

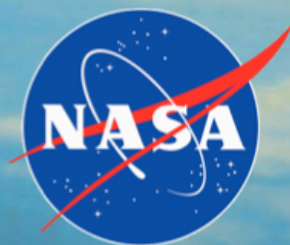
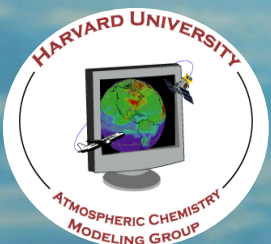


# Estimating US methane emissions using GOSAT observations

Alexander J. Turner<sup>1,\*</sup>

<sup>1</sup> *Jacob Group, Harvard University, Cambridge, MA, USA.*

\* *aturner@fas.harvard.edu*

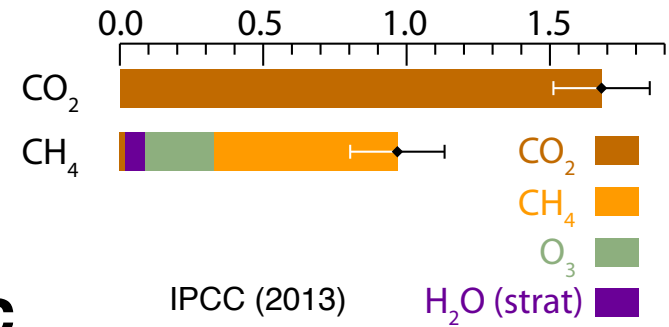


# Why do we care about atmospheric methane?

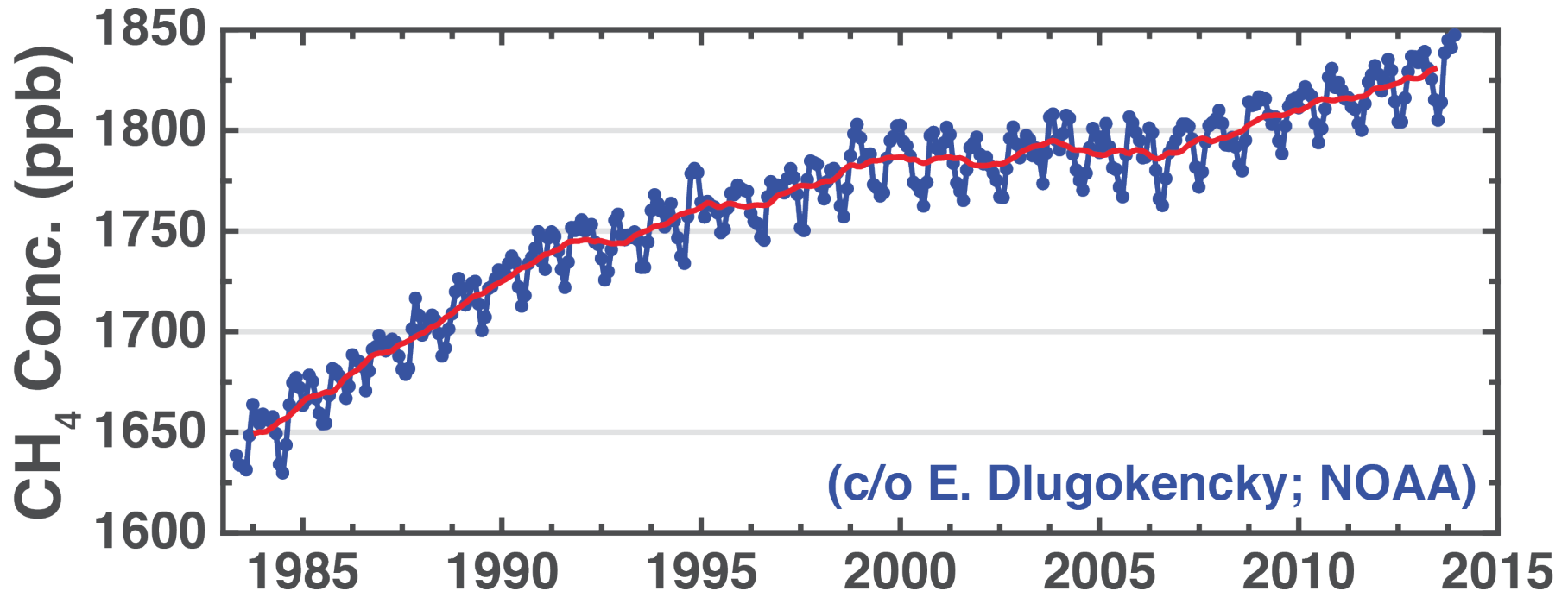
## 1) Methane is a potent greenhouse gas

▶ 2<sup>nd</sup> only to CO<sub>2</sub>

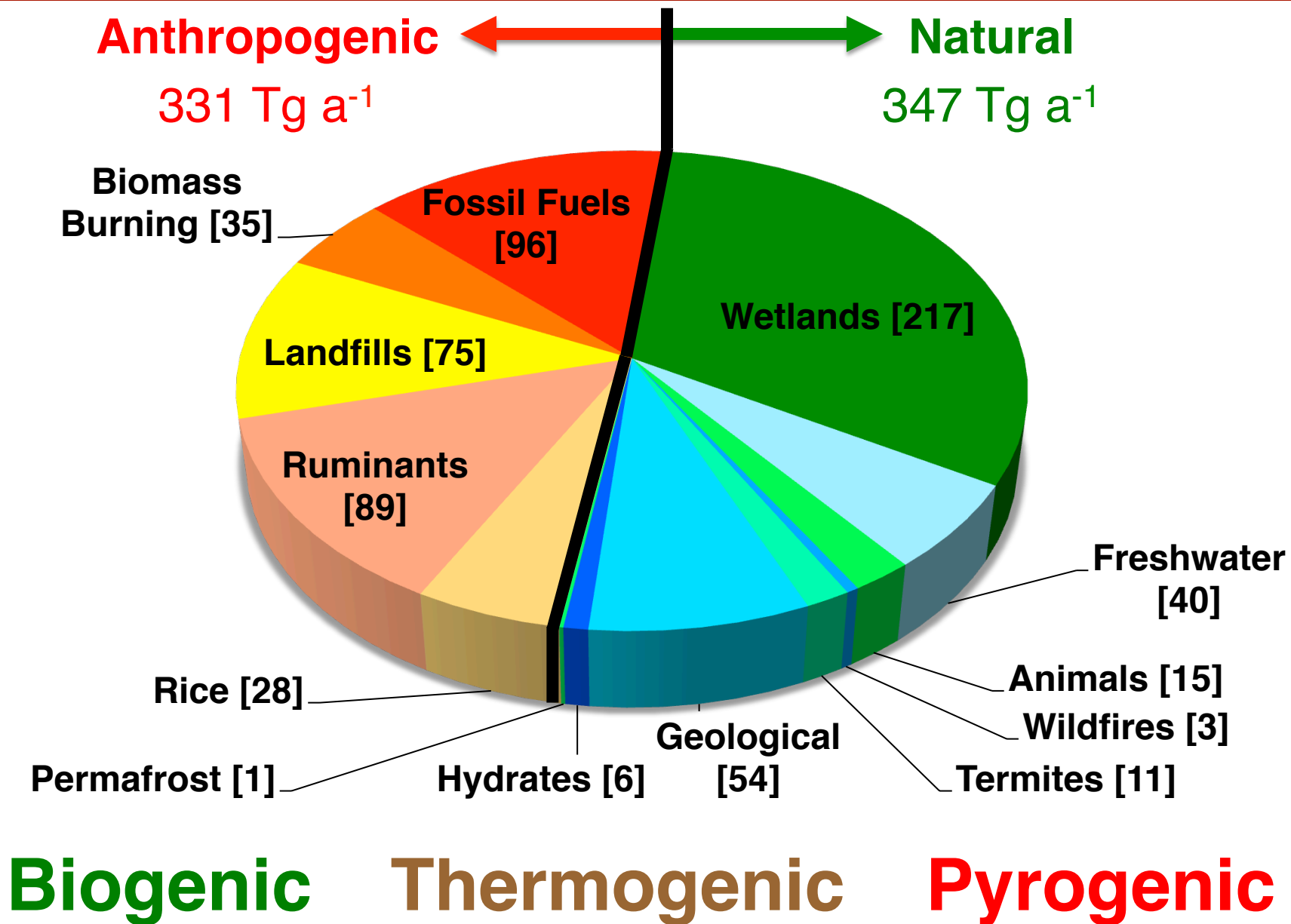
Emissions based radiative forcing [W m<sup>-2</sup>]



## 2) Recent trends in atmospheric methane are not well understood

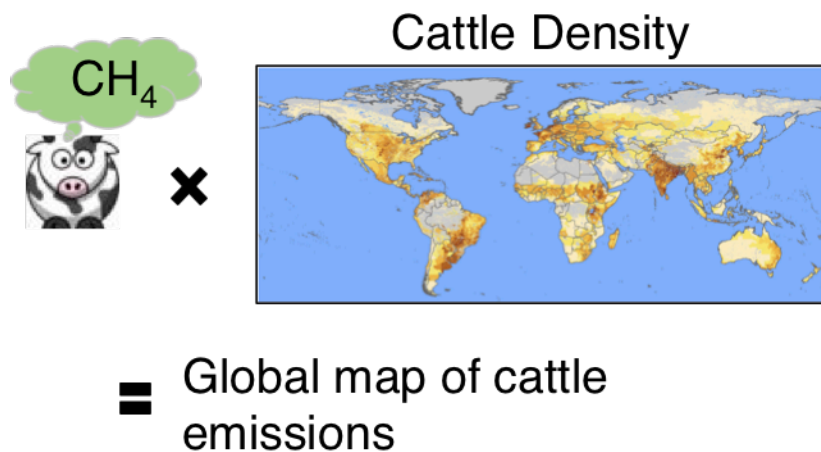


# Global methane emission sources

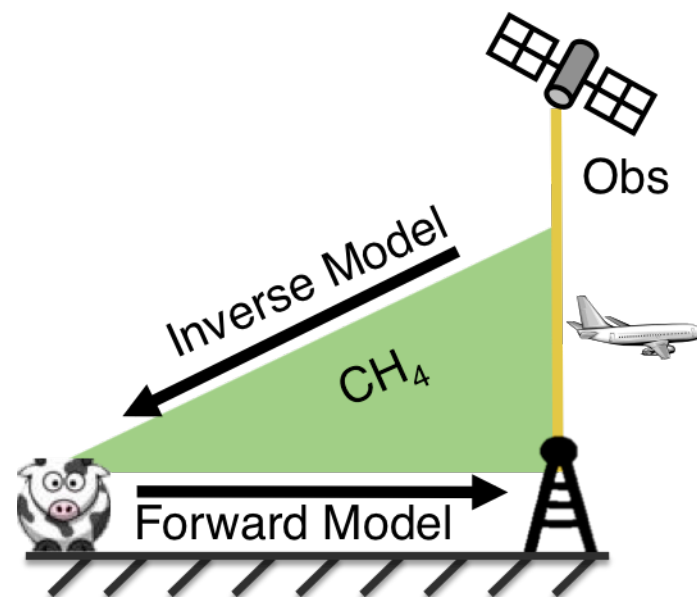


# Methods of estimating methane emissions

## Bottom-up



## Top-down



**Satellites provide dense spatial coverage but have large uncertainties**

# Retrievals of methane from observed radiances

## Satellites Observing Methane

Thermal IR

AIRS, TES, IASI, CrIS

Shortwave IR

SCIAMACHY

GOSAT

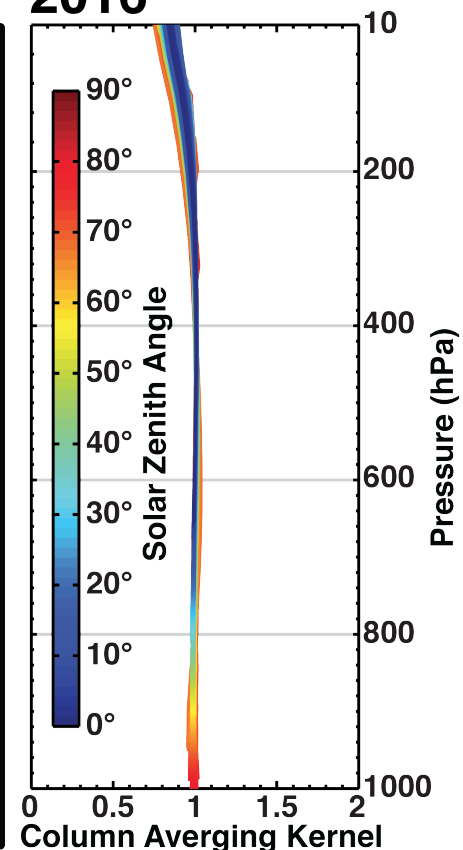
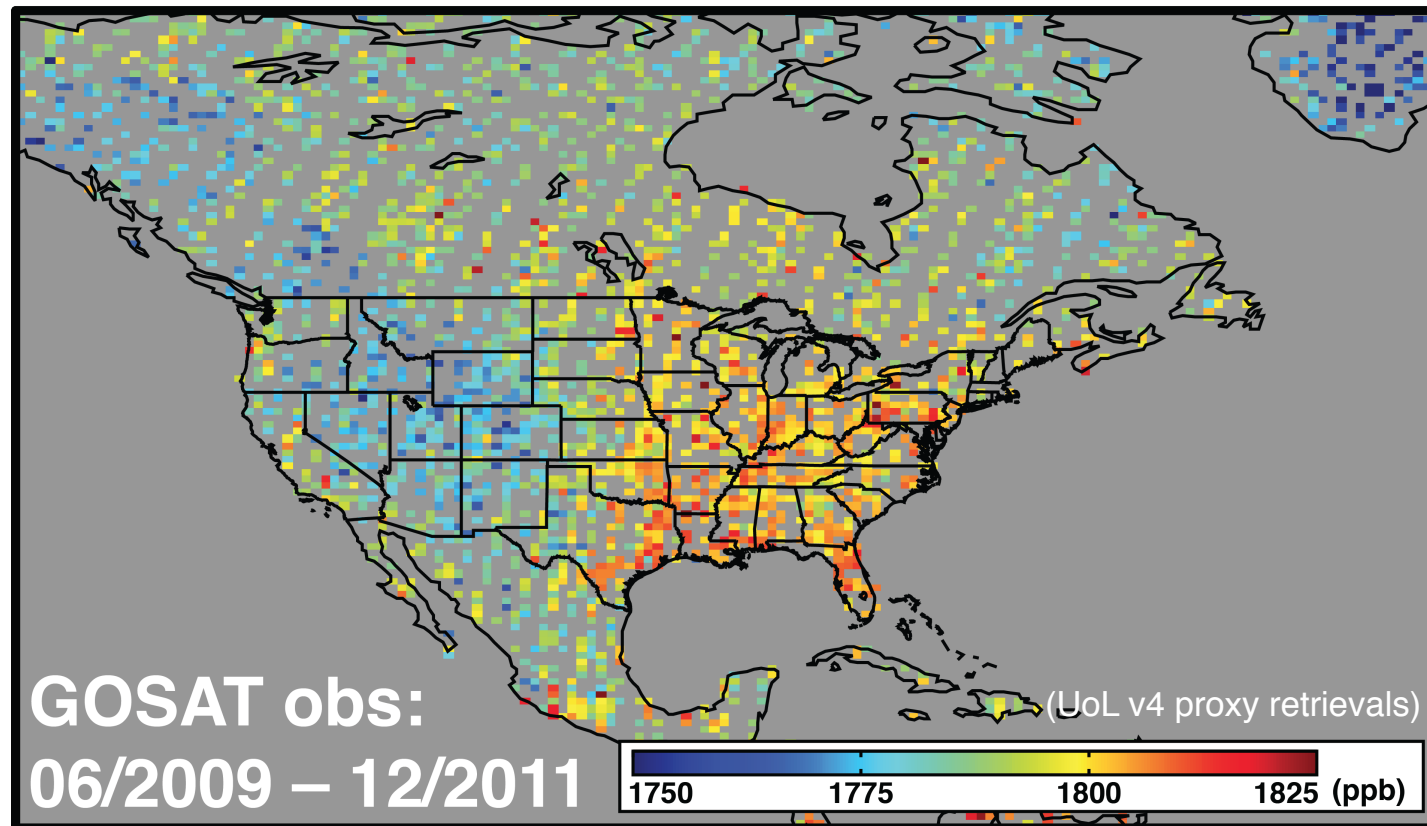
TROPOMI

