

Constraining fossil fuel CO₂ emissions by the joint assimilation of atmospheric CO₂ and ¹⁴CO₂ measurements

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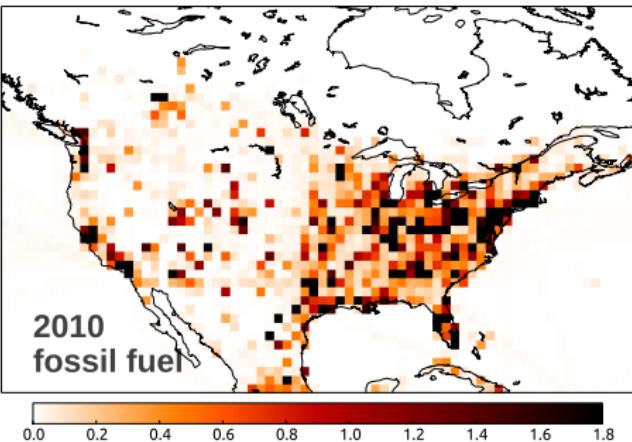
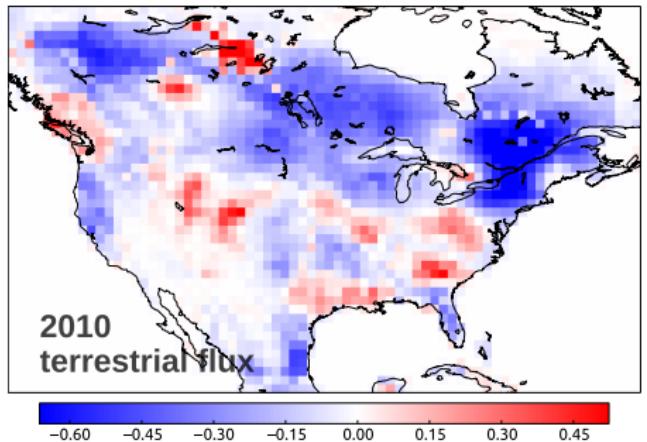


GMD Annual Conference
Boulder, May 2014

What is the issue?



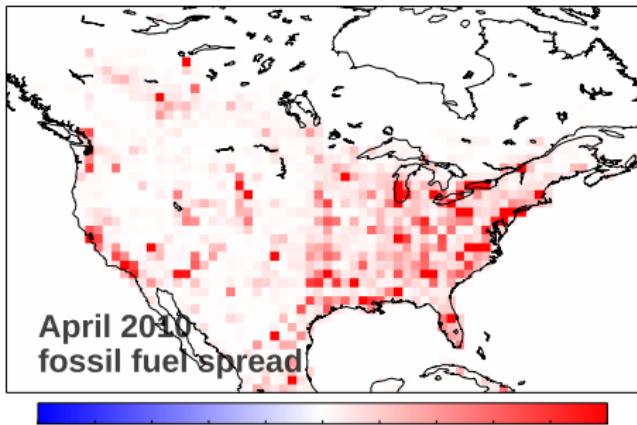
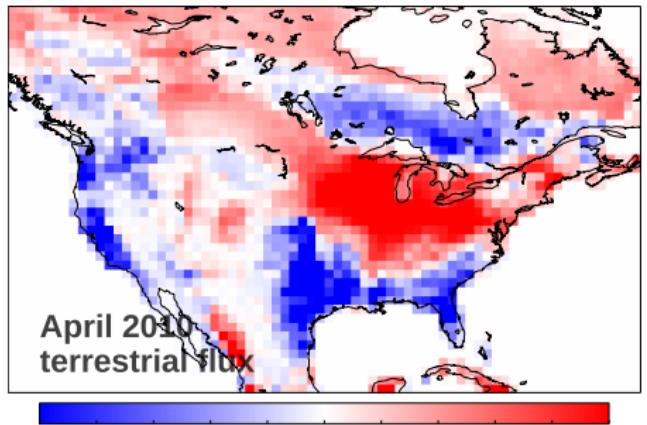
$$\frac{dC}{dt} = F_{oce} + F_{bio} + F_{fos}$$



