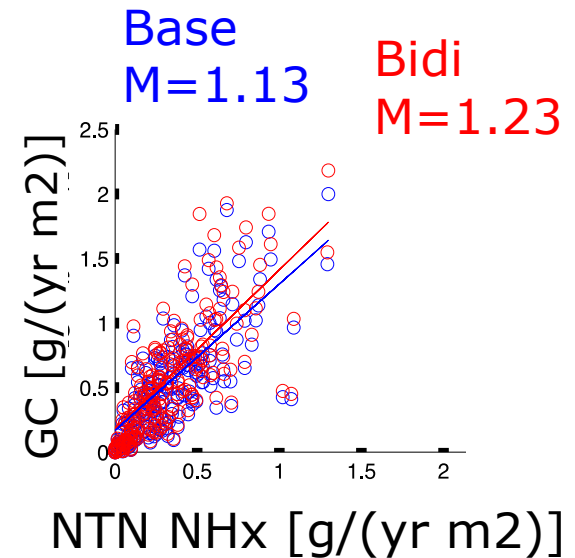
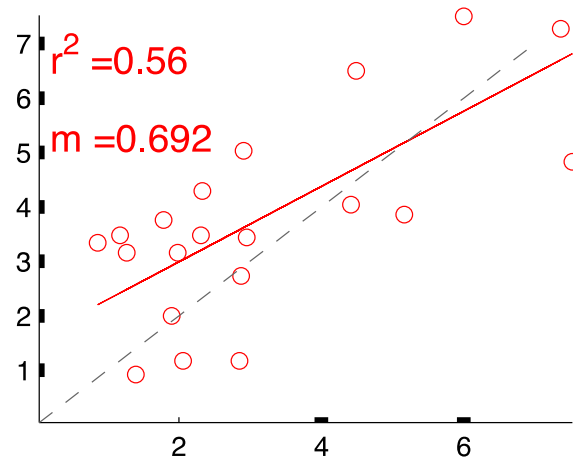
Improved diurnal variability (Bash) can help resolve discrepancies between in situ and satellite obs (Jeong et al., submitted)

# Impacts of bidirectional exchange in GEOS-Chem

Optimized  
(Zhu et al 2013)



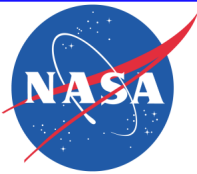
Bidi applied to  
optimized emissions



Improved (mechanistic) representation of NH<sub>3</sub> fluxes may help resolve inconsistencies between NH<sub>3</sub> and [NH<sub>x</sub>]<sub>dep</sub> constraints.

Other considerations in remote-sensing constraints:

- temporal sampling bias
- spatial sampling bias



# NASA AQUEST Tiger Team



## Overview:

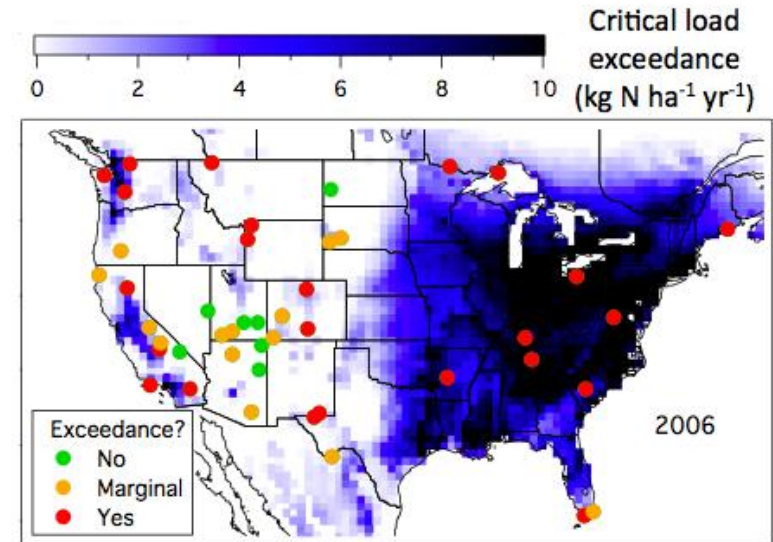
- multi-model assessment of current and future sources of reactive nitrogen deposition in Class I and at-risk ecosystems in the US

## Members:

- Daven Henze, Jana Milford (CUB)
- Fabien Paulot, Daniel Jacob (Harvard)
- Aika Yano, Ted Russell (Georgia Tech)
- Bret Schichtel, John Vimont (NPS)
- Rich Scheffe, James Kelly (US EPA)
- Linda Pardo (USFS)

## Tools / Observations:

- $\text{NH}_3$  remote sensing, in situ observations (RMNP,...)
- GEOS-Chem and CMAQ models
- Source attribution techniques: sector perturbations, DDM, adjoint



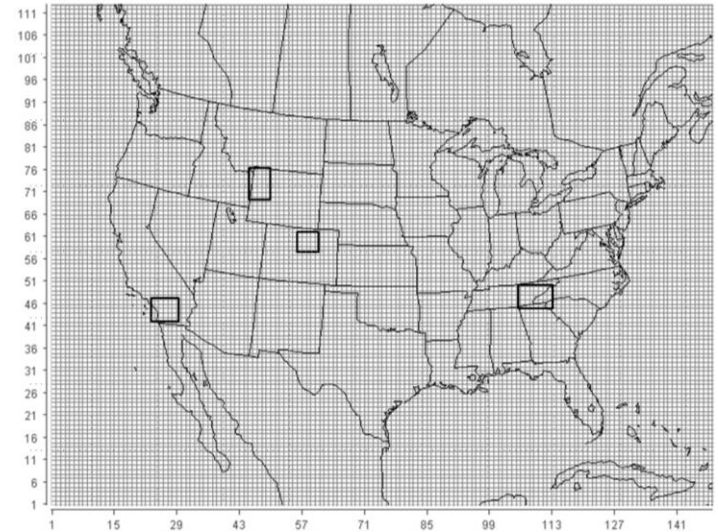
Ellis et al., 2013)

*What are the sources contributing to exceedences in Federal Class I Areas?*

# model configurations and domains

## CMAQ v5:

- 36km CONUS
- 4km over NPs
- 2010
- NEI 2005 scaled to 2010
- Bidirectional  $\text{NH}_3$  exchange
- CB05 with Pleim-Xiu LSM
- WRF v3