2002

2006

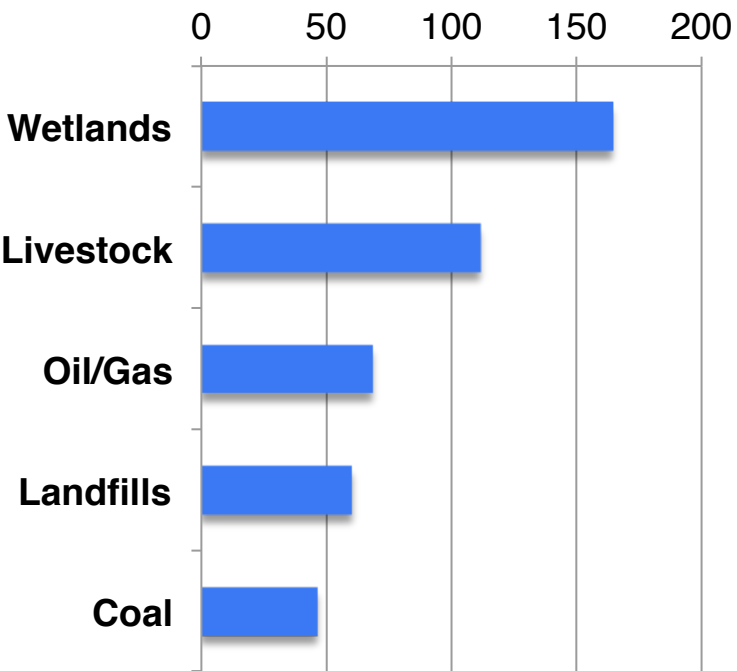
2009

2016

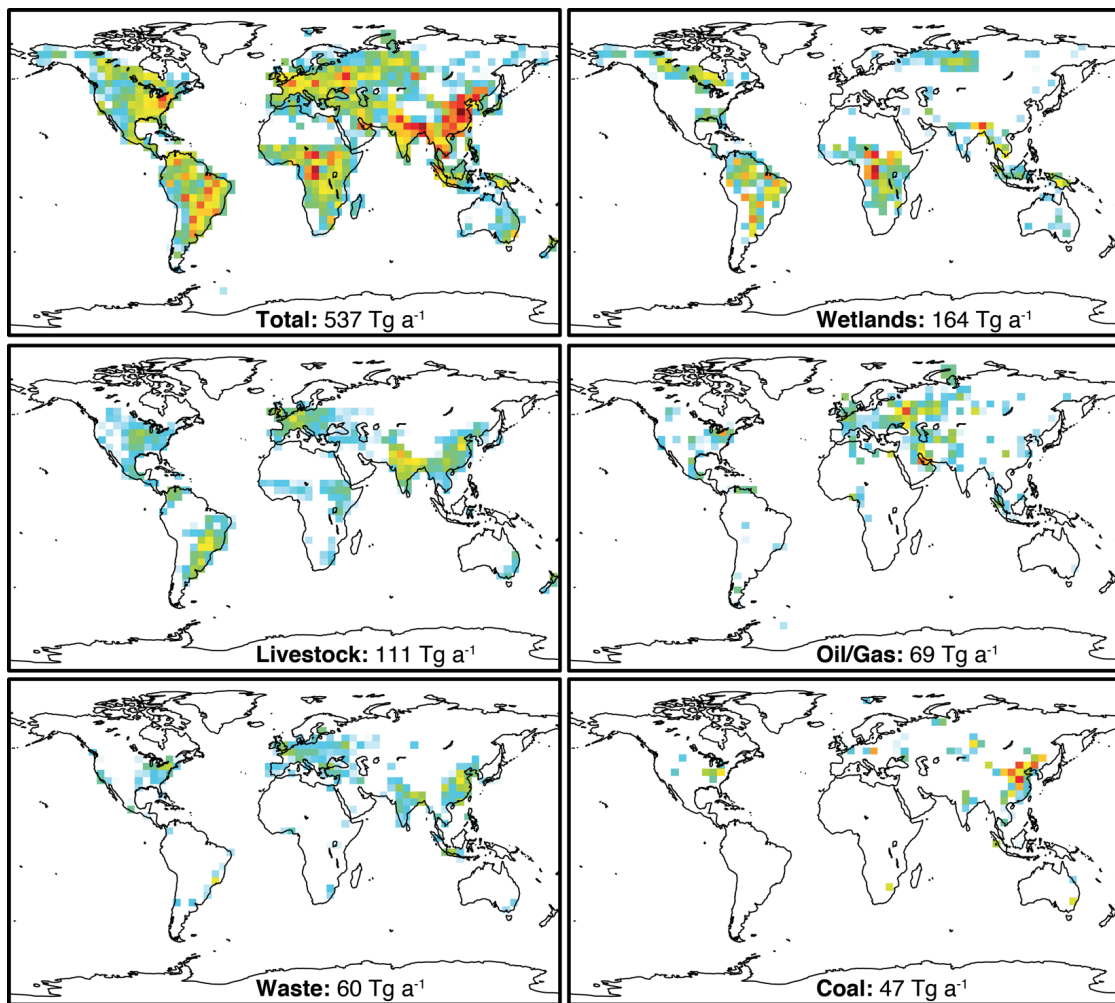


# Prior emissions from EDGARv4.2 + LPJ + GFED3

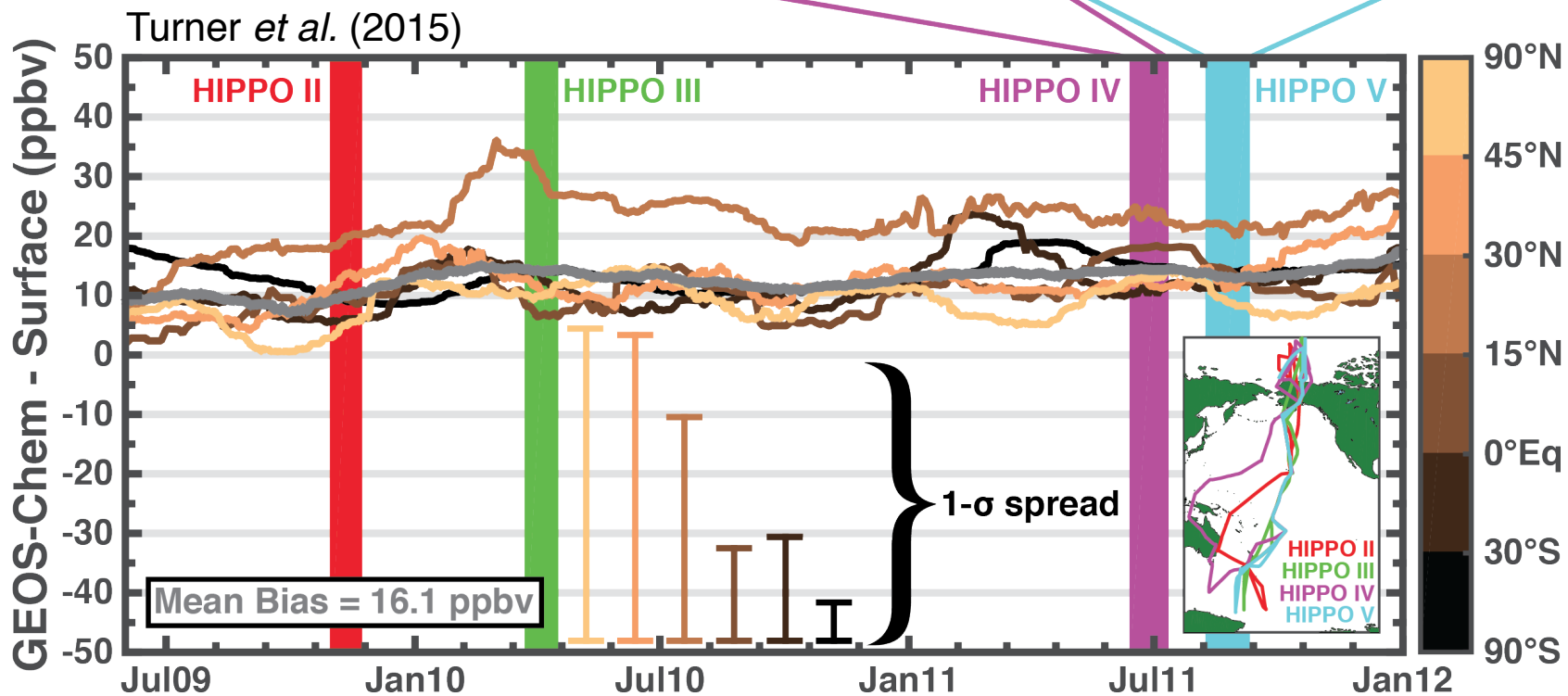
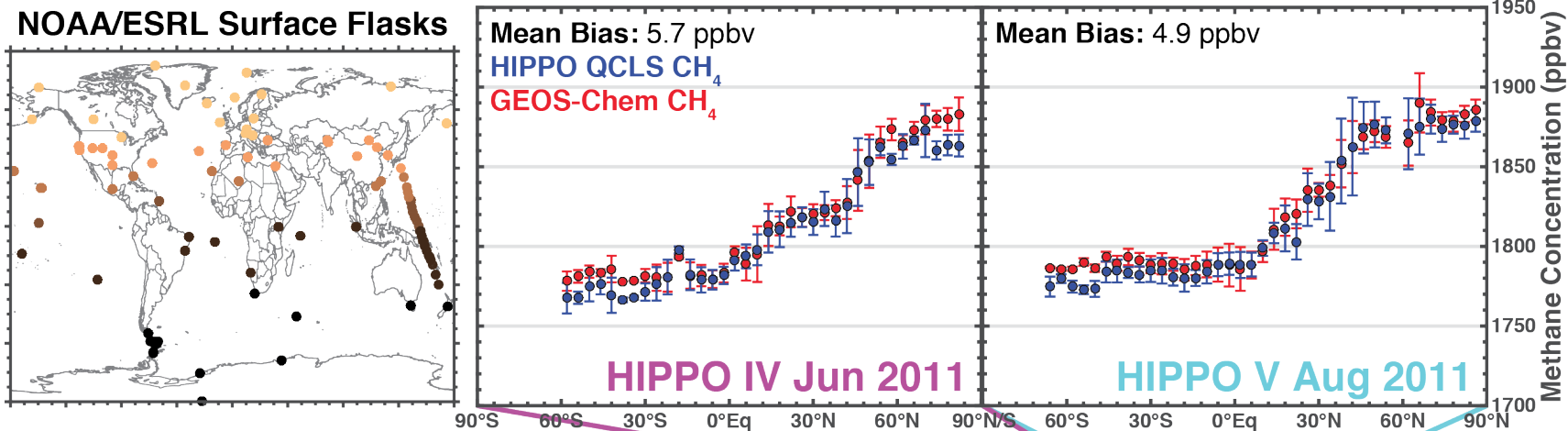
## Major Sources (Tg yr<sup>-1</sup>)