- ▶ Almost all atmospheric CO₂ inversions assume CO₂(ff) "perfectly" known, solve for natural fluxes

What is the issue?

$$\frac{dC}{dt} = F_{\text{oce}} + F_{\text{bio}} + F_{\text{fos}}$$



April 2010
terrestrial flux

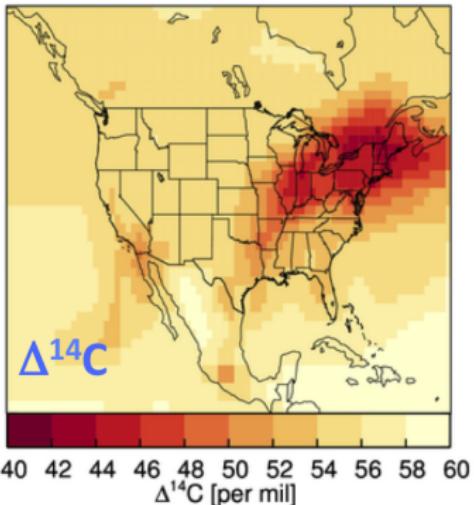
April 2010
fossil fuel spread

- ▶ Almost all atmospheric CO₂ inversions assume CO₂(ff) "perfectly" known, solve for natural fluxes
- ▶ Only true annually, for global and (some) national totals
- ▶ Usually not up to date, EDGAR 5 yr old, Vulcan 13 yr old

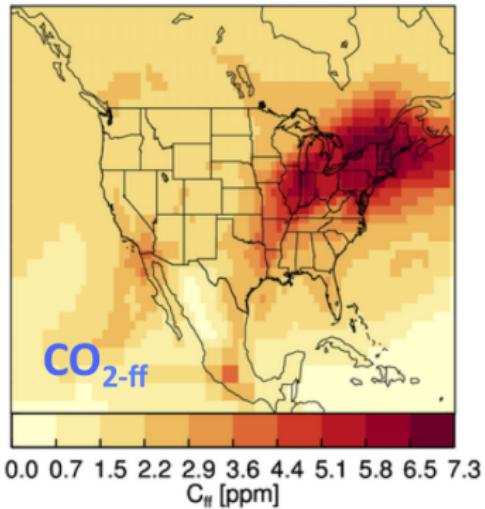
$^{14}\text{CO}_2$ is a tracer for $\text{CO}_2(\text{ff})$

$$\Delta^{14}\text{C}_{\text{ff}} = -1000 \text{ ‰} \text{ (i.e., zero } ^{14}\text{CO}_2)$$

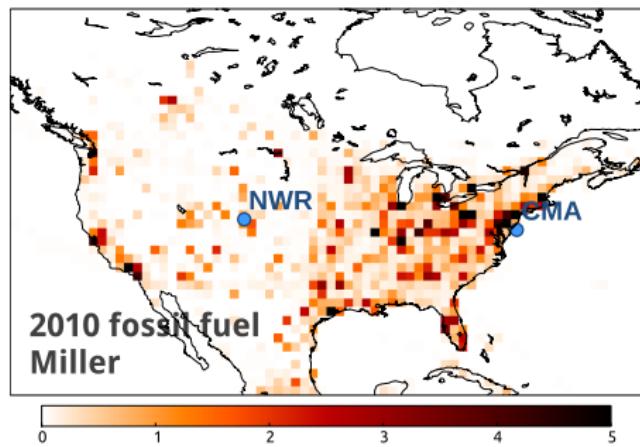
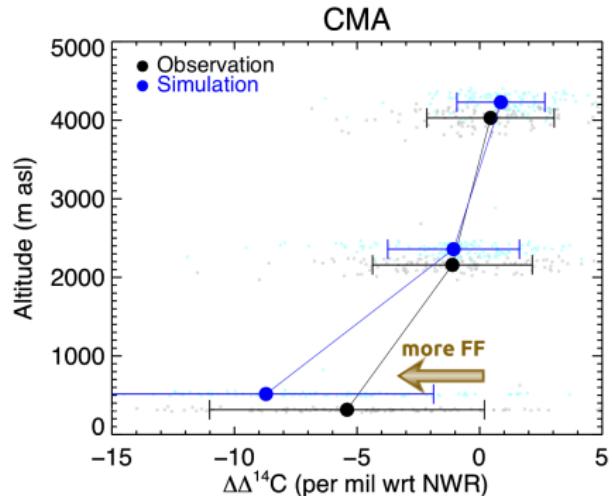
$$\text{Scaling in 2006} = -2.7 \text{ ‰} \Delta^{14}\text{C} \text{ for 1 ppm CO}_2(\text{ff})$$