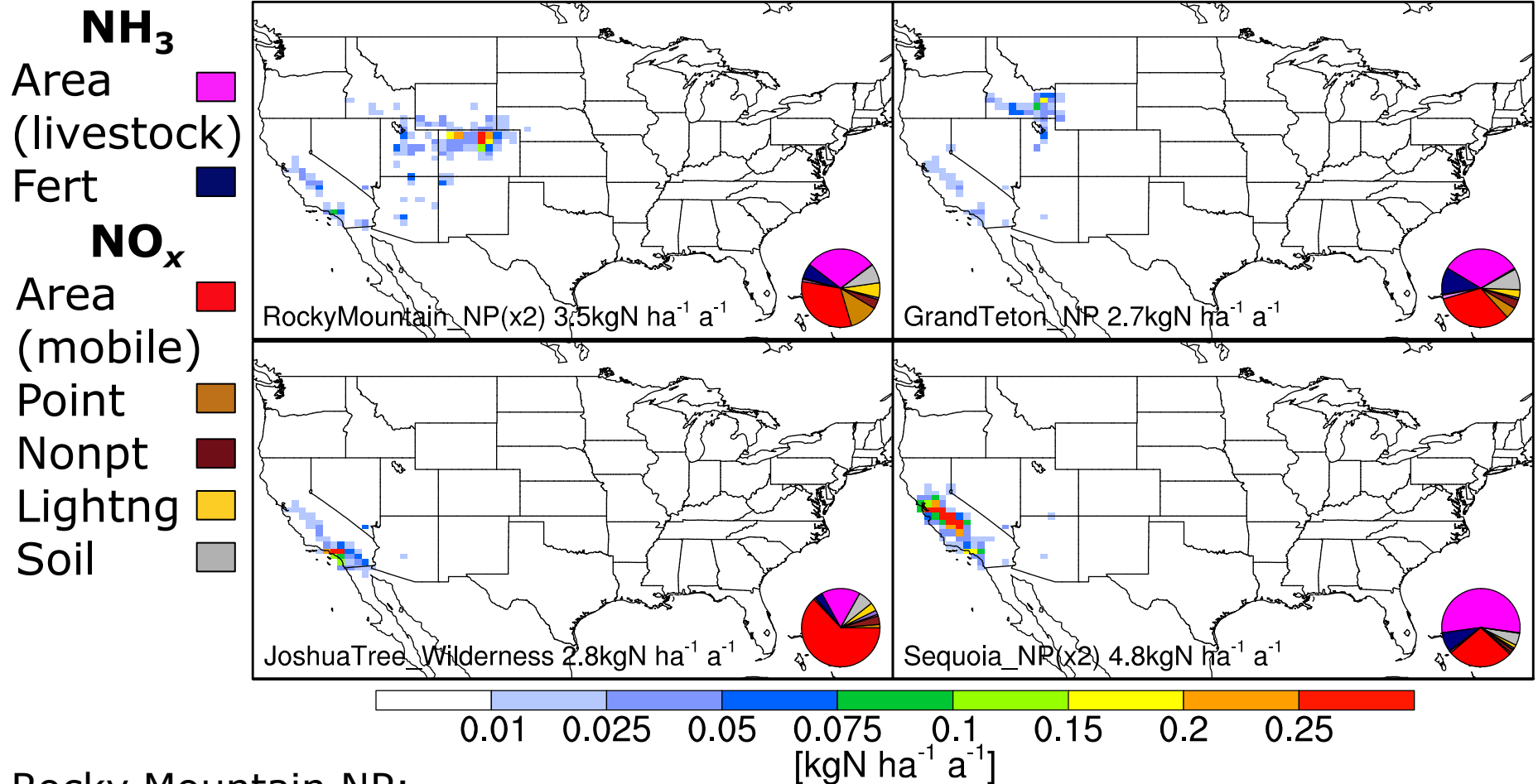


## GEOS-Chem:

- $0.5^\circ \times 0.667^\circ$
- 2010
- NEI 2008
- GFEDv3



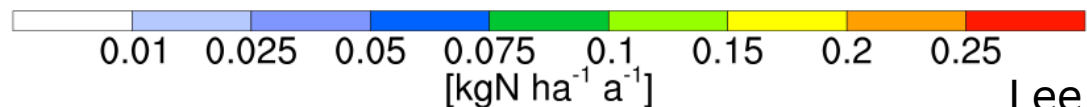
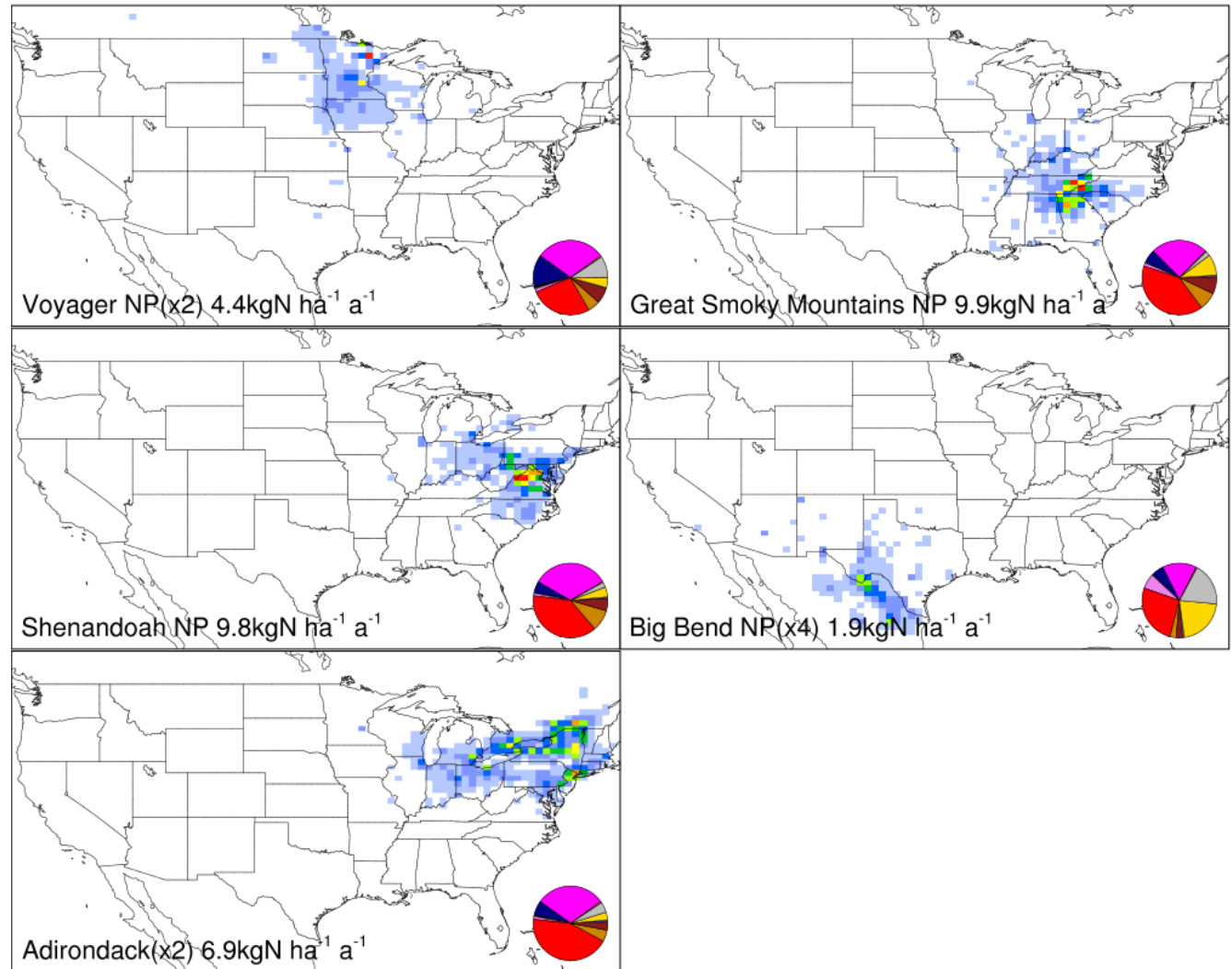
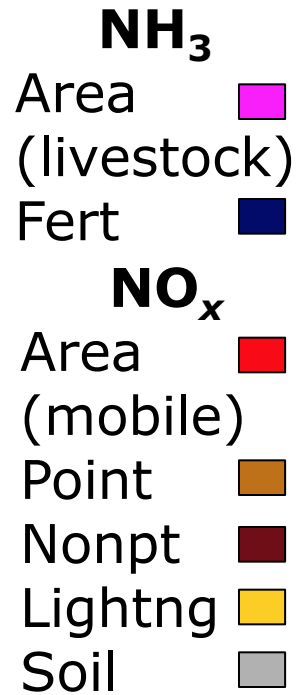
# Footprints of reactive Nitrogen deposition