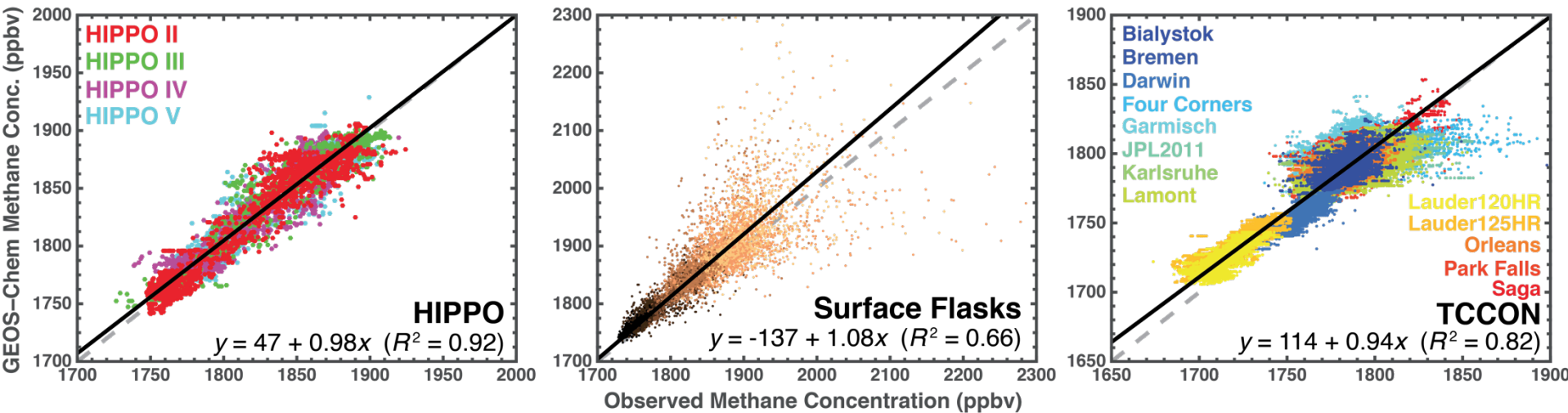
**Total: 537 Tg yr<sup>-1</sup>**



# Model compares well with observations



# Model compares well with observations

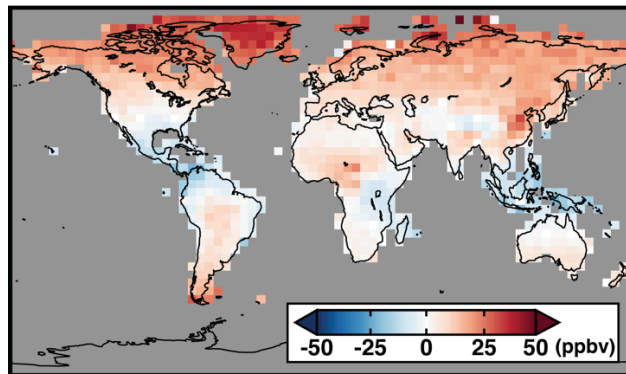


- ▶ **Latitudinal gradient and seasonal cycle are represented**
  - ▶ Compared to HIPPO, NOAA/ESRL, and TCCON
- ▶ **Captures surface, free trop, and total column background**

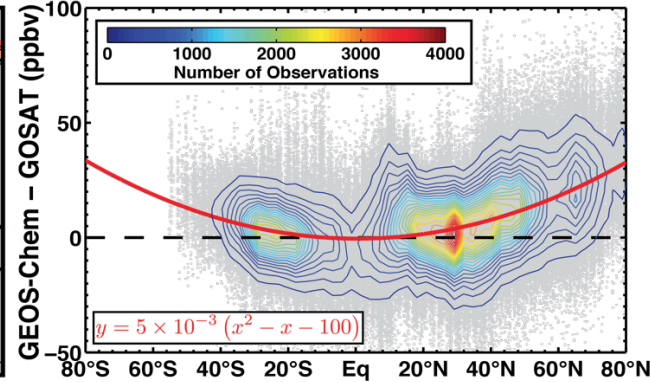


# Identifying a GOSAT/GEOS-Chem bias

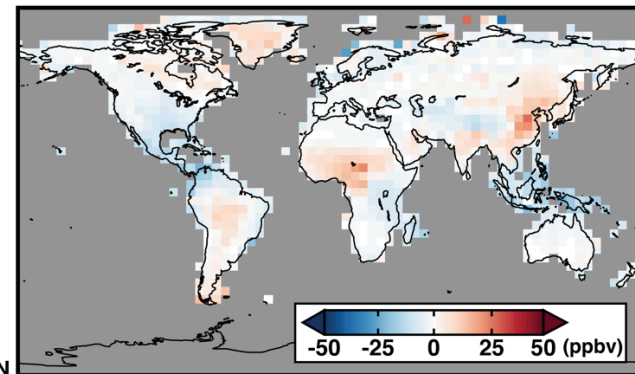
Mean GEOS-Chem – GOSAT difference



Mean difference vs. latitude



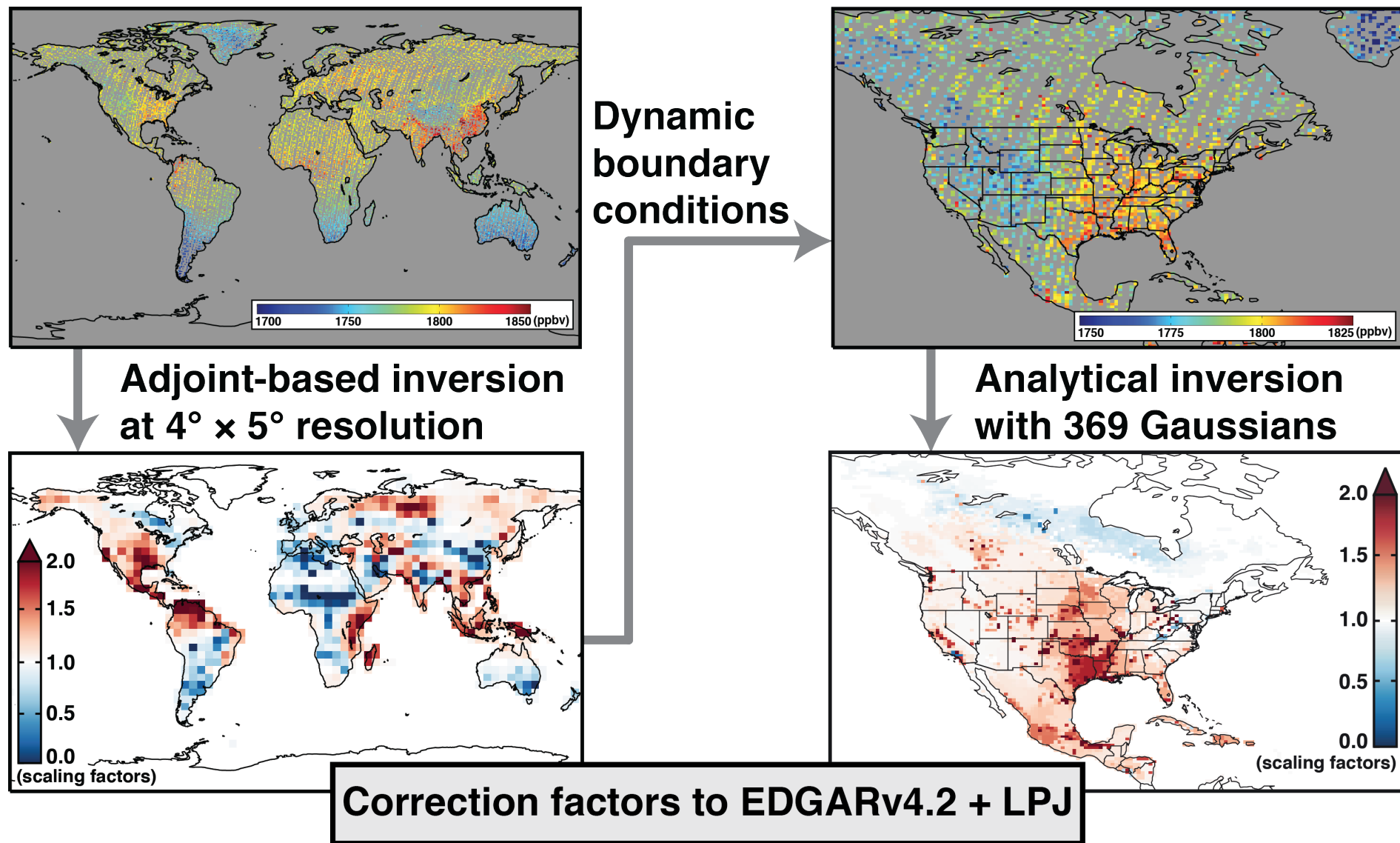
Mean difference after bias removal



- ▶ **Model/satellite comparison identifies a high-latitude bias**
  - ▶ Latitudinal bias not seen in surface, aircraft, or column comparison
- ▶ **Remove bias before estimating methane emissions**
  - ▶ Bias is either due to the model stratosphere or GOSAT retrievals

**Observations are ready for inversion!**

# General inversion framework: 2009–2011 GOSAT data



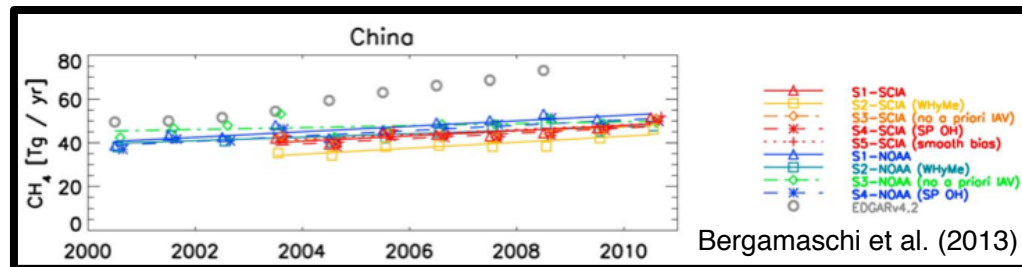
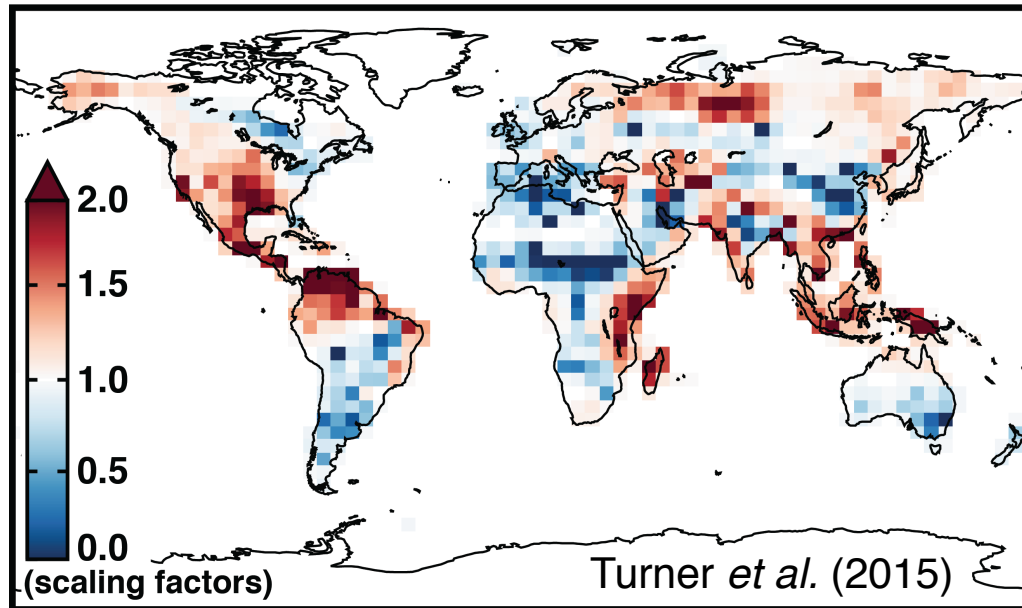
**Global inversion provides dynamic BCs for North America**

# Global inversion results

## ► Overestimate of Chinese methane emissions

- Consistent with previous work (e.g., Bergamaschi et al. 2013, Bruhwiler et al. 2014, Schwietzke et al. 2014)