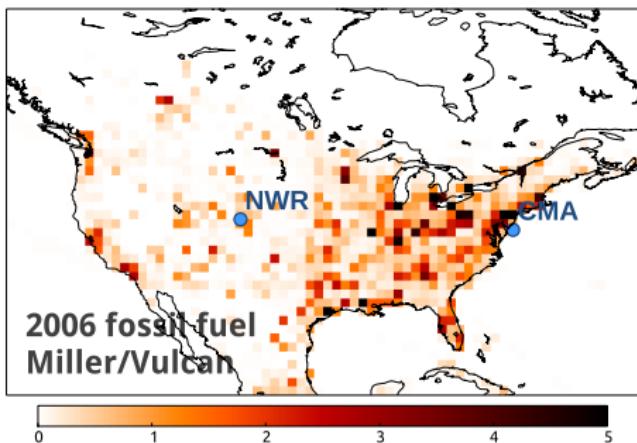
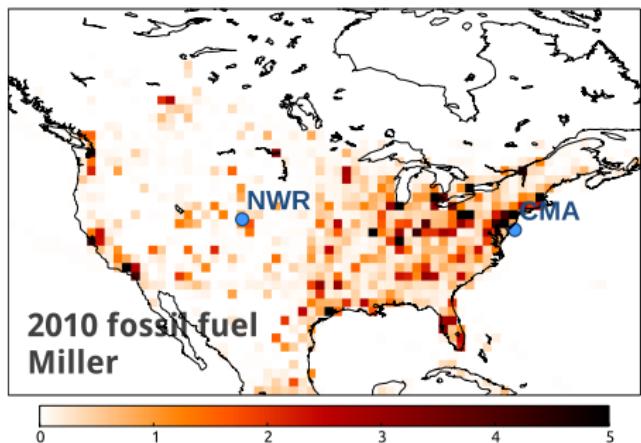
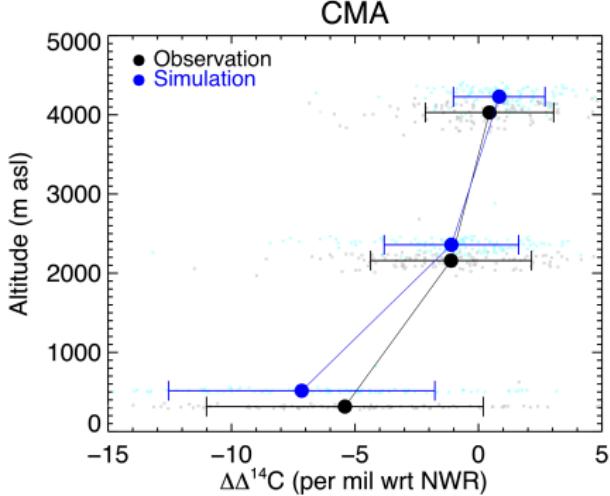
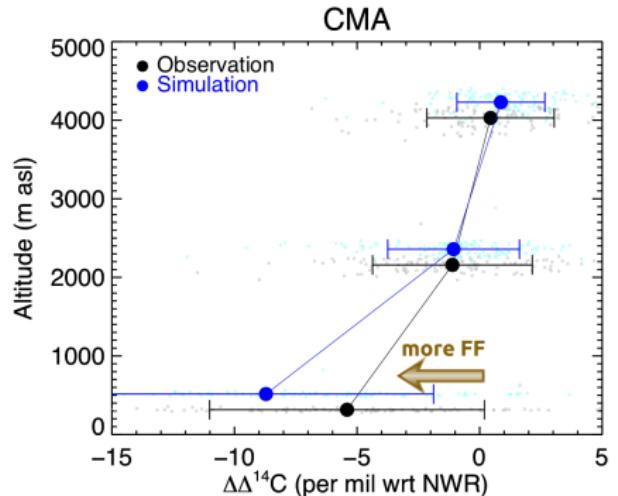