Rocky Mountain NP:

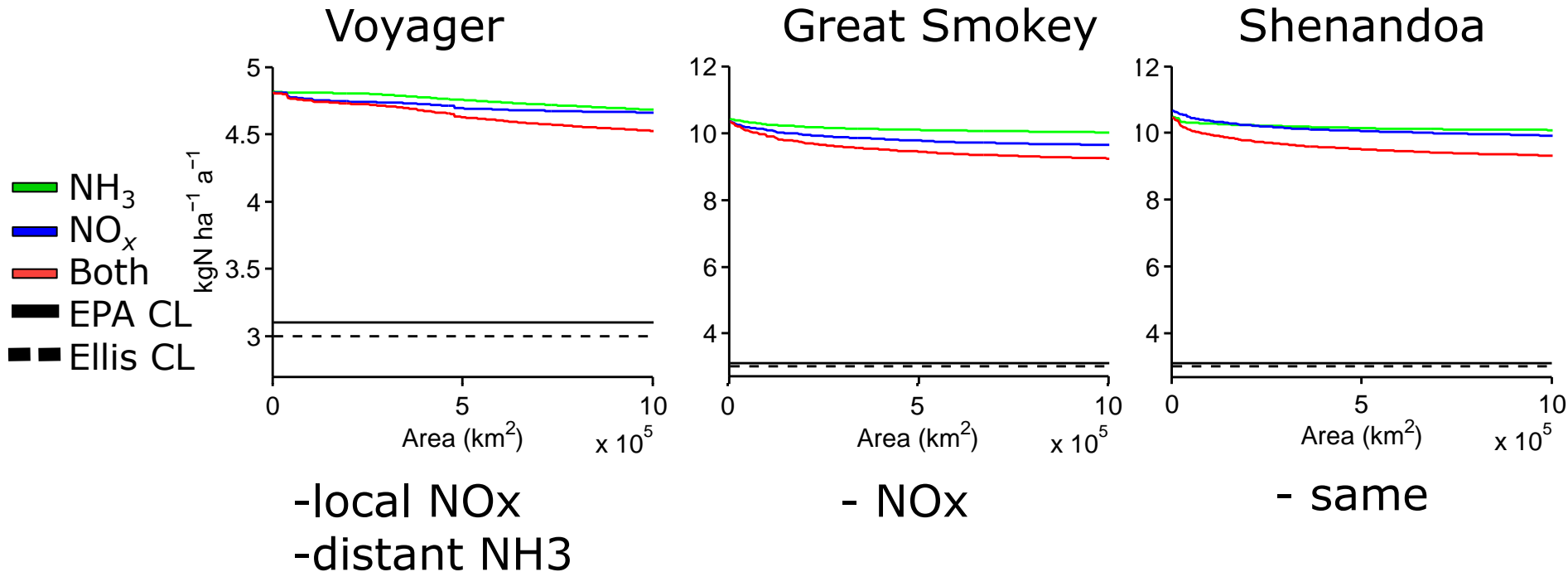
- CMAQ: 0.85 kgN/ha/a from livestock NH<sub>3</sub>, 1.55 kgN/ha / from mobile NO<sub>x</sub>
- Gebhart et al. (2011): 50% of NH<sub>3</sub> inputs from out-of-state
- Benedict et al. (2013):

