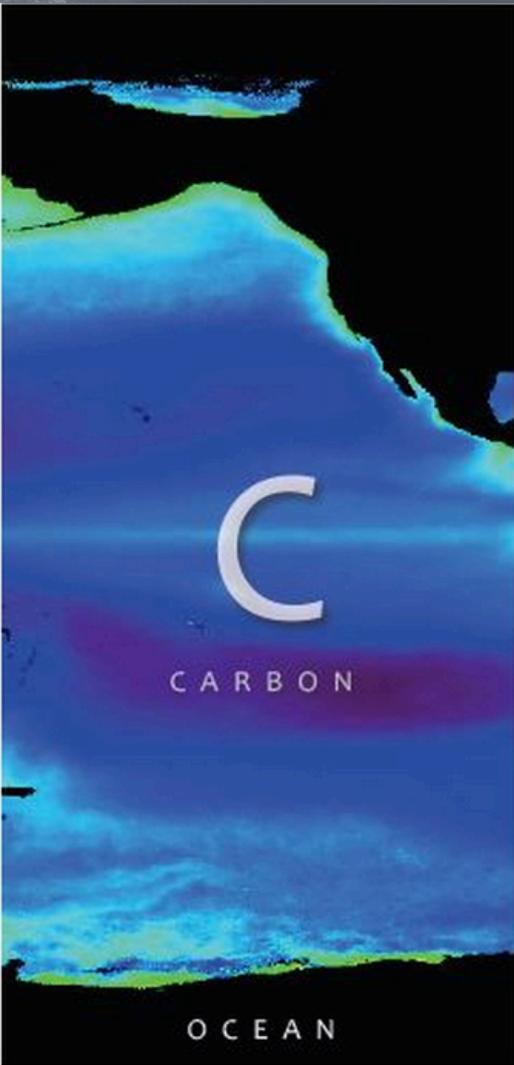




Modeling Status



Kevin W. Bowman
Jet Propulsion Laboratory
California Institute of Technology



CMS-Flux team:

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Jet Propulsion Laboratory, California Institute of Technology

**Joint Institute for Regional Earth System Science and Technology, University of California,
Los Angeles**

James Collatz, Zhengxin Zhu

NASA Goddard Space Flight Center

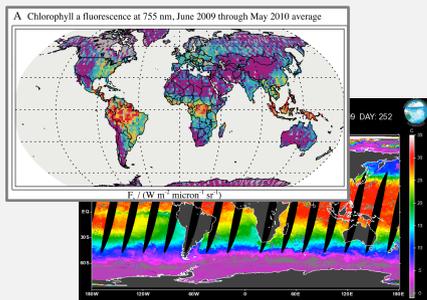
Kevin Gurney

Arizona State University



CMS-Flux Framework

Surface Observations



GOSAT/OCO-2 SIF, Jason SST, nightlights, etc.

Carbon Cycle Models

Anthropogenic emissions

Terrestrial exchange

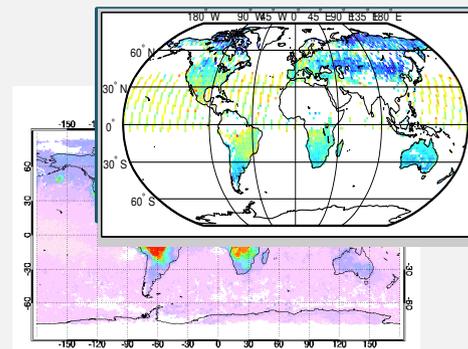
Ocean exchange

Inversion System

Atmospheric transport and chemistry model

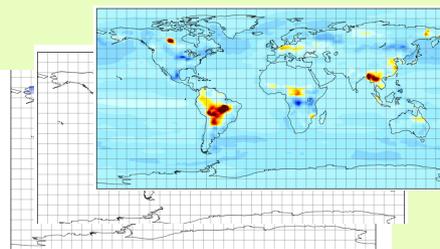
Inverse Model

Atmospheric Observations



OCO-2 CO₂,
GOSAT CO₂ and CH₄,
MOPITT CO

Posterior Carbon Fluxes (CO₂,
CH₄, CO)