fossil fuel, ocean and land
disequilibrium, nuclear and
cosmogenic production

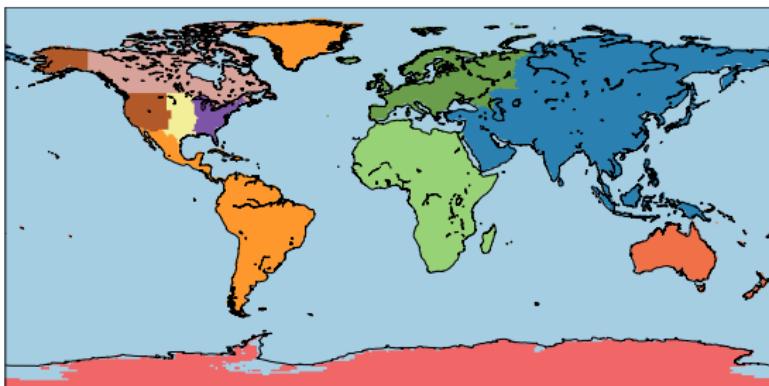


fossil fuel only





Prior flux uncertainties



- ▶ US CO₂(ff): 5.26 ± 0.26 Pg CO₂
- ▶ Fossil fuel: $2.5 \times$ inter-prior spread,
700 km hybrid, 3 month

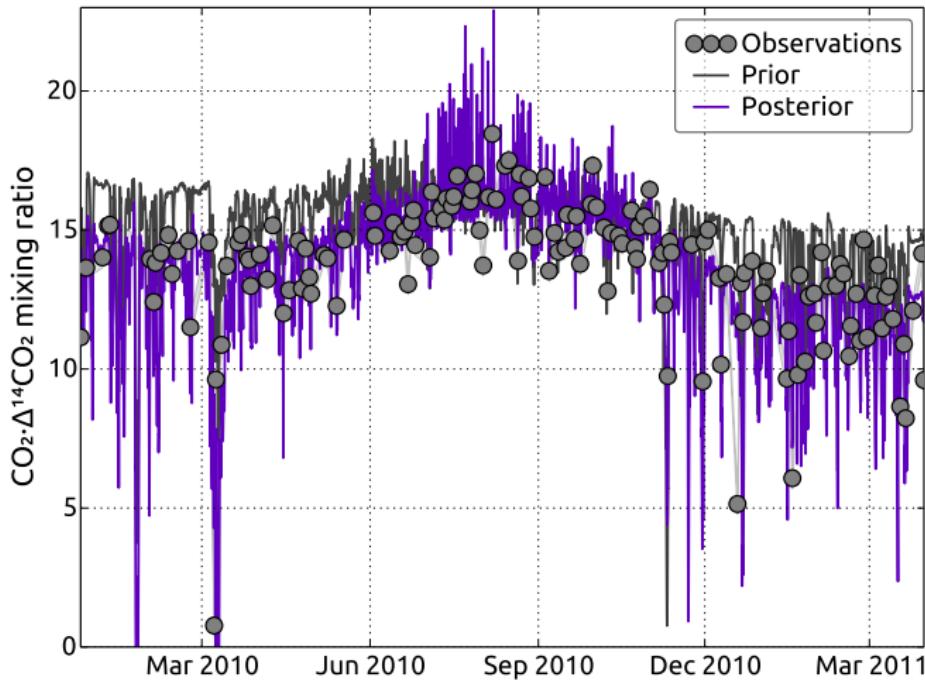
- ▶ Land biosphere: $0.25 \times$ respiration per grid cell, 200 km (e), 1 month
- ▶ Ocean: $157 \times$ abs(net flux), 1000 km (e), 3 month
- ▶ Ocean disequilibrium: $0.2 \times$ abs(net flux), regional, 3 month
- ▶ Land disequilibrium: $0.1 \times$ abs(net flux), regional, 1 month