# Footprints of reactive Nitrogen deposition



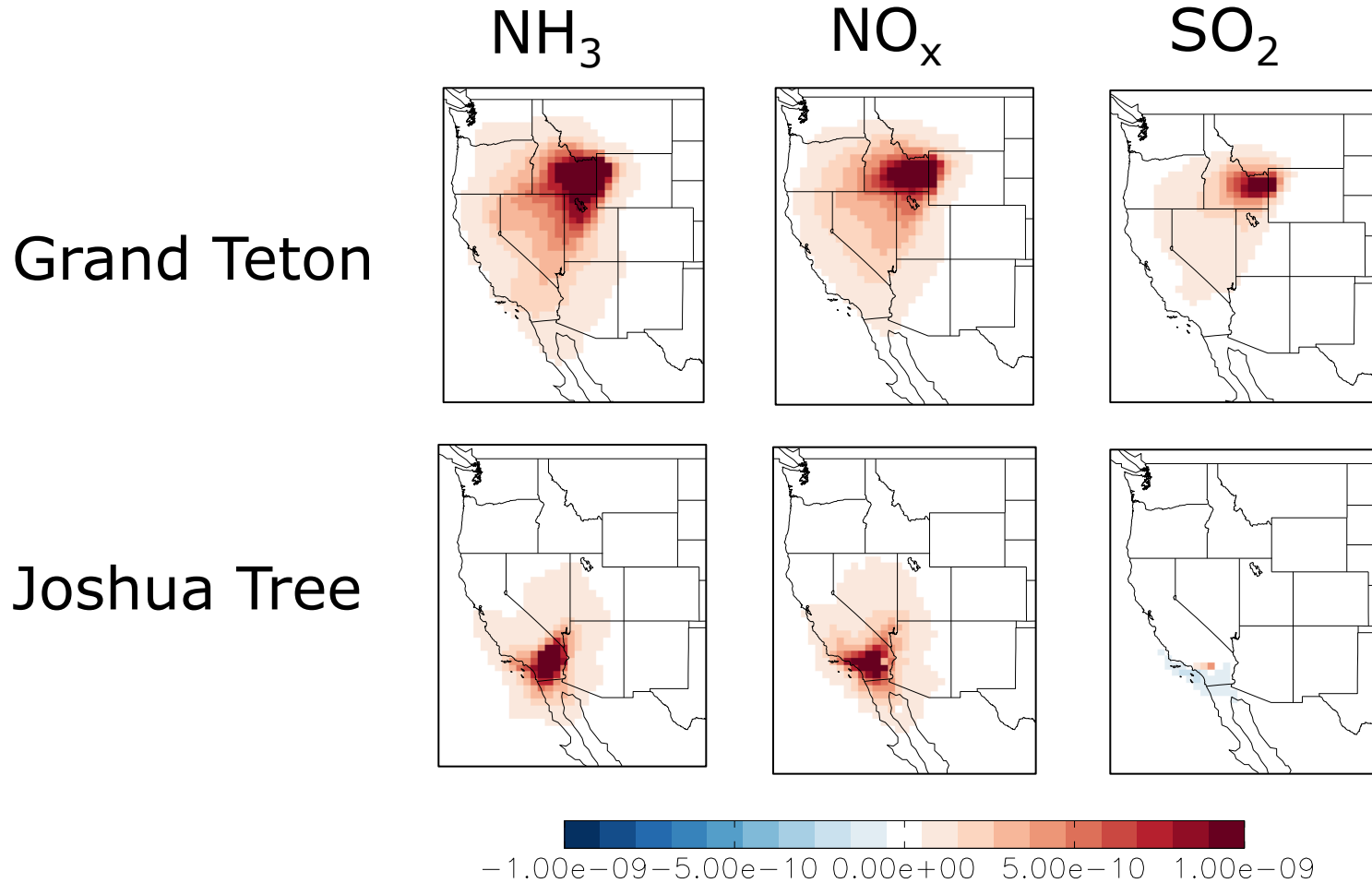
# Effectiveness of NH<sub>3</sub> vs NO<sub>x</sub> emission controls for approaching deposition Critical Loads

What is the impact of reducing anthropogenic emissions by 20% as a function of distance (area) away from the park?



All regions are far from attaining CL values with small reductions to emissions over a wide 10<sup>6</sup> km<sup>2</sup> area (size of France!)

# What is the nitrogen deposition efficiency?

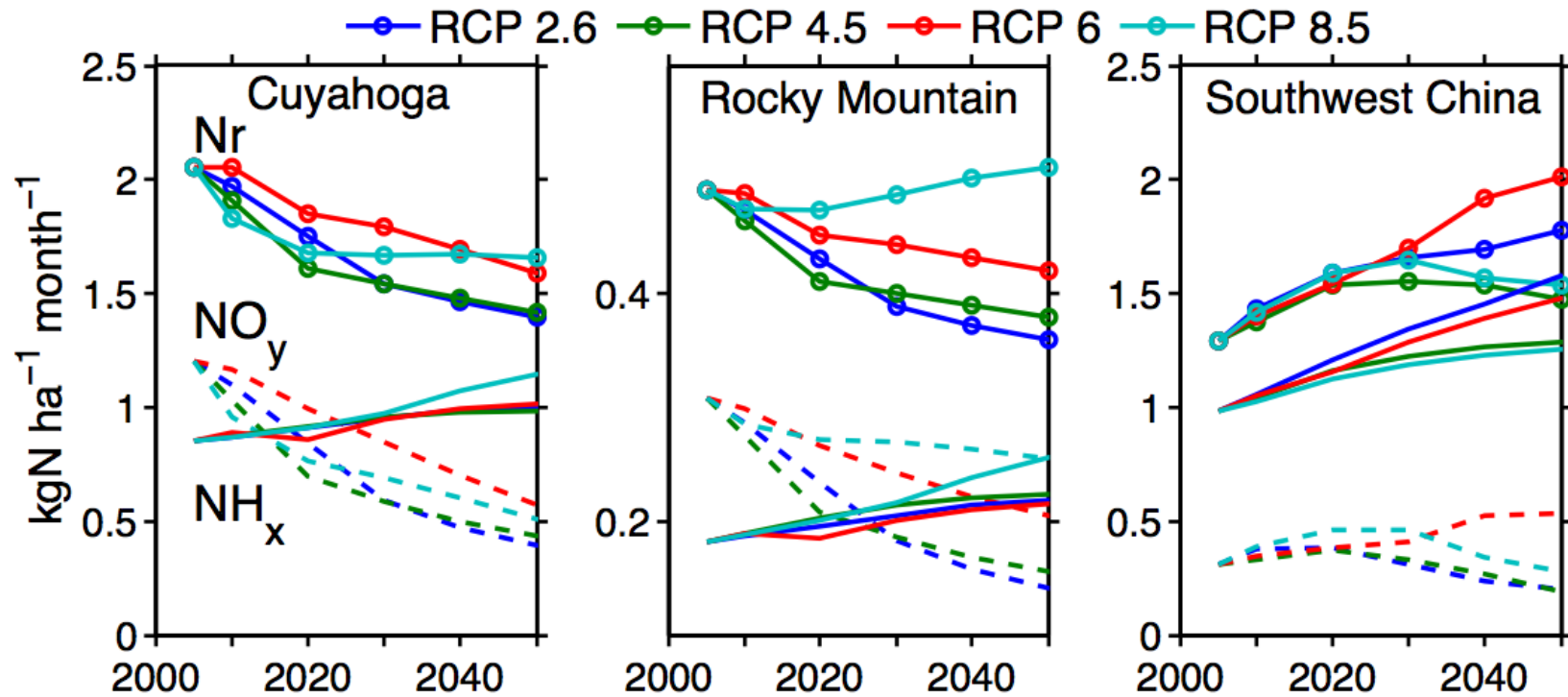


(kg N dep / ha / yr) / (mol emission / yr)