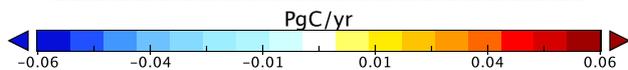
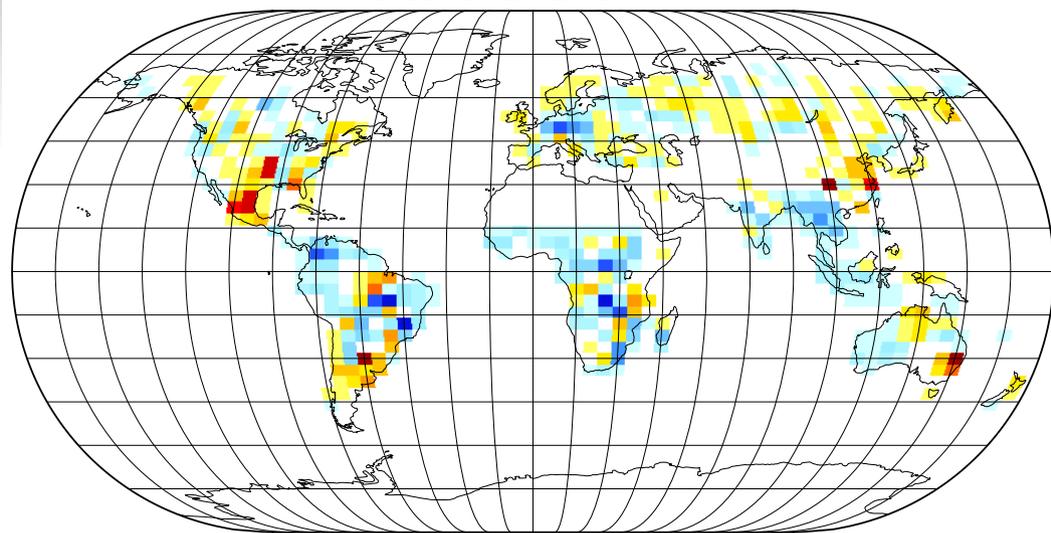


Attribution

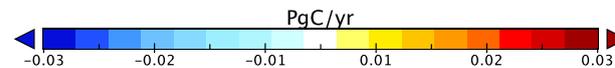
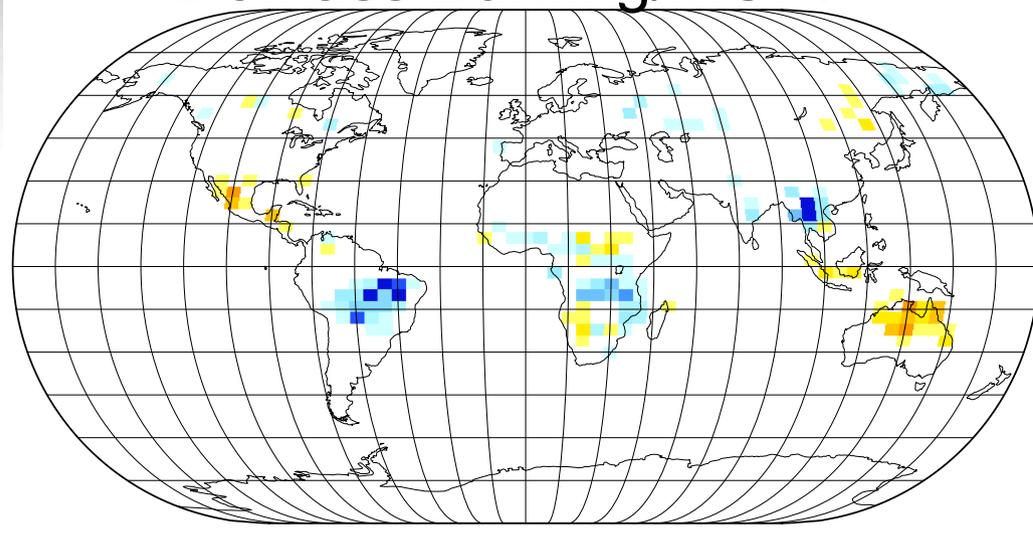


Global Analysis (2011-2010)

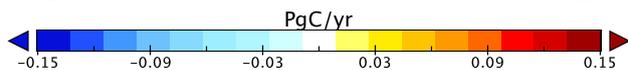
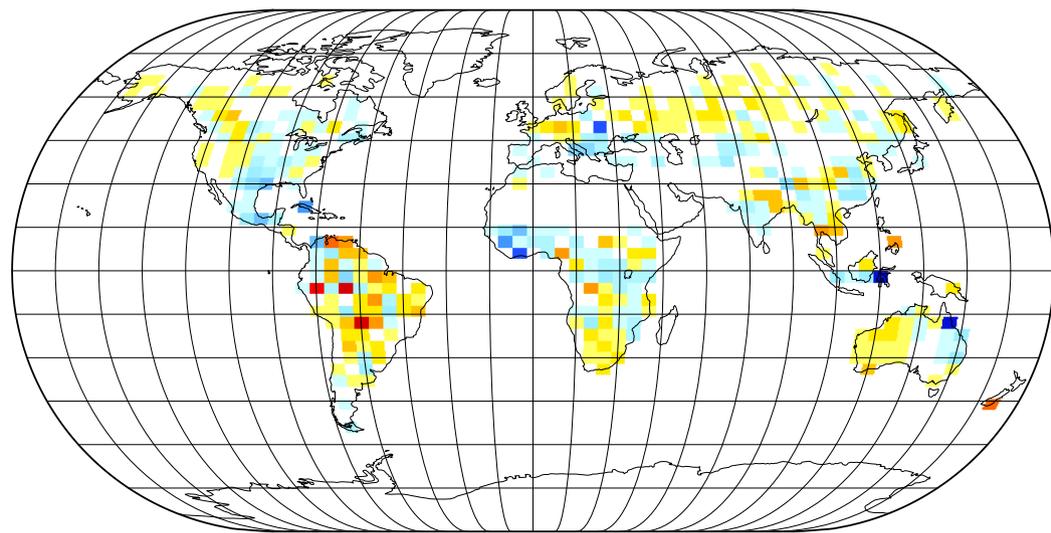
Total/GOSAT