Emission Scaling Factors (Posterior / Prior):  $+2 \text{ Tg a}^{-1}$

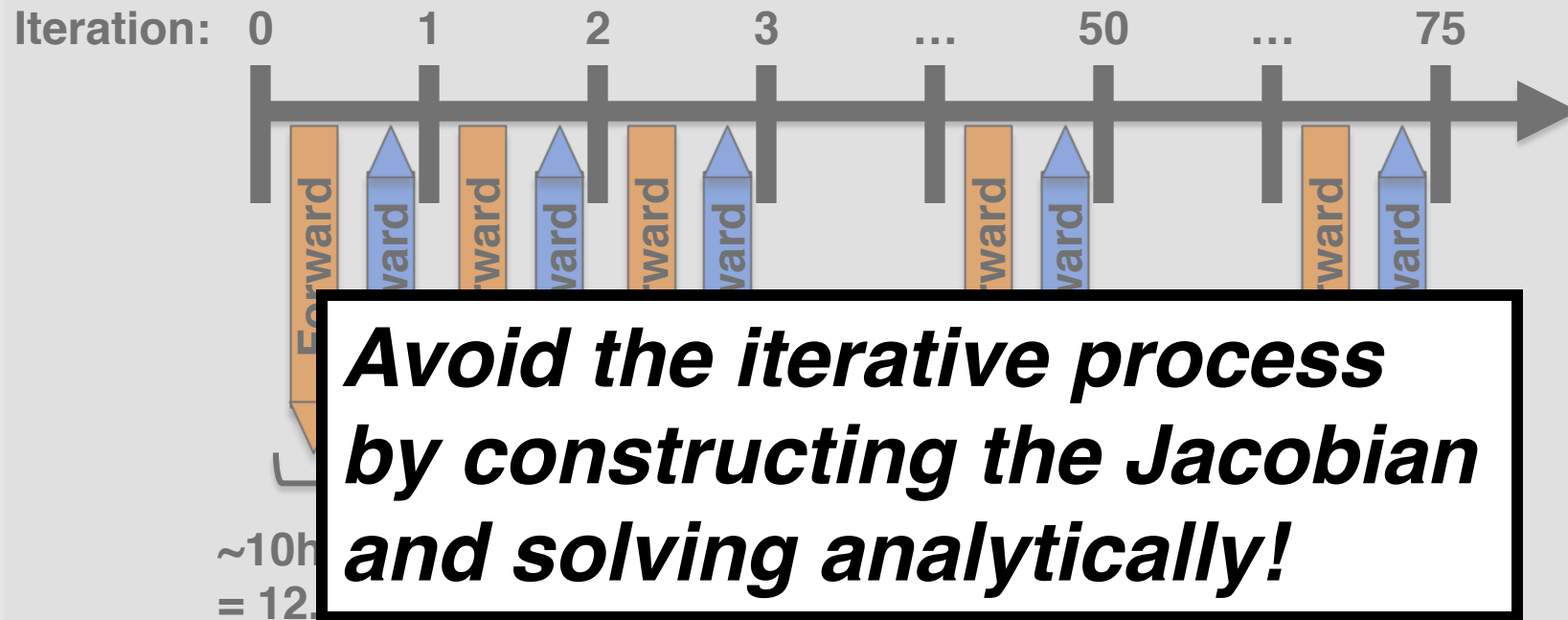


## ► Underestimate in South-Central US emissions

- Will further investigate using Nested North American simulation

# Estimating methane emissions at high resolution

Adjoint is not ideal for long time horizons at hi-res

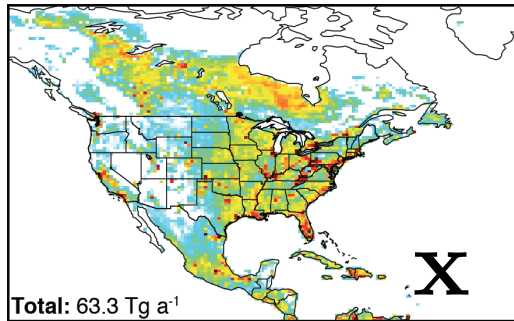


Simulation Waltime: 2.6 years

# Estimating methane emissions at high resolution

**Spatial error correlations are important at fine spatial scales!**

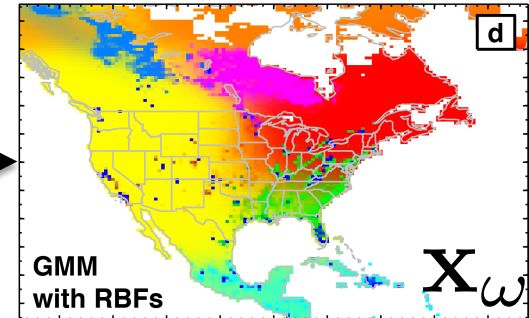
Native resolution  $\frac{1}{2}^\circ \times \frac{2}{3}^\circ$   
state vector  $\mathbf{x}$  ( $n = 7366$ )



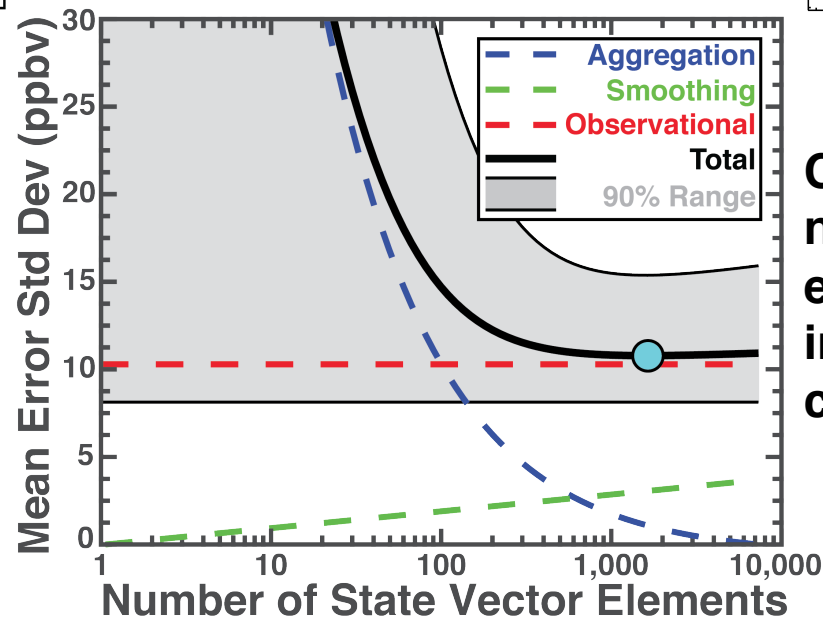
Aggregation Matrix:  $\Gamma_\omega$

$$\mathbf{x}_\omega = \Gamma_\omega \mathbf{x}$$

Reduced-resolution state  
vector  $\mathbf{x}_\omega$  (here  $n = 8$ )



Posterior error  
depends on choice  
of state vector  
dimension

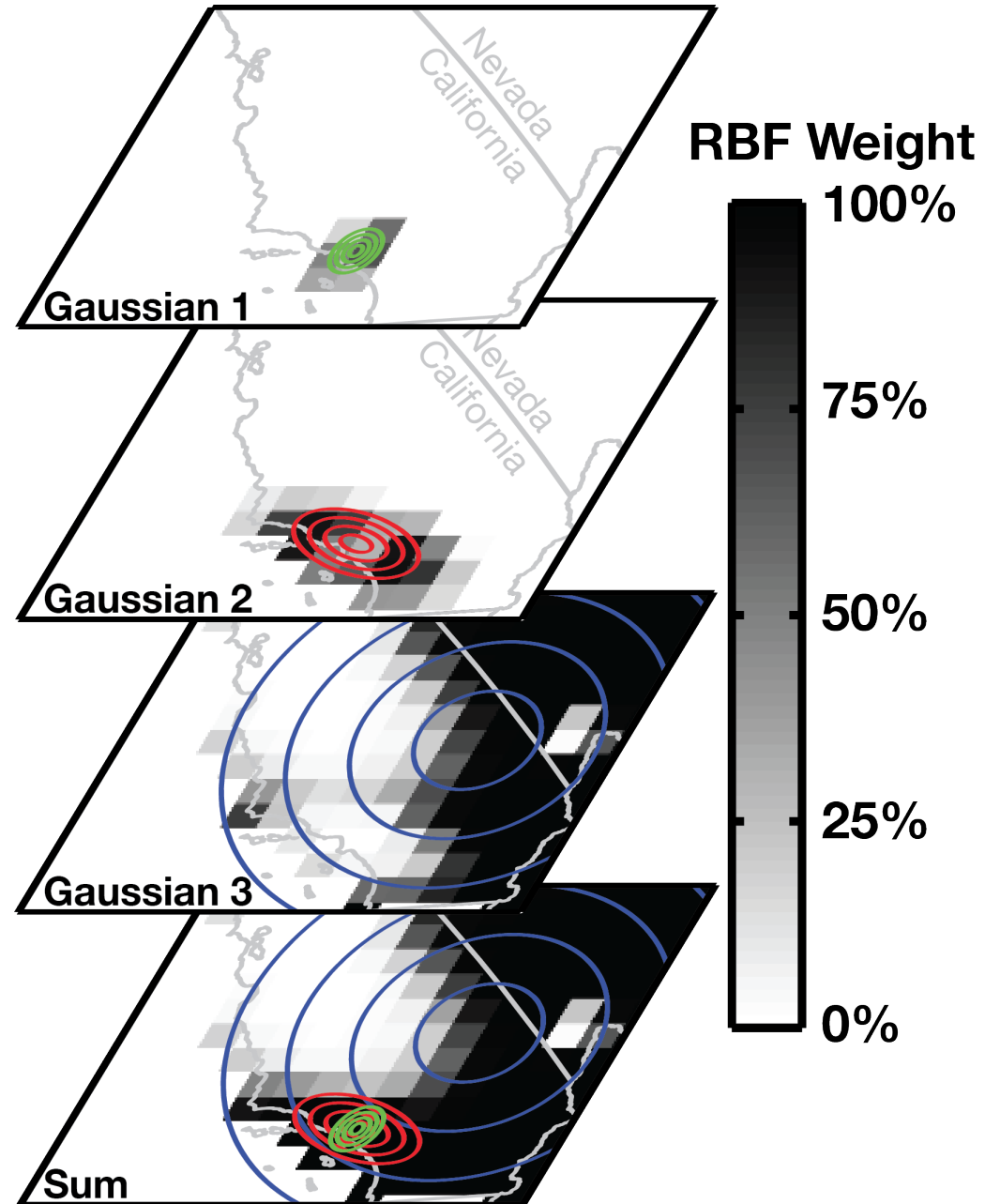


Choose  $n = 369$  for  
negligible aggregation  
error; allows analytical  
inversion with full error  
characterization

**Optimal size must balance aggregation and smoothing error**

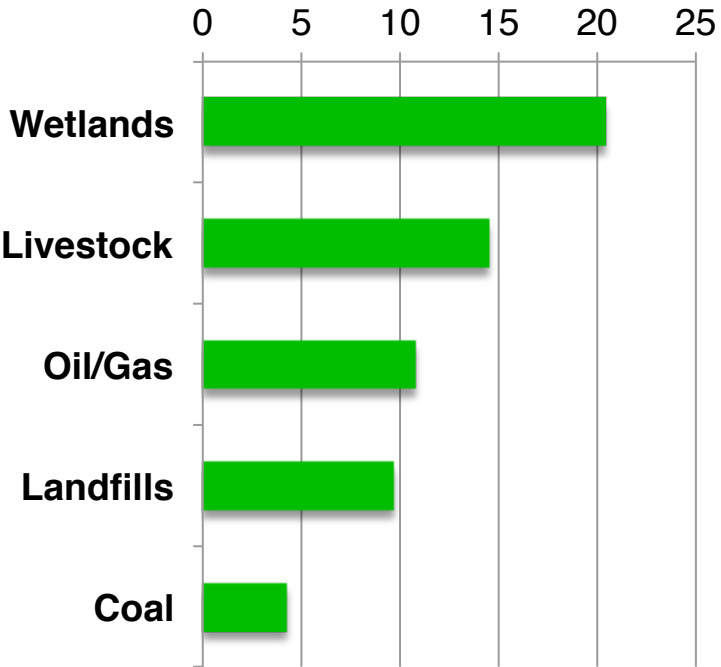
# Radial Basis Functions retain high resolution

- ▶ **Decompose the state vector into Gaussians**
  - ▶ Group based on correlated prior emission patterns
- ▶ **Retain high resolution**
  - ▶ Coarsen weak or uniform signals



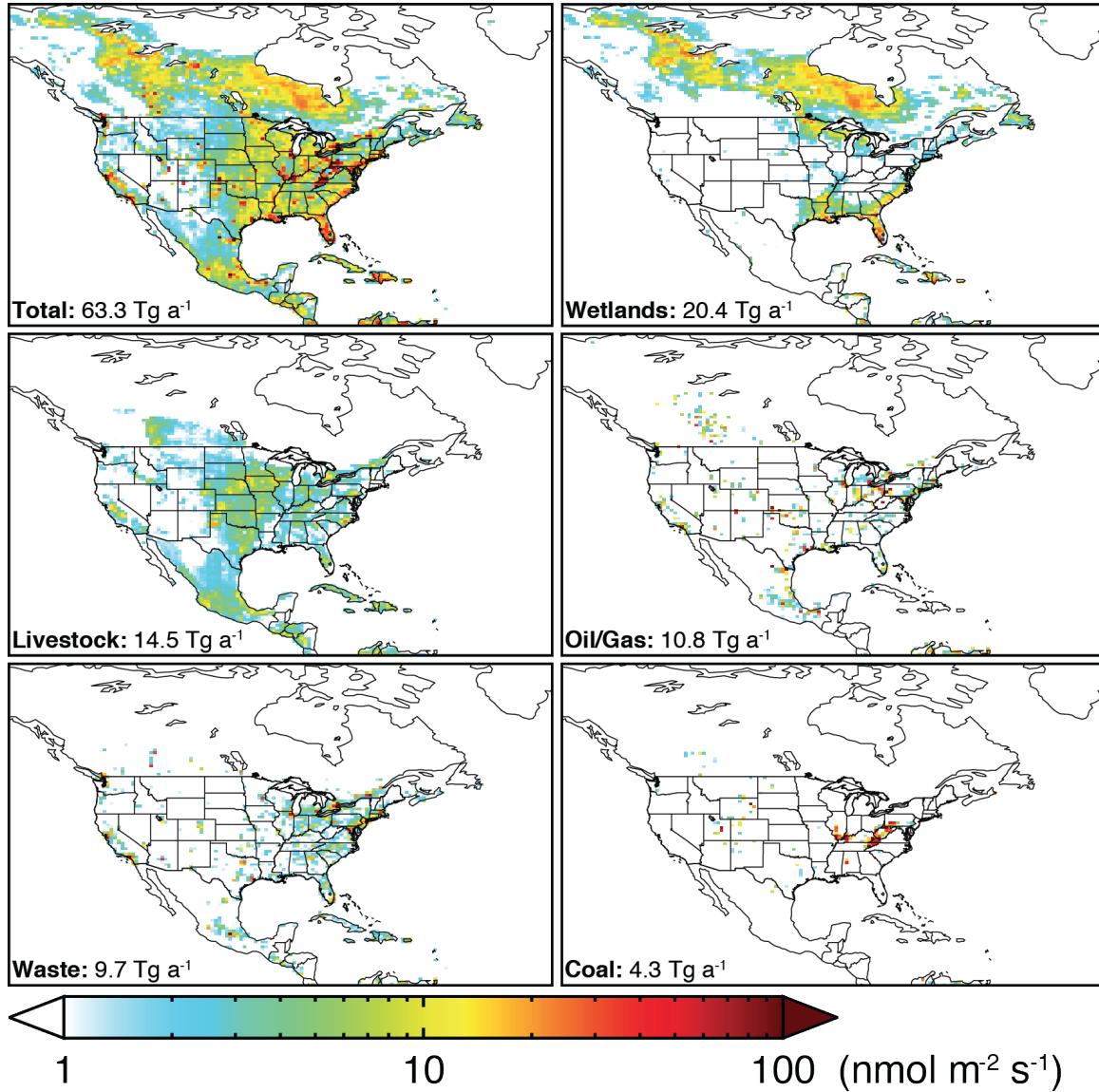
# Prior methane emissions from EDGARv4.2 + LPJ