Implications for impacts of new sources

# Projections of Nr deposition

Projections of the evolving roles of  $\text{NH}_3$  and  $\text{NO}_x$  on Nr deposition following emission projections from IPCC AR5 (Moss et al., 2010)



Paulot et al., 2012; also Ellis et al. 2013

While Nr may be decreasing, role of  $\text{NH}_3$  increasing

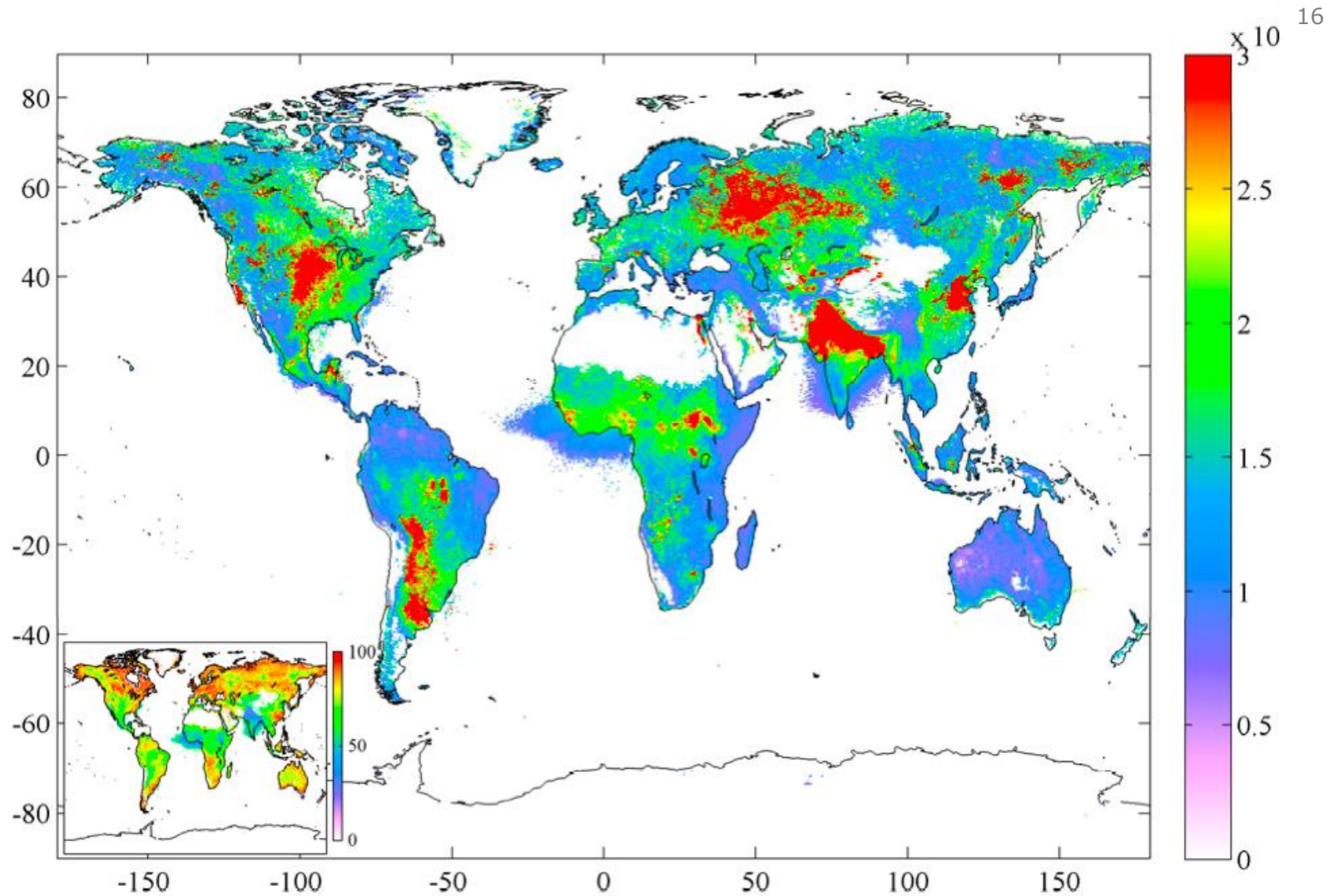
## Final comments

- Constraints from multiple sources (remote sensing, deposition, in situ measurements) helping reduce uncertainty in  $\text{NH}_3$  emissions.
- 4D-Var techniques allow inversion process to consider spatially heterogeneous biases in emissions inventories.
- It's an iterative procedure, and we're learning more about process-level emissions (diurnal variability, bi-directional fluxes).
- $\text{NH}_3$  and  $\text{NO}_x$  sources can contribute significantly to reactive nitrogen deposition several states away.
- Substantial controls required to approach critical loads, particularly given projected increases in  $\text{NH}_3$  emissions.