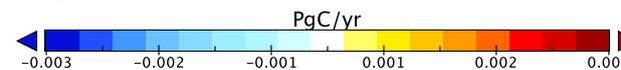
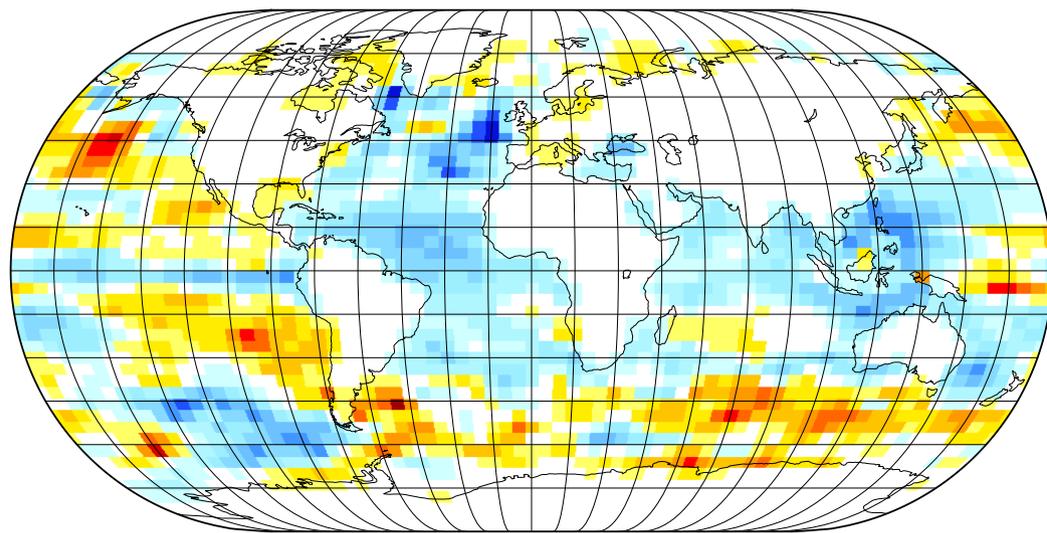
Biomass Burning/MOPITT