## Major Sources (Tg a<sup>-1</sup>)



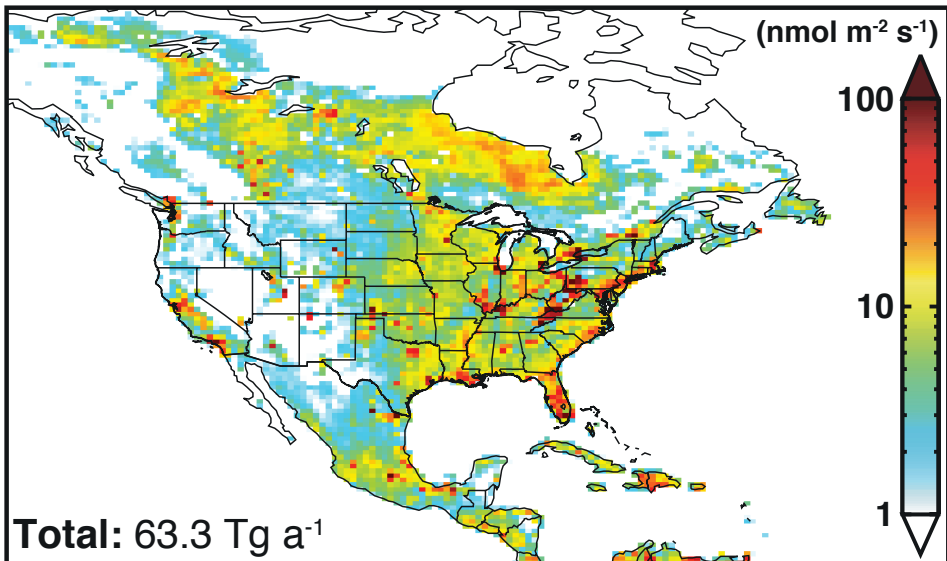
**Total: 63/537 Tg a<sup>-1</sup>**

North America Global

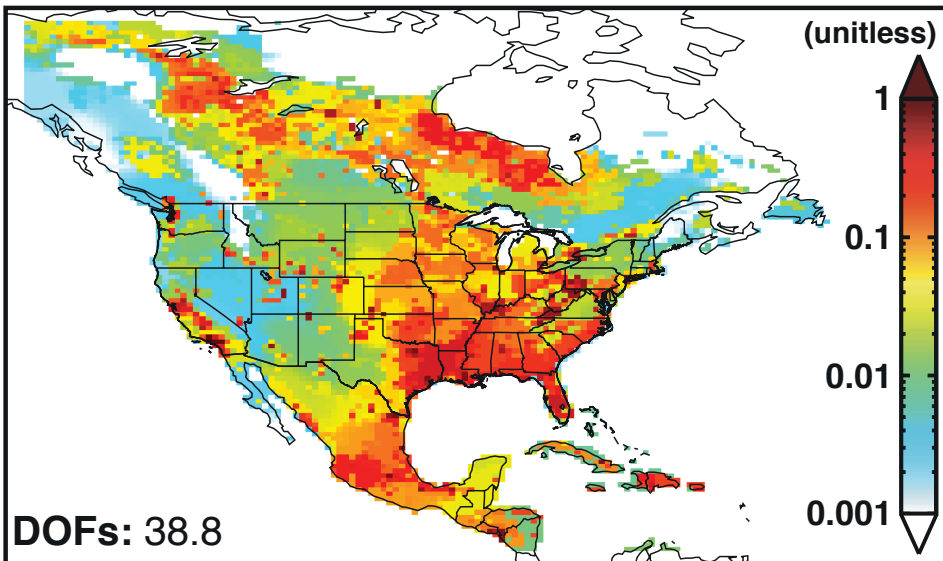


# Constraining North American methane sources

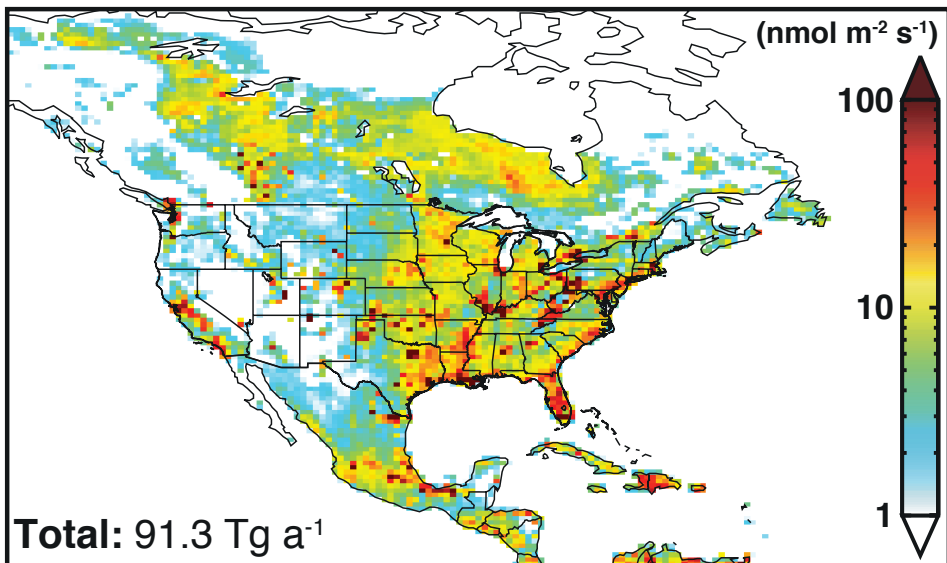
**Prior Emissions (2009 – 2011 average)**



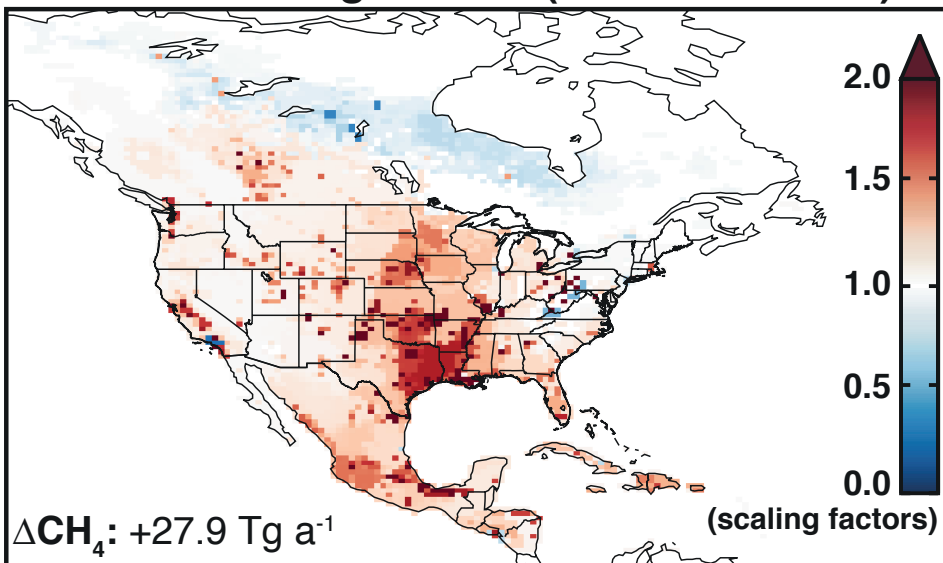
**Averaging Kernel Sensitivity**



**Posterior Methane Emissions**



**Emission Scaling Factors (Posterior / Prior)**

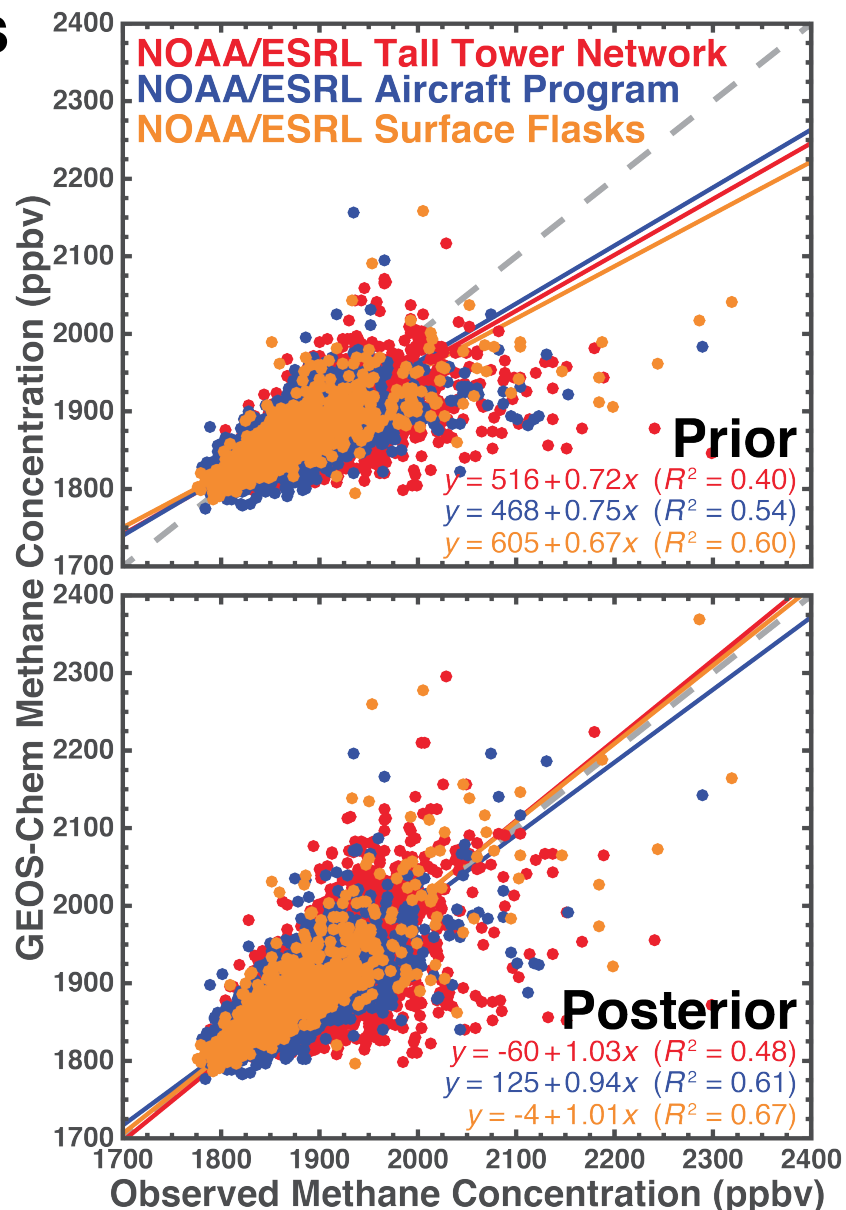
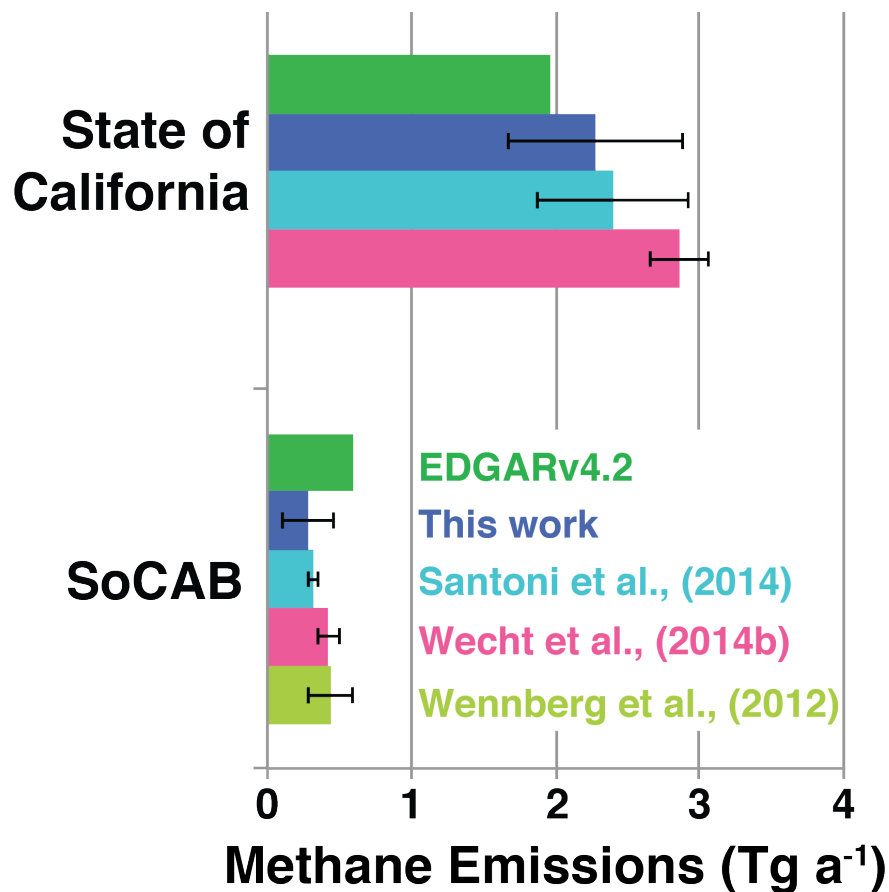