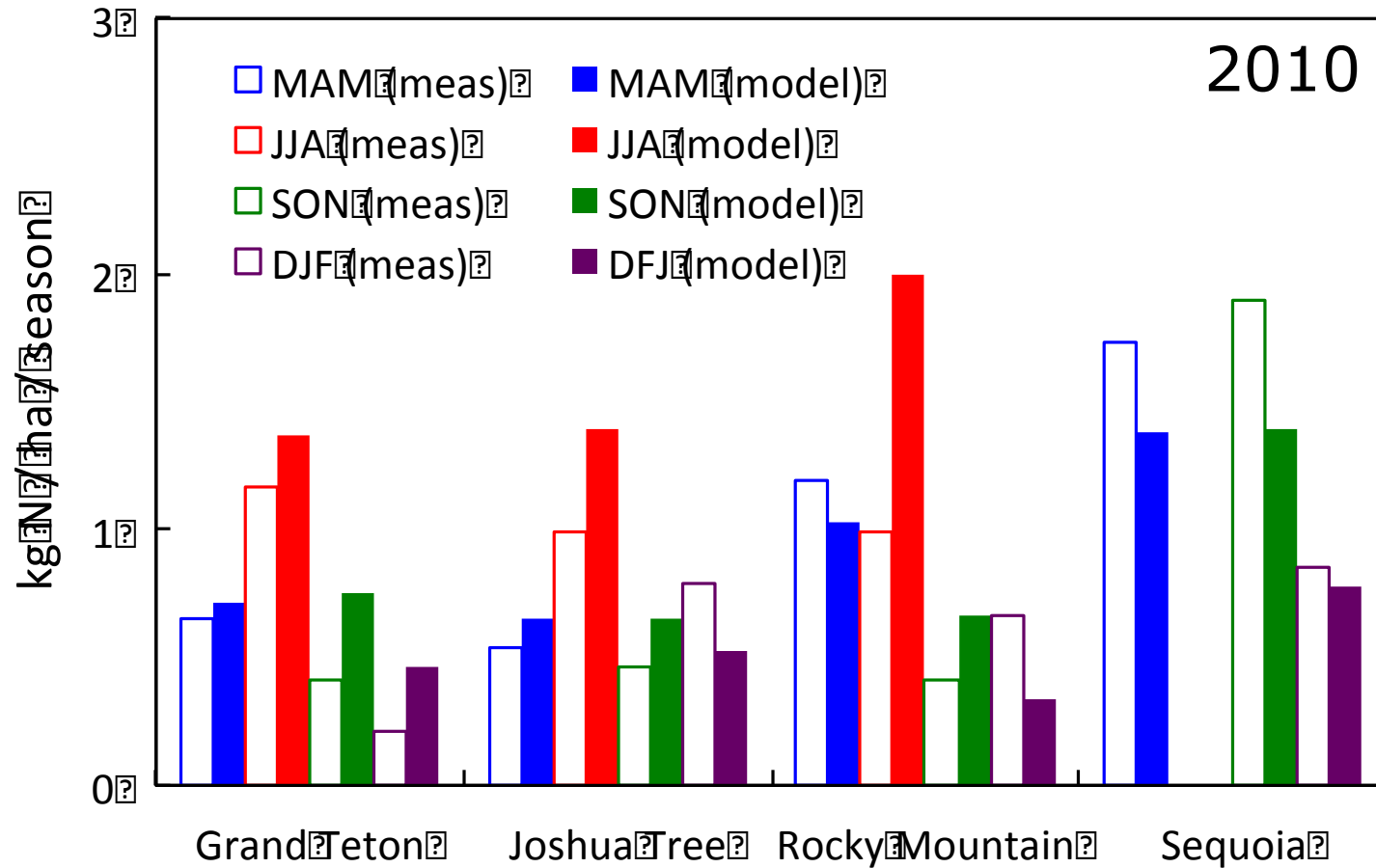
End



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



# Model evaluation: GEOS-Chem vs observed (NTN) N deposition



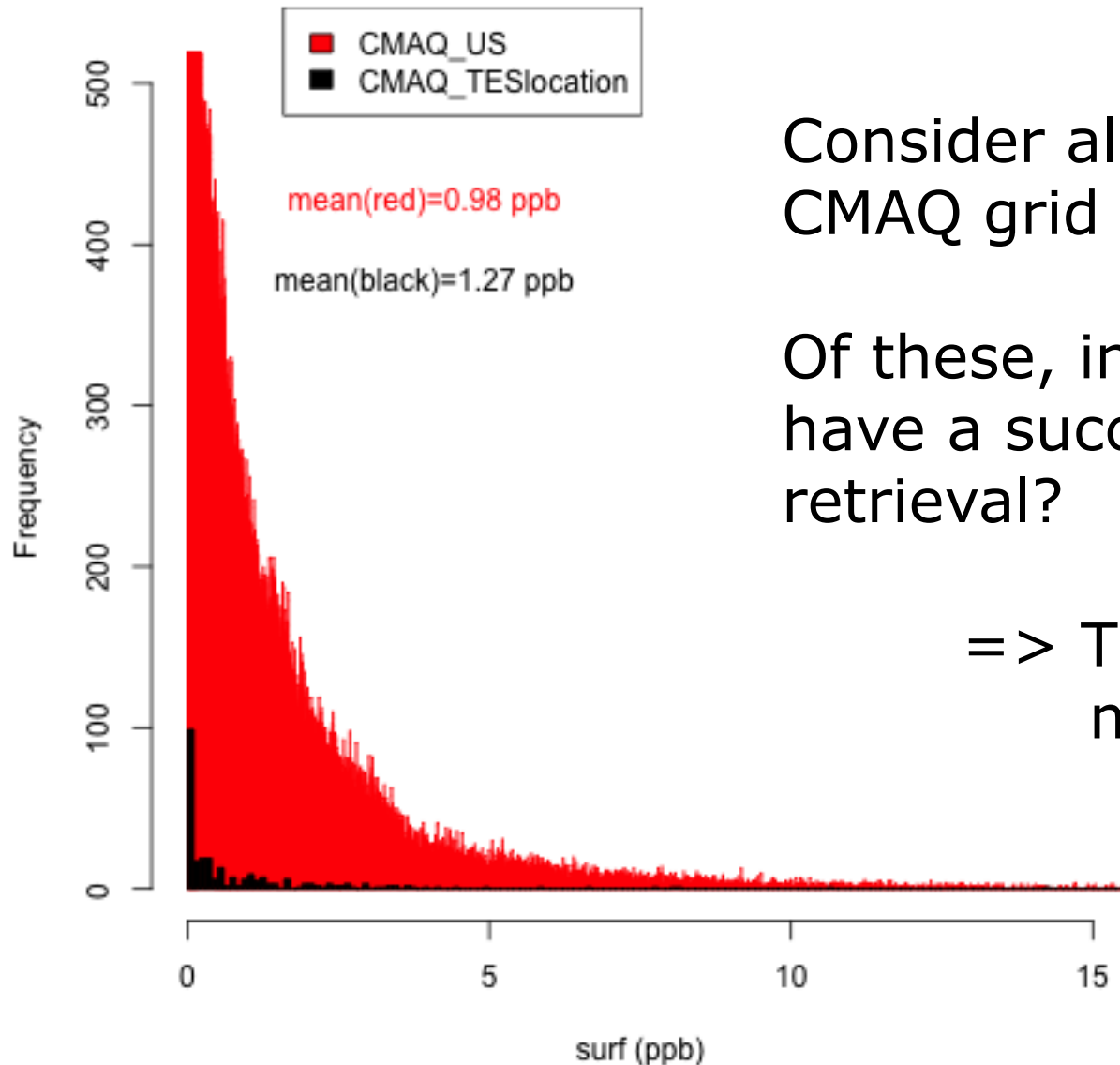
# TES NH<sub>3</sub> visualization



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

©2010 Google

# TES NH<sub>3</sub> constraints in GEOS-Chem: spatial sampling / retrieval bias



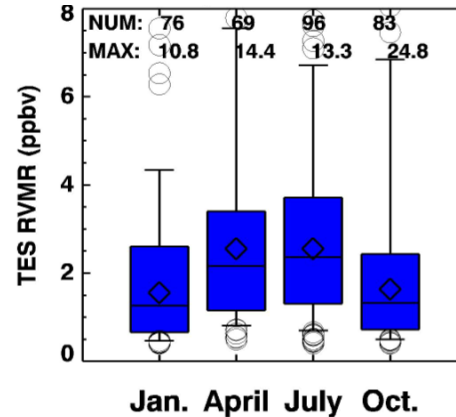
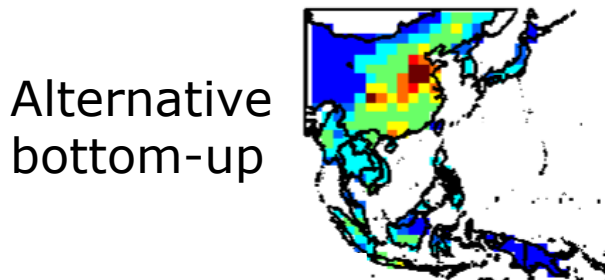
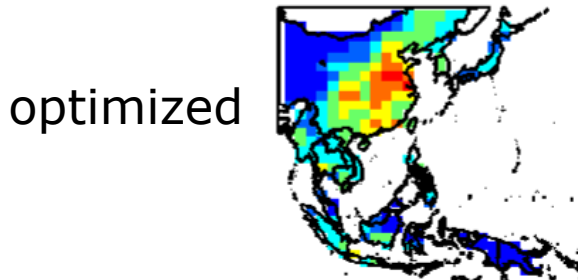
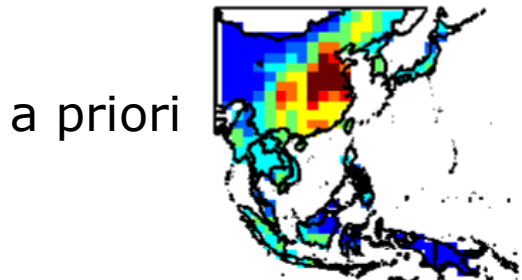
Consider all 12 x 12 km<sup>2</sup>  
CMAQ grid cells

Of these, in which did we  
have a successful TES  