Our measurements are CO₂ and CO₂·Δ¹⁴CO₂

Model-observation mismatch of $\text{CO}_2 \cdot \Delta^{14}\text{CO}_2$



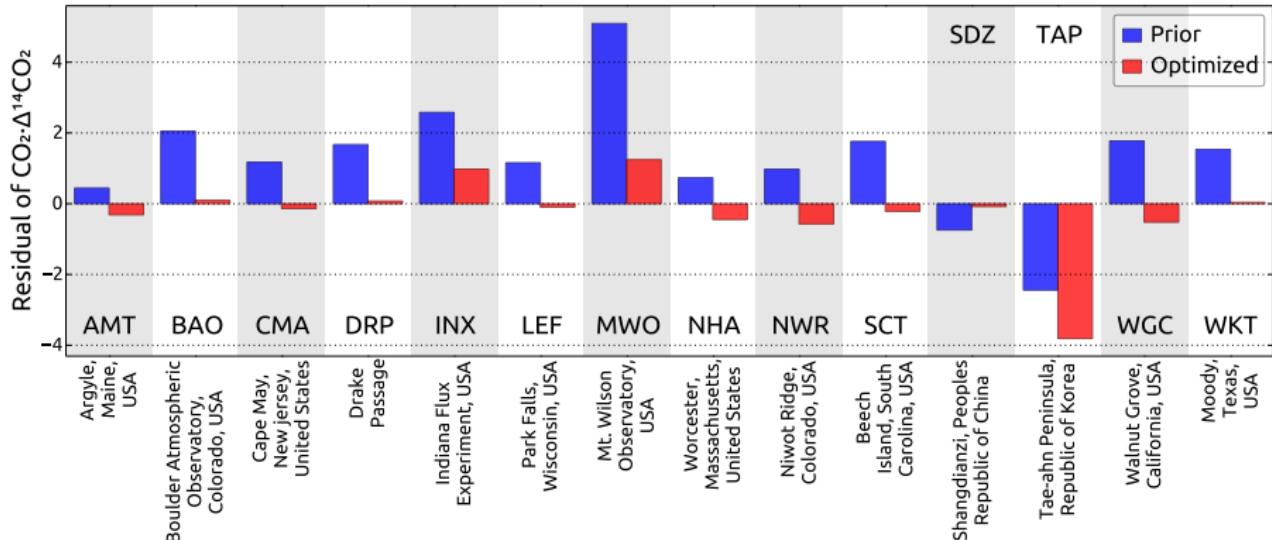
Park Falls, Wisconsin, USA (46.0°N, 90.3°W, 472 masl)