# Does this posterior inventory improve things?

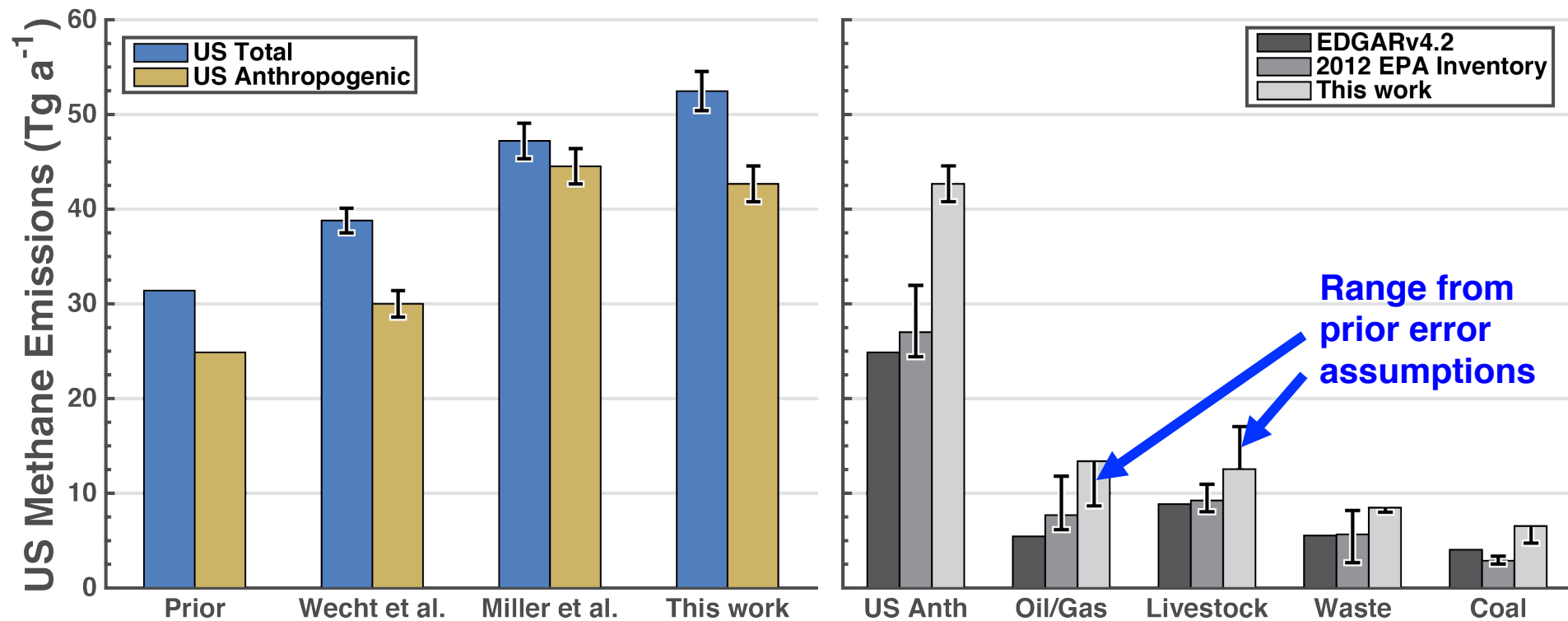
## ► Consistent emission estimates with regional and local studies

- Improves comparison with independent observations!



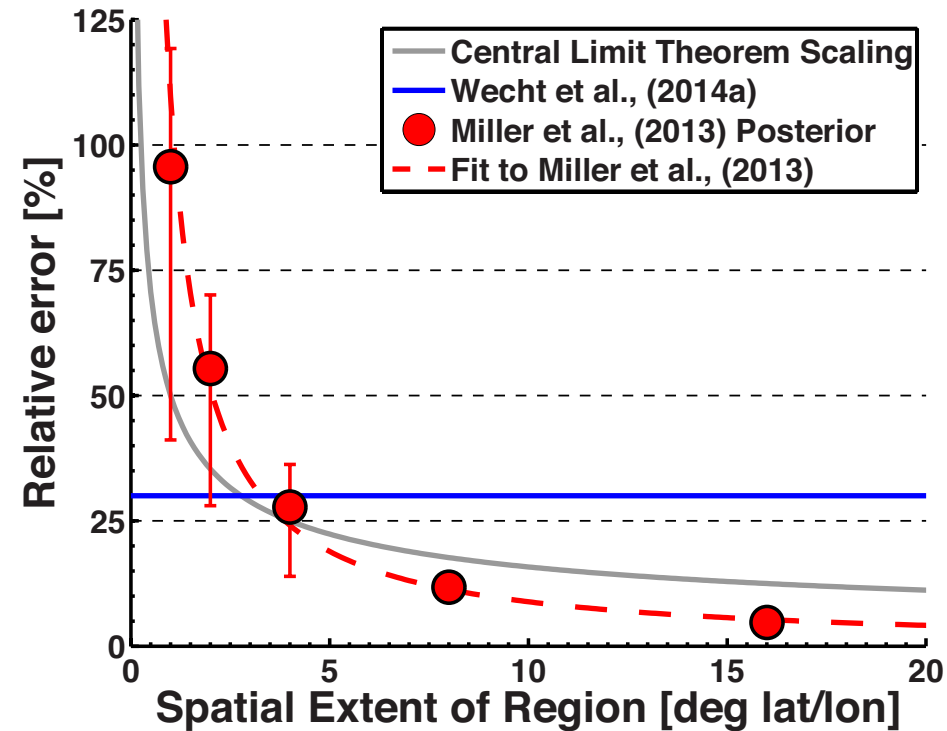
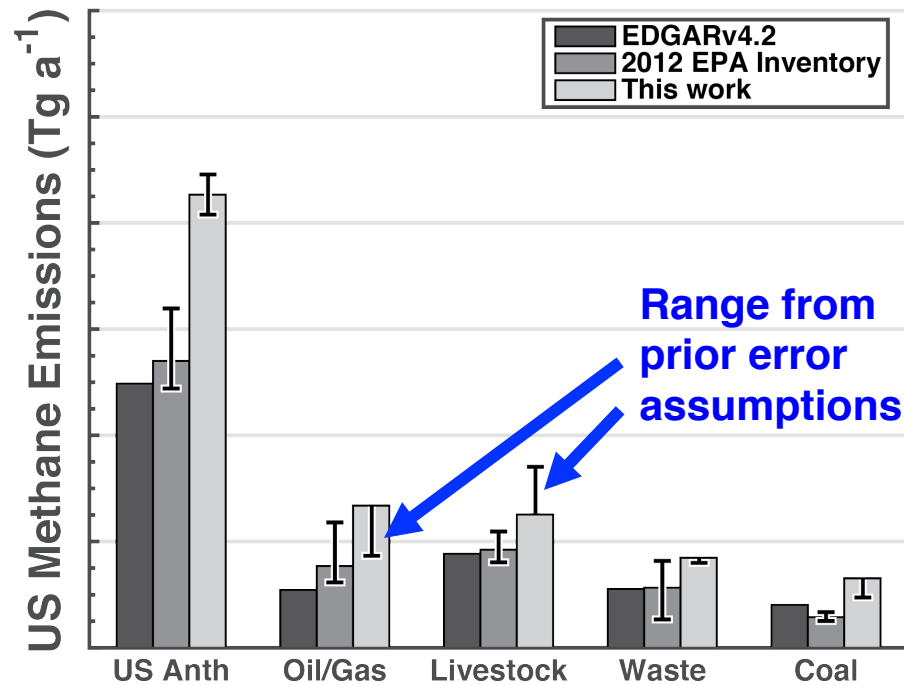
Turner et al. (2015)

# US methane emissions and source attribution



- ▶ **US emissions are a factor of 1.5 larger than the US EPA**
- ▶ **Livestock + Oil/Gas are the largest underestimated sources**
- ▶ **Attribution is sensitive to assumption about the prior error**

# US methane emissions and source attribution

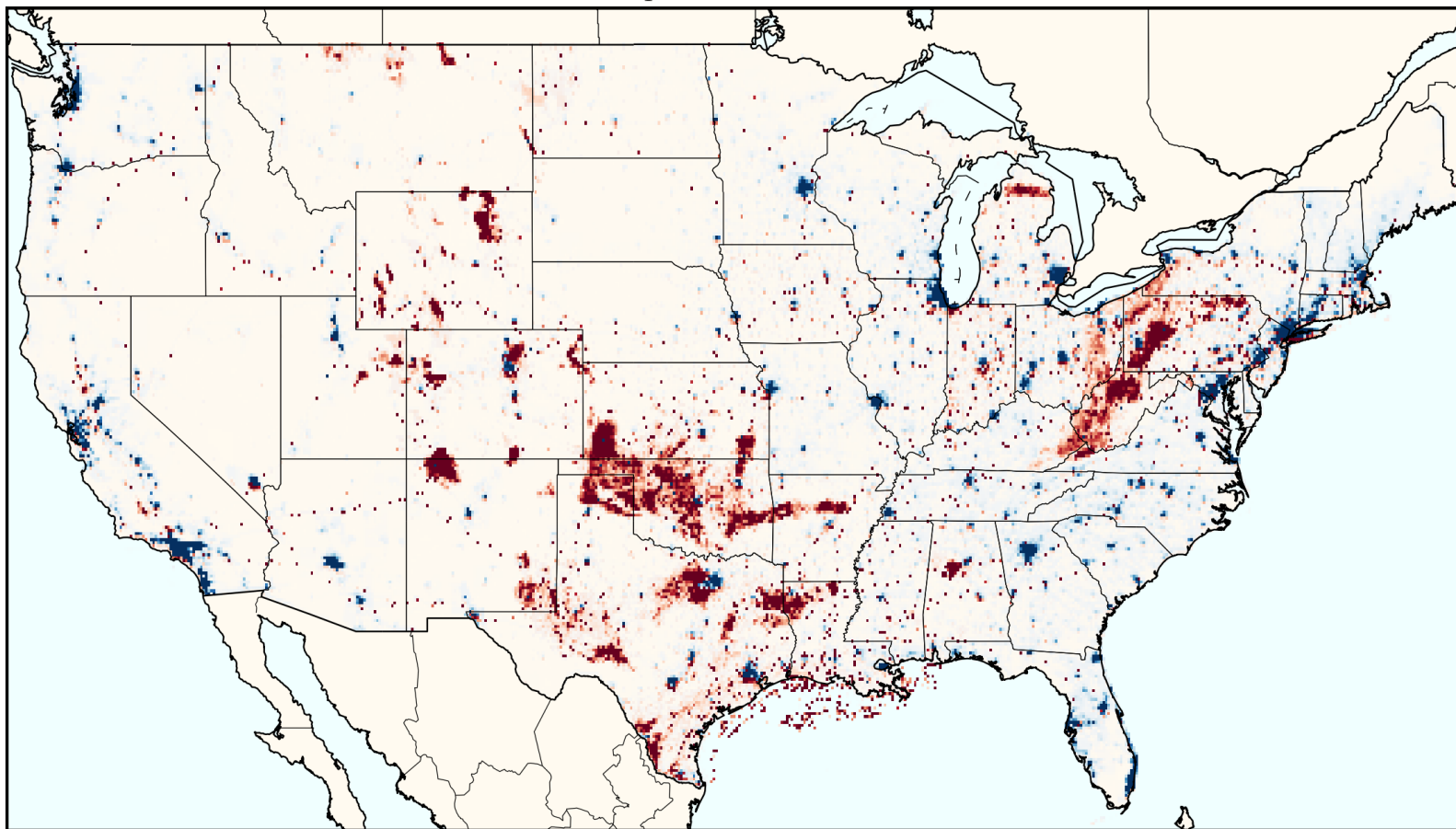


## ► Partitioning between oil/gas and livestock is dependent on specification of prior error

- Prior error like Wecht et al. (2014a) yields more livestock emissions
- Prior error like CLT (more similar to Miller et al.) yields balance between oil/gas and livestock

# Development of a gridded EPA methane inventory

EPA – EDGAR v4.2 CH<sub>4</sub> emissions from natural gas systems



$-5.0 \times 10^{11}$

$-2.5 \times 10^{11}$

0

$2.5 \times 10^{11}$

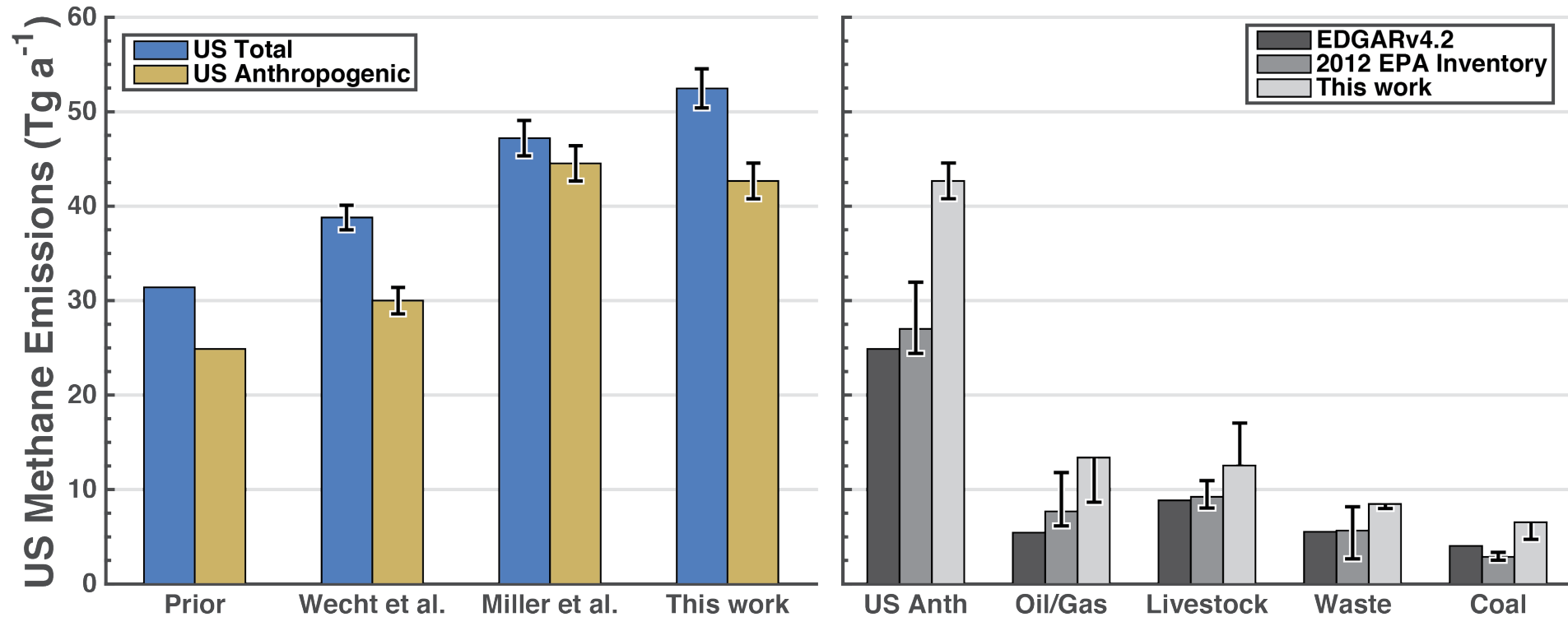
$5.0 \times 10^{11}$

CH<sub>4</sub> emissions (molec s<sup>-1</sup> cm<sup>-2</sup>)