retrieval?

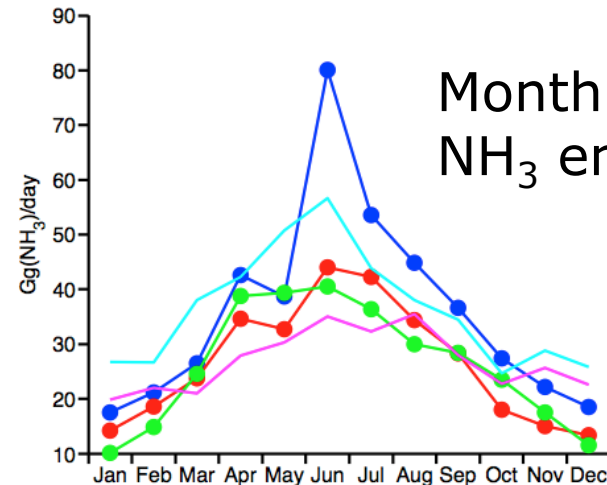
=> TES constraints  
may be ~30% high

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

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



Seasonality in SE China from TES  $\text{NH}_3$  observations (Shephard et al., 2011)



Monthly SE Asia  $\text{NH}_3$  emissions

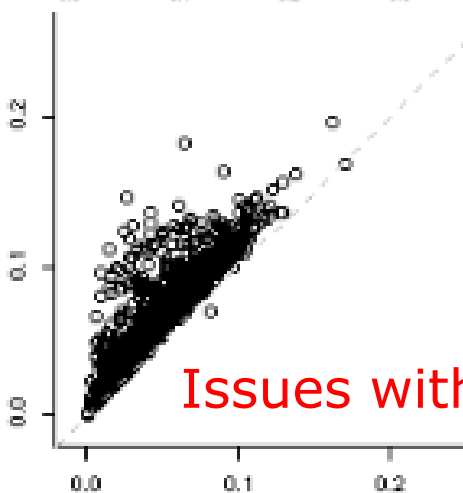
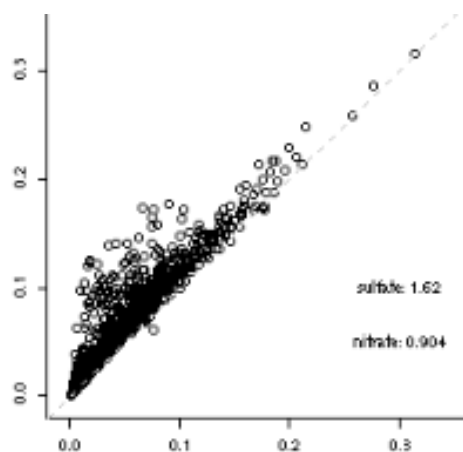
A priori  
Optimized  
Alternate  
Huang (2012)  
Streets (2003)

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

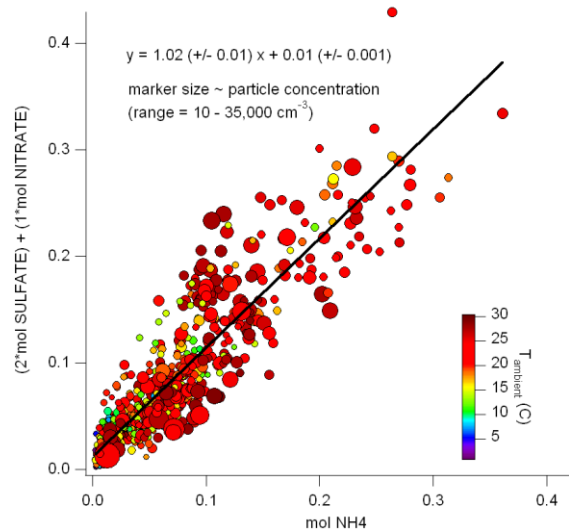
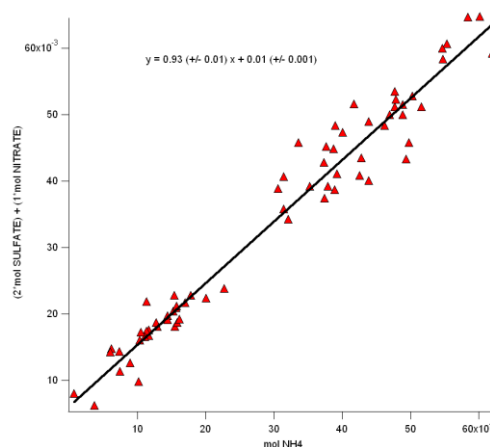
# Constraints from CASTNet $\text{NH}_4^+$ ?