$$\text{Average prior mismatch} = 1.16 \times 10^3 \text{ ‰·ppm}$$

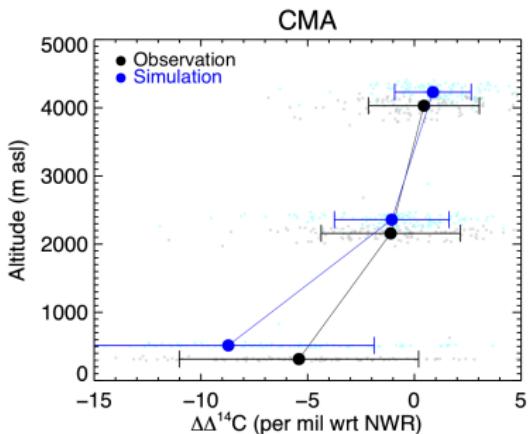
$$\text{Average posterior mismatch} = -0.10 \times 10^3 \text{ ‰·ppm}$$

Model-observation mismatch of $\text{CO}_2 \cdot \Delta^{14}\text{CO}_2$

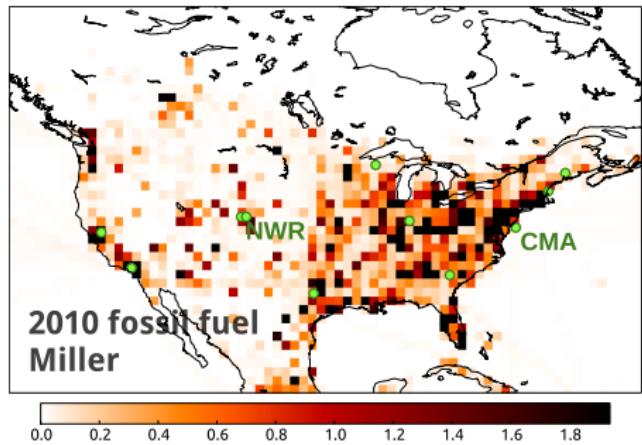


The inversion is doing what it is supposed to do

Adjustments to fluxes/optimized emissions



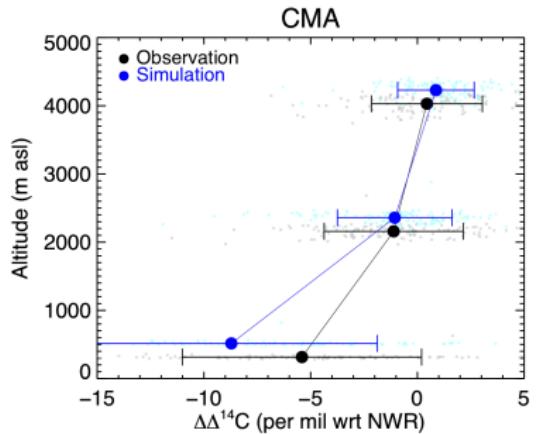
- ▶ The CMA–NWR gradient is consistent with more CO₂(ff) emission inland



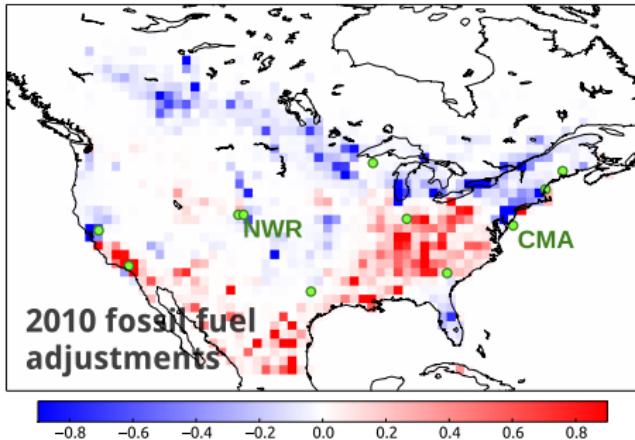
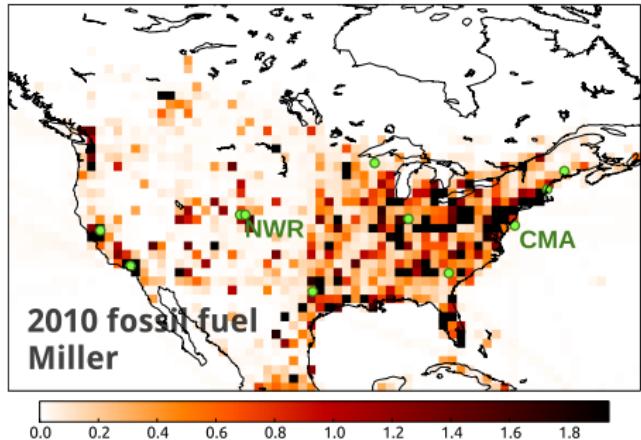
Adjustments to fluxes/optimized emissions