**Improves potential of inversions to test and improve the EPA inventory**

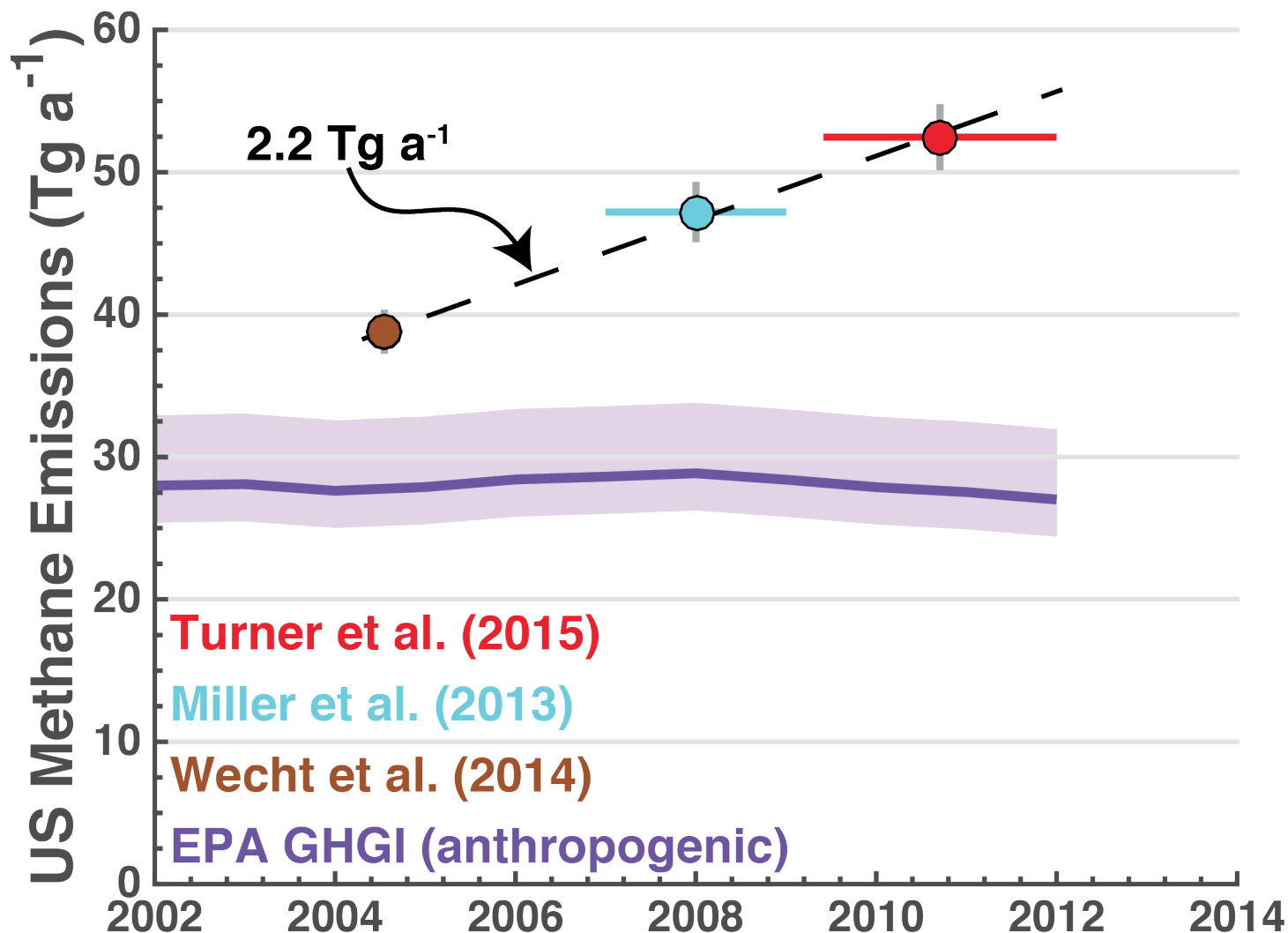
Maasackers *et al.* (in prep)

# Trend in US methane emissions?



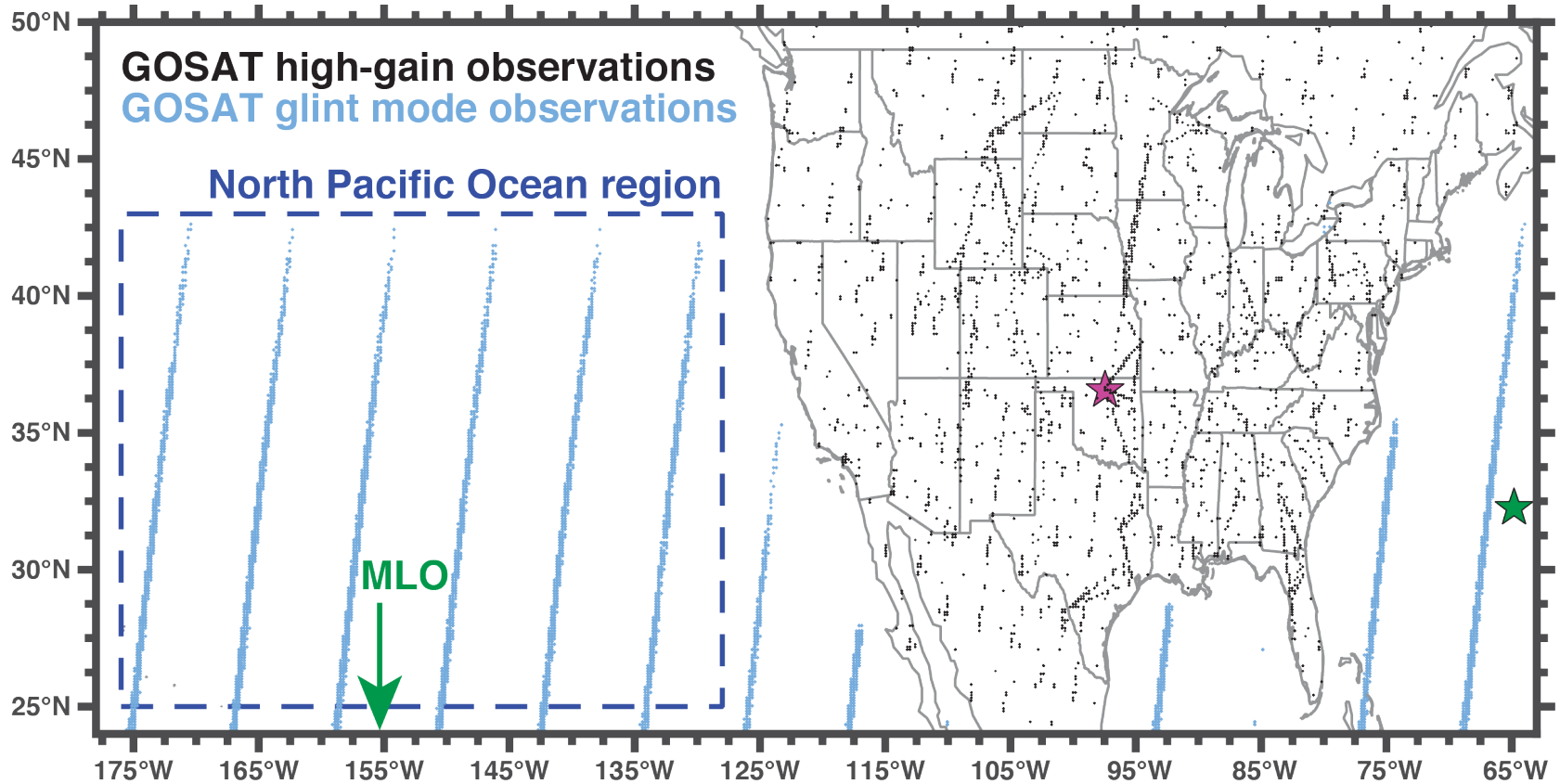
► What about the difference in magnitude between Wecht et al., Miller et al., and Turner et al.?

# Trend in US methane emissions?



**Top-down studies point to an increase in US methane, not seen in bottom-up estimates**

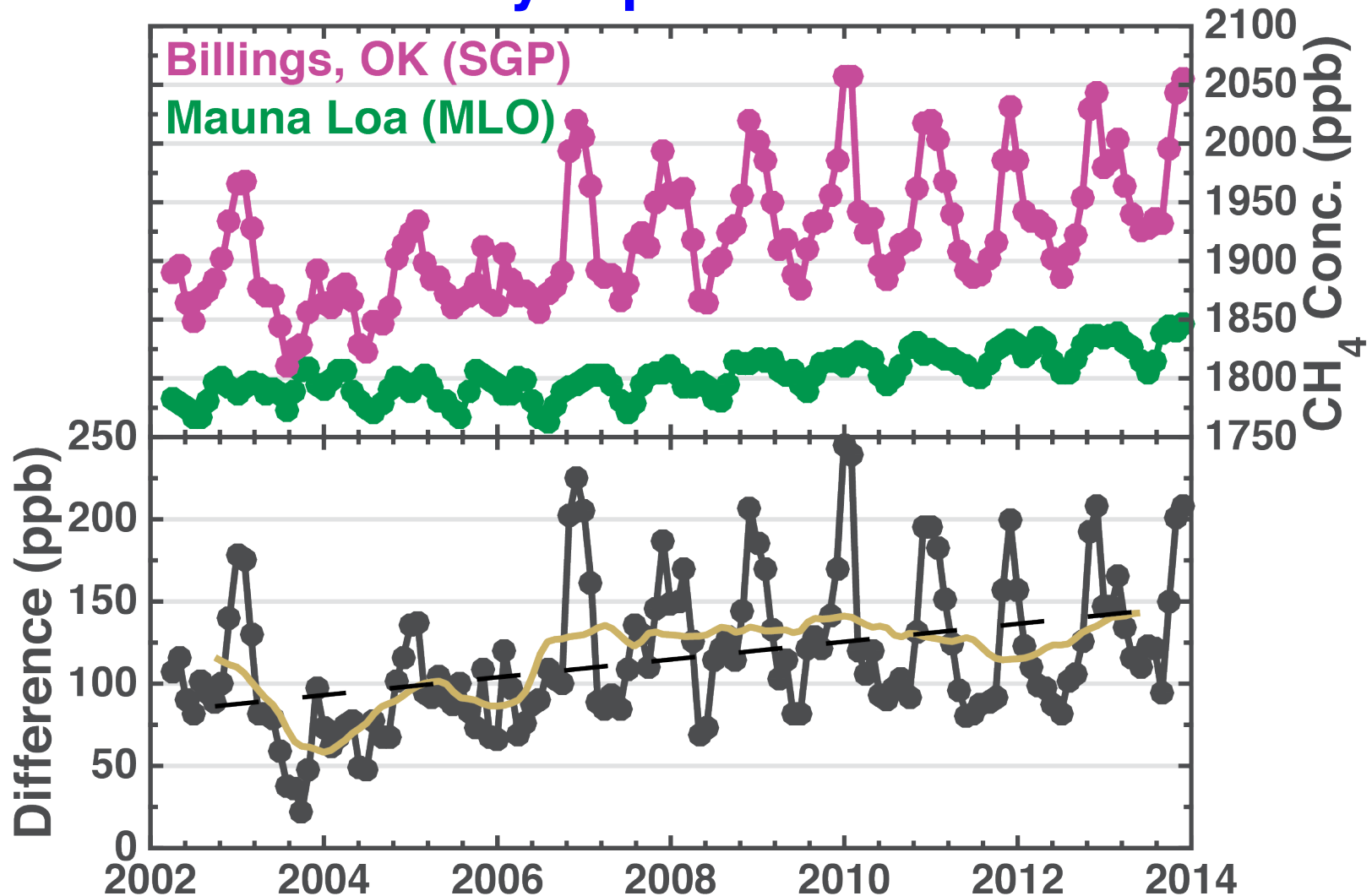
# What data do we have to corroborate this trend?