$$n(\text{NH}_4^+) : 2n(\text{SO}_4^{2-}) + n(\text{NO}_3^-)$$

CASTNet, all sites,  
2005-2006 (R. Pinder)

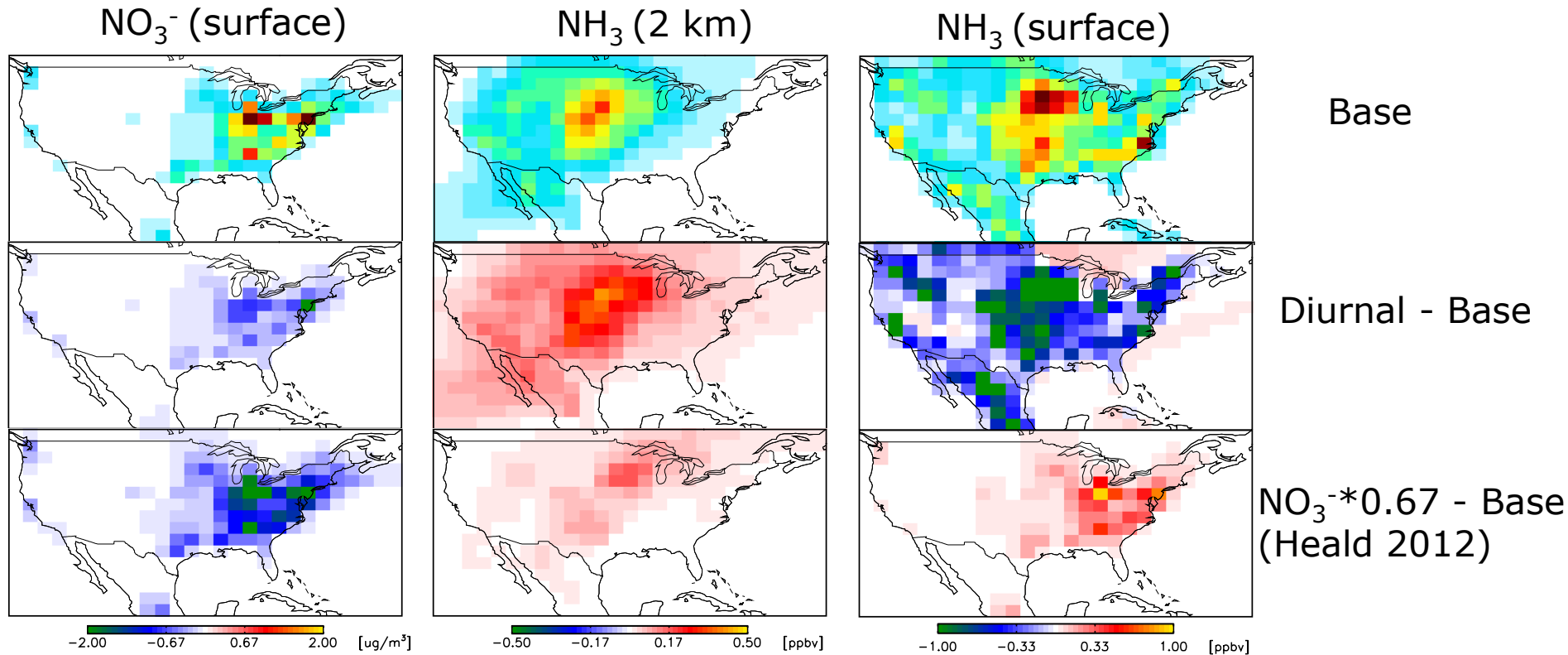


Field campaigns  
(Sorooshian et al.)





# Conundrum of nitrate (too high) and ammonia (too high at surface, too low higher up) in July in GEOS-Chem



Mechanistic  $\text{NH}_3$  emissions an important future direction for global models.

Other factors:

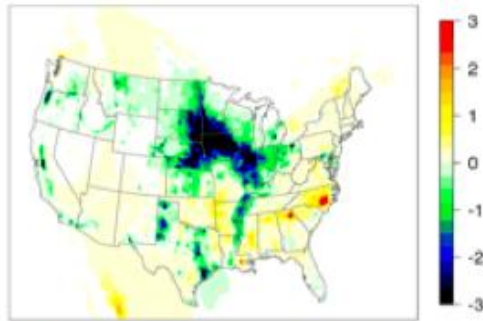
- BL heights (Dalhousie, following Lin and McElroy, 2010)
- excessive  $\text{N}_2\text{O}_5$  (Zhang et al., 2012; Paulot et al., submitted)



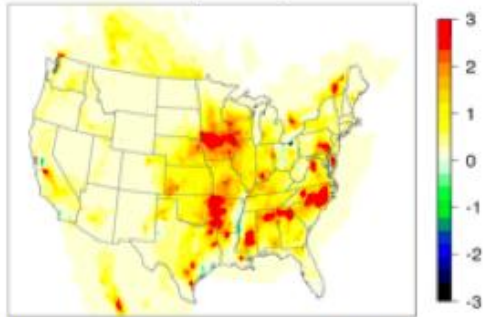
# Impacts of bidirectional exchange in GEOS-Chem

NH<sub>3</sub>: CMAQ<sub>bidi</sub> - CMAQ<sub>base</sub>

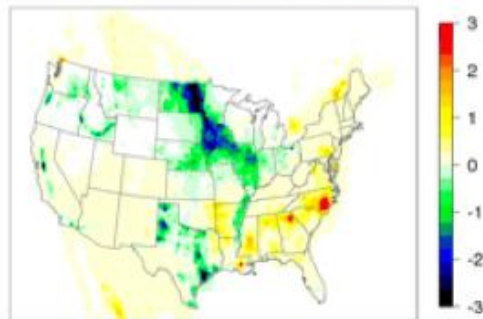
April



July



October



Decreased deposition in July  
leads to enhanced NH<sub>3</sub>  
lifetime throughout the US.