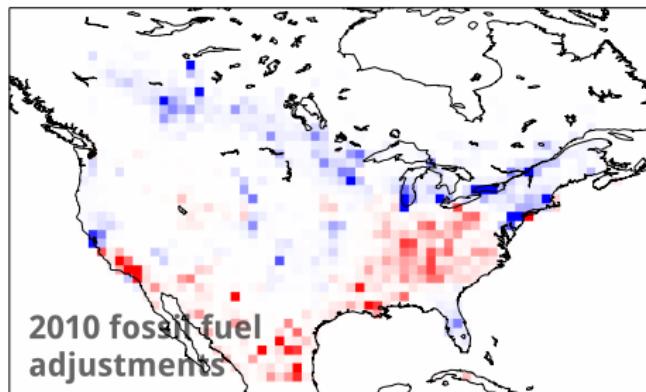
CMA



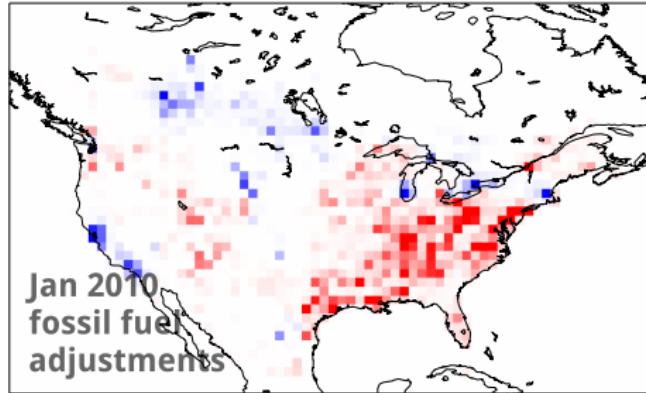
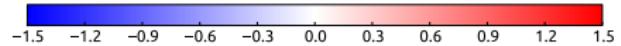
- ▶ The CMA–NWR gradient is consistent with more $\text{CO}_2(\text{ff})$ emission inland
- ▶ The inversion increases $\text{CO}_2(\text{ff})$ emission inland



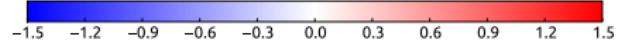
Seasonal vs annual CO₂(ff) adjustments



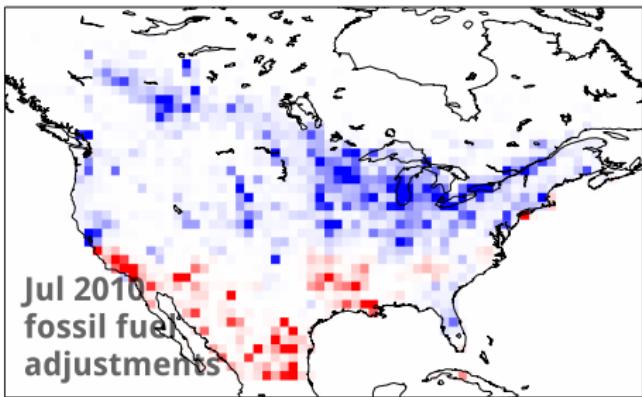
2010 fossil fuel
adjustments



Jan 2010
fossil fuel
adjustments



- ▶ Adjustments at the monthly scale are larger than adjustments at the annual scale
- ▶ Spatial patterns of the two adjustments can be different