- ▶ **Surface observations from the NOAA/ESRL flask network**
- ▶ **Nadir-mode observations from the GOSAT satellite**
- ▶ **Glint-mode observations from the GOSAT satellite**

# Increasing difference in NOAA/DOE observations

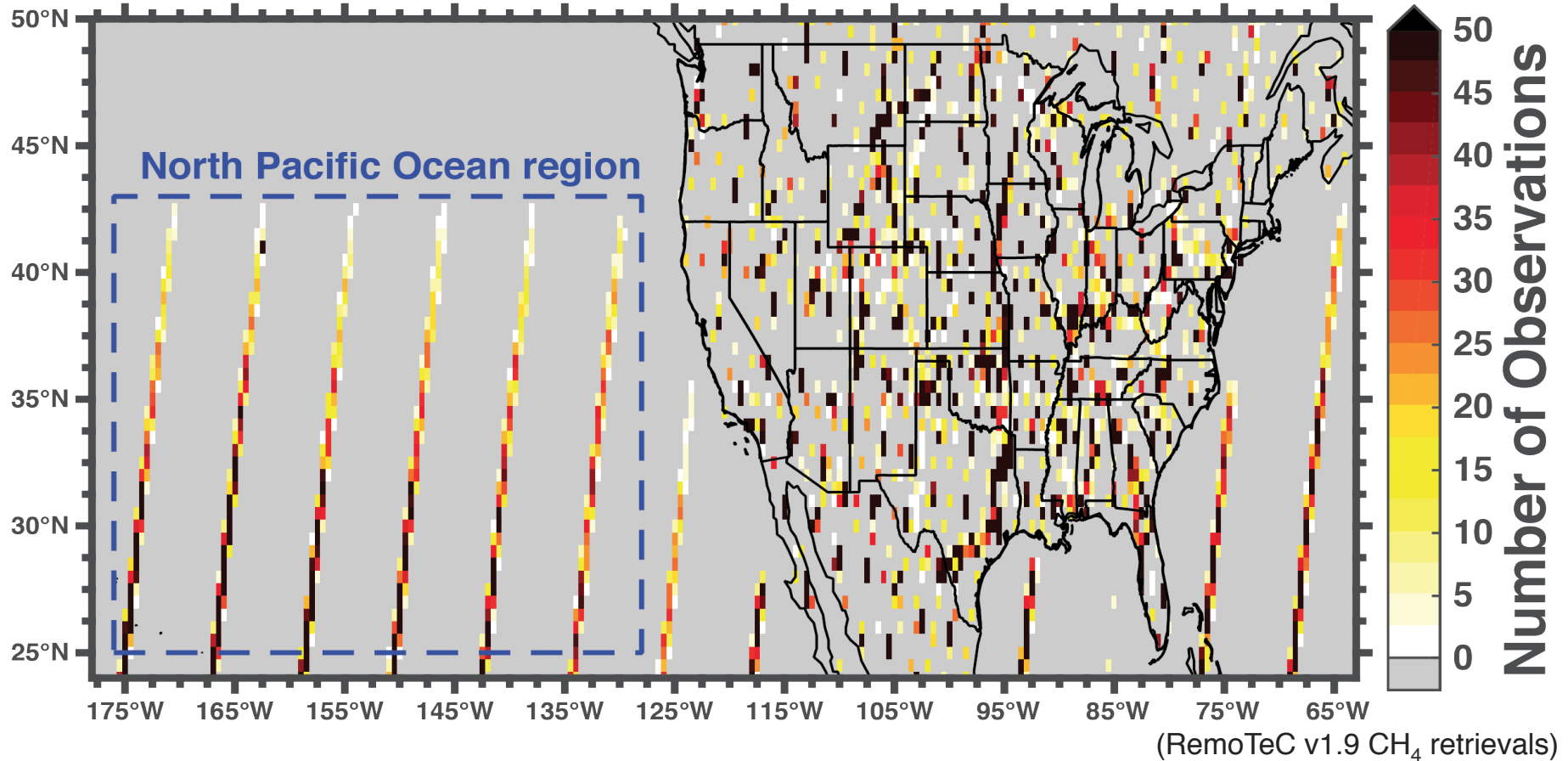
**Coincides with increase in US methane emissions seen by top-down studies**



(data c/o S.C. Biraud & E. Dlugokencky)

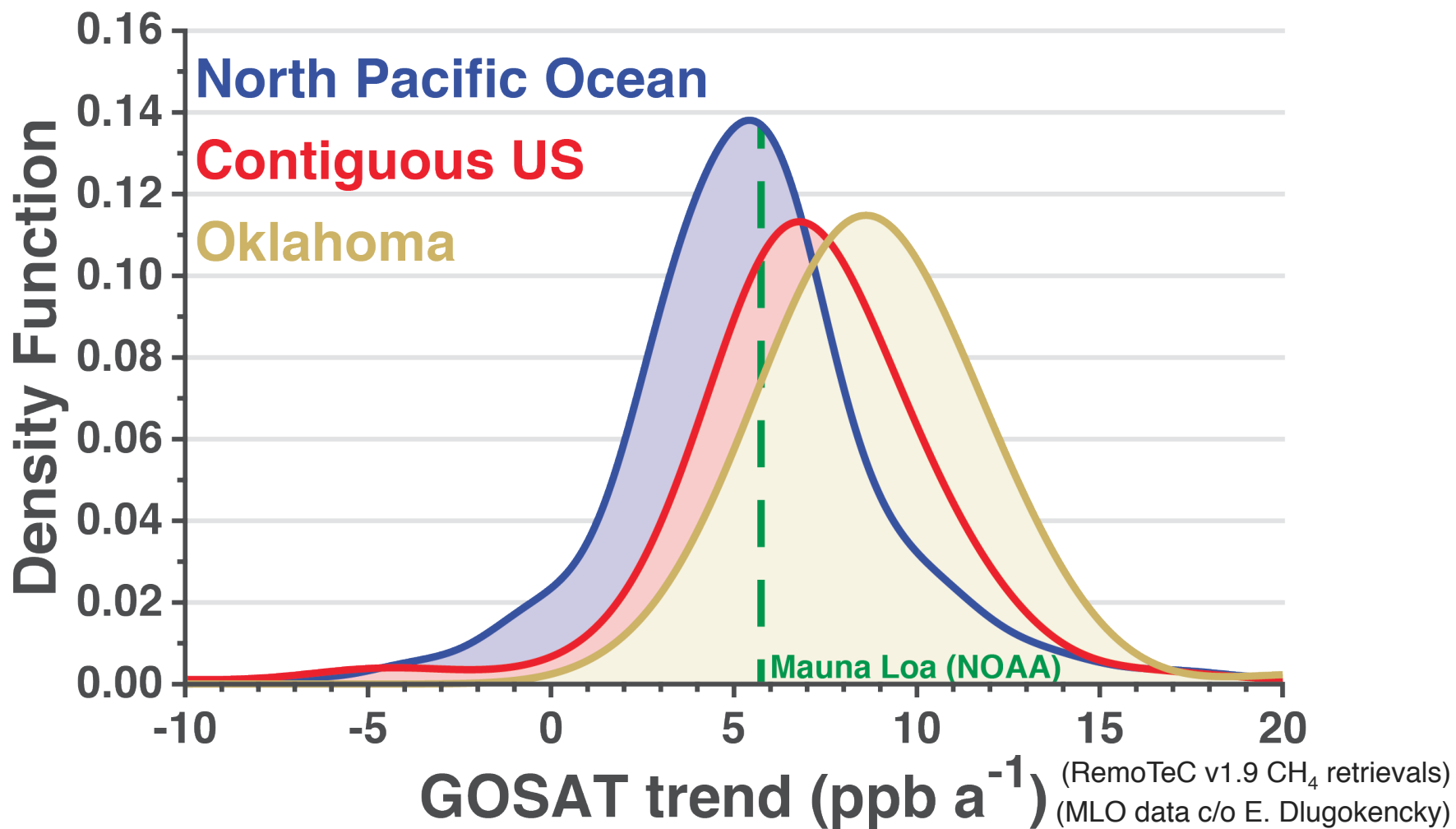


# Use GOSAT for regional trend analysis



- ▶ Look at trends over locations where GOSAT samples
- ▶ Compare **ocean glint** to **contiguous US** observations

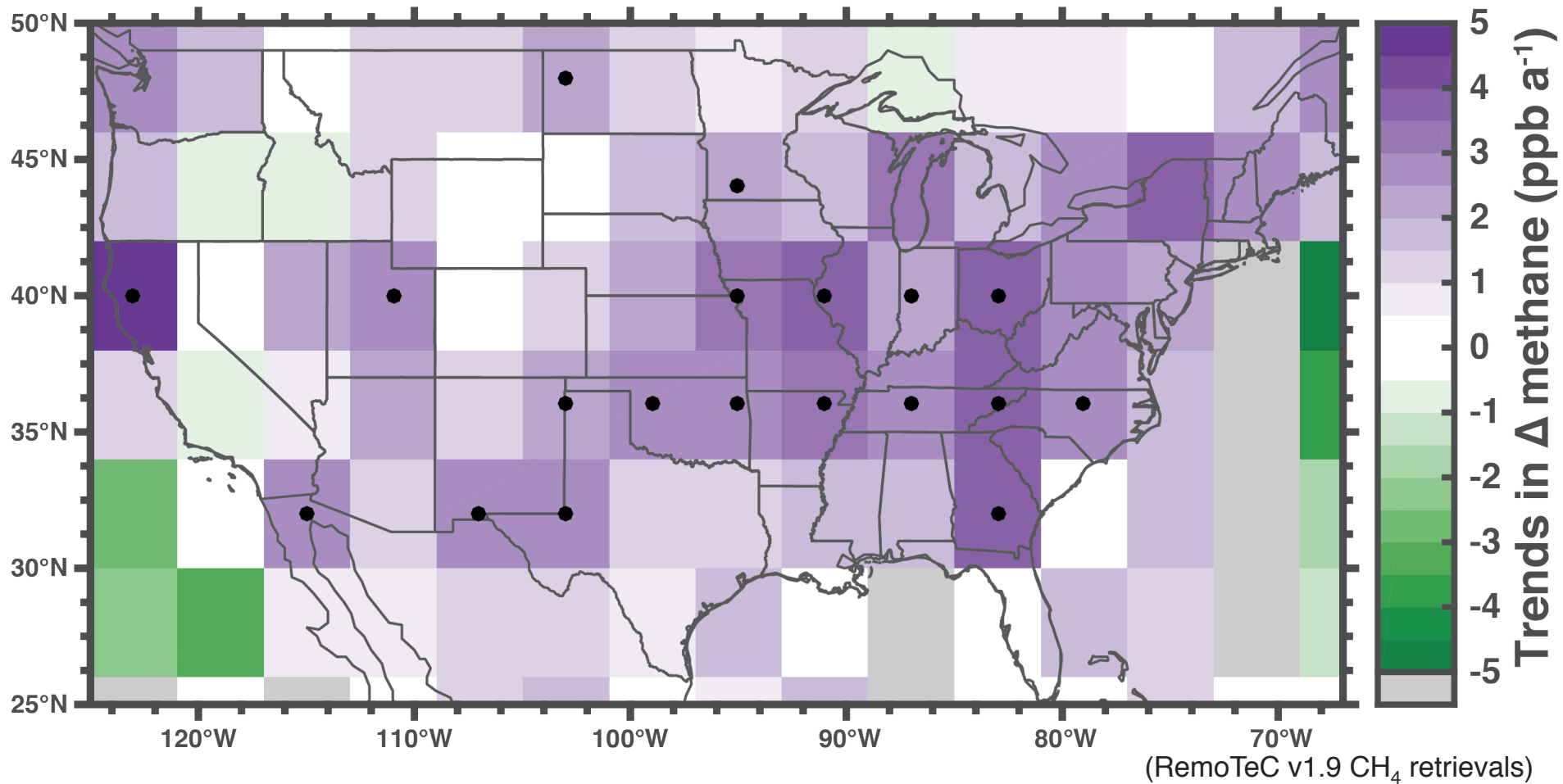
# Increasing difference in GOSAT observations



**GOSAT and NOAA background are consistent**

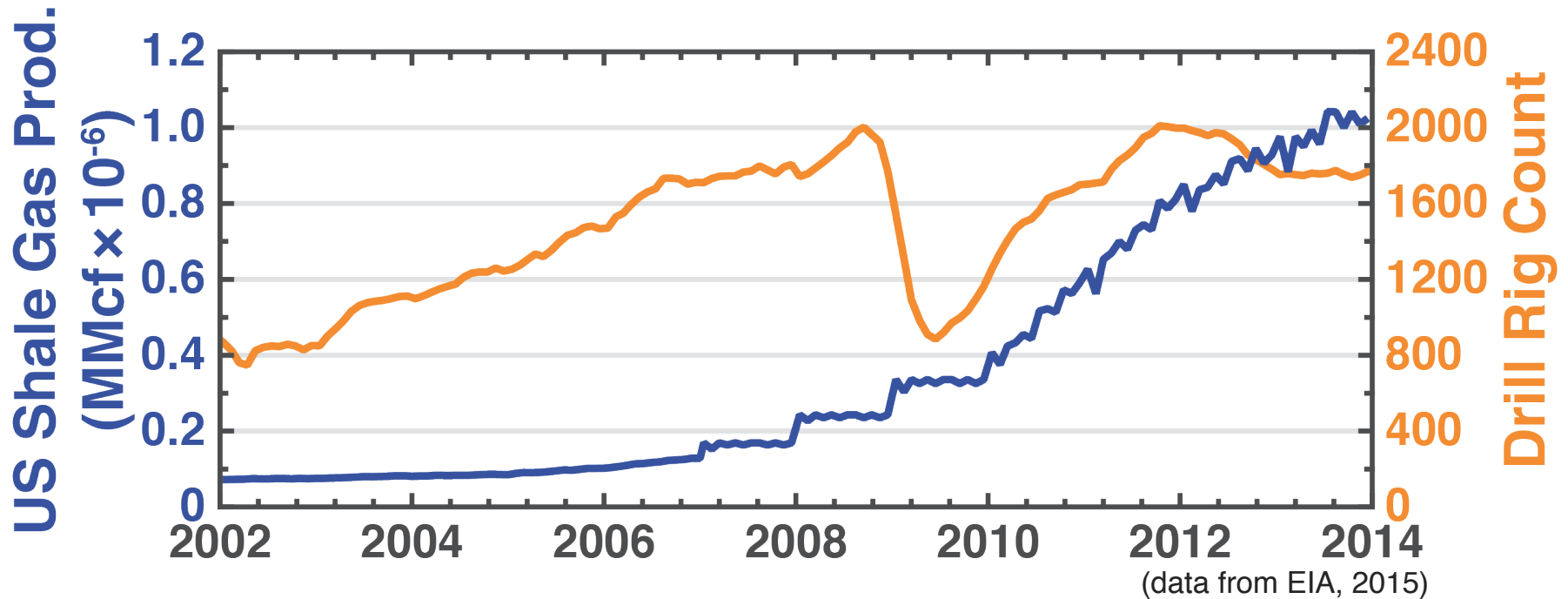
**Contiguous US enhanced from background**

# Where do we find regional trends?



**Increases are coincident with agriculture and oil/gas**

# Potential cause of the increase in US emissions



- ▶ **9-fold increase in US shale gas production from 2002–2014**
- ▶ **125% increase in active drill rigs from 2002–2014**

***Potentially explained by oil/gas increases***

# Summary

- ▶ **Space-borne observations can be used to estimate regional methane emissions**
- ▶ **US methane emissions have increased more than 30% in the past decade**
  - ▶ Likely due to anthropogenic (oil/gas or agriculture) sources
- ▶ **Could be a driver in the renewed methane growth**