Jul 2010
fossil fuel
adjustments





- ▶ Fossil fuel CO₂ “well known” at national/yearly scales, not at regional/monthly scales
- ▶ Errors in CO₂(ff) emission estimates cause errors in NEE estimates



Points to take home

- ▶ Fossil fuel CO₂ “well known” at national/yearly scales, not at regional/monthly scales
- ▶ Errors in CO₂(ff) emission estimates cause errors in NEE estimates
- ▶ ¹⁴CO₂ is a good tracer for CO₂(ff), can disentangle CO₂(total) from CO₂(ff)
- ▶ Even with ~ 55 times lower measurement density, ¹⁴CO₂ measurements in a CO₂ + ¹⁴CO₂ inversion shifts emission of CO₂(ff) inland, as expected



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- ▶ Very much a work in progress, not yet the optimal framework for utilizing ¹⁴CO₂ measurements

Mass balance

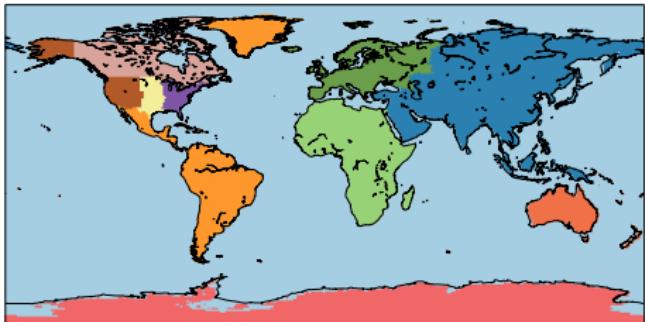
$$\frac{dC}{dt} = F_{oce} + F_{bio} + F_{fos}$$

$$\begin{aligned}\frac{d}{dt} (C \cdot \Delta_{atm}) &= \Delta_{fos} F_{fos} + \Delta_{atm} (F_{oce} + F_{bio}) \\ &\quad + \Delta_{oce} F_{oce \rightarrow atm} + \Delta_{bio} F_{bio \rightarrow atm} \\ &\quad + \alpha (F_{nuc} + F_{cosmo})\end{aligned}$$

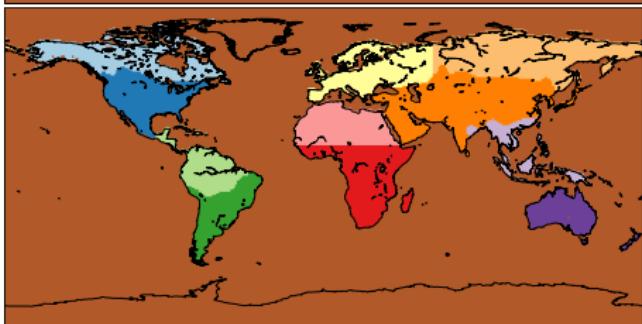
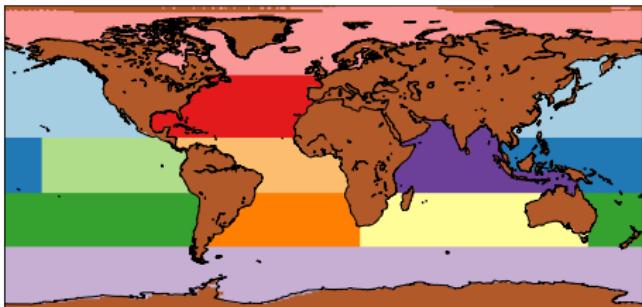
tracers transported
fluxes estimated



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Posterior correlation between CO₂(ff) and CO₂(nat)