GPP/SIF

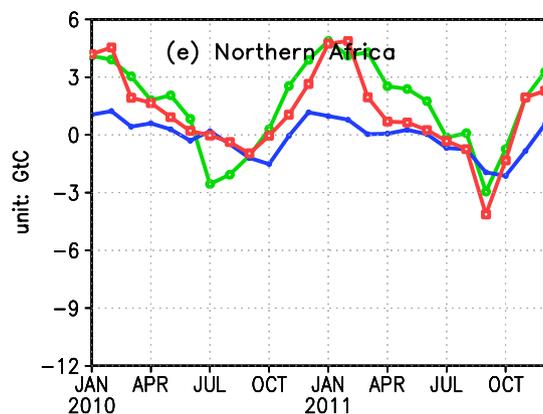
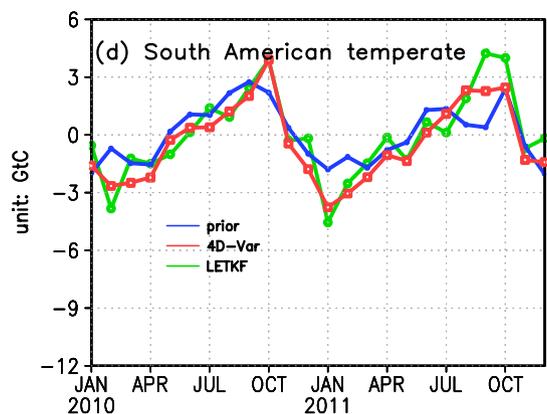
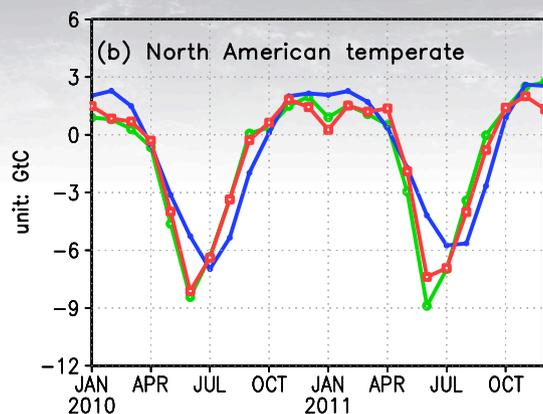
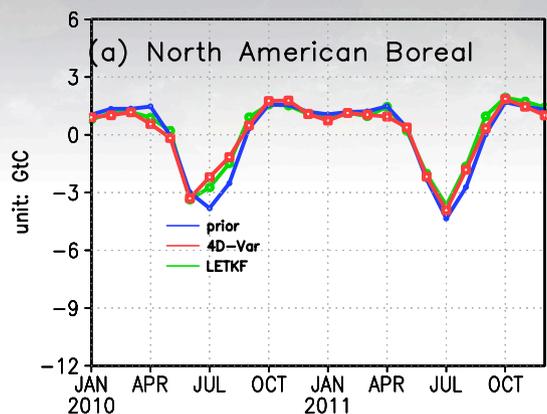
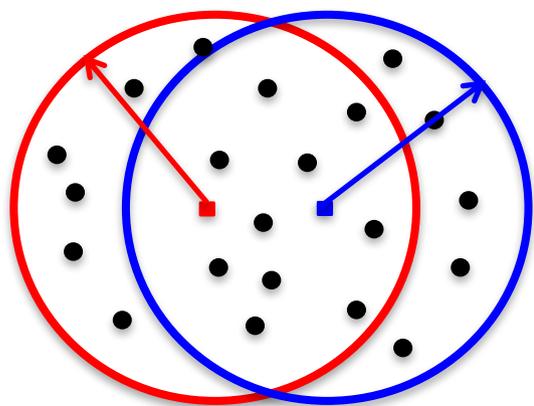
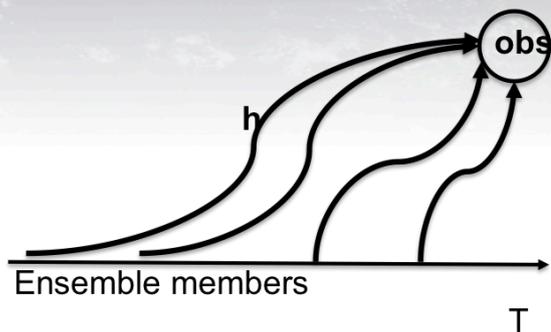


Ocean/ECCO-2





CMS-Flux extension-LETKF



Liu, Bowman, and Lee, *in press*

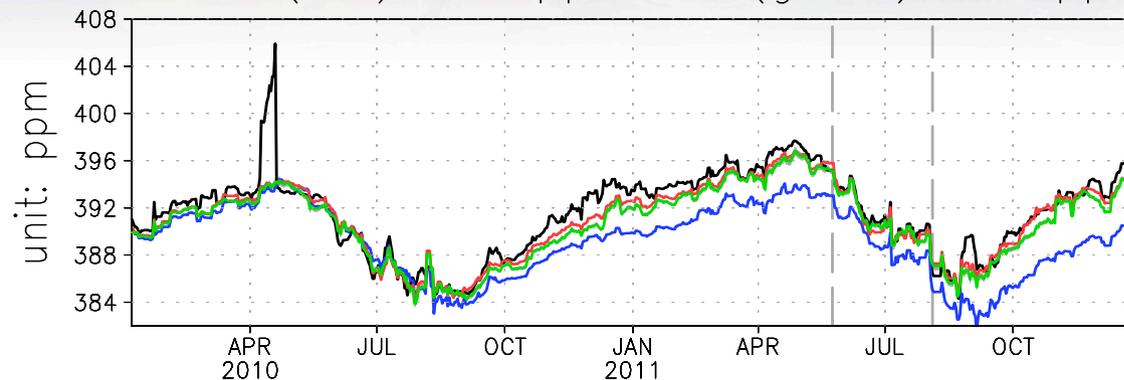
- CMS-Flux now incorporates a Local Ensemble Transform Kalman Filter (LETKF) (Liu, Bowman, and Lee, JGR, *in press*)
- Good agreement overall between 4D-var and LETKF
- OCO-2 constrained fluxes can be rapidly updated in LETKF
- LETKF incorporates advanced diagnostics, e.g., observation impact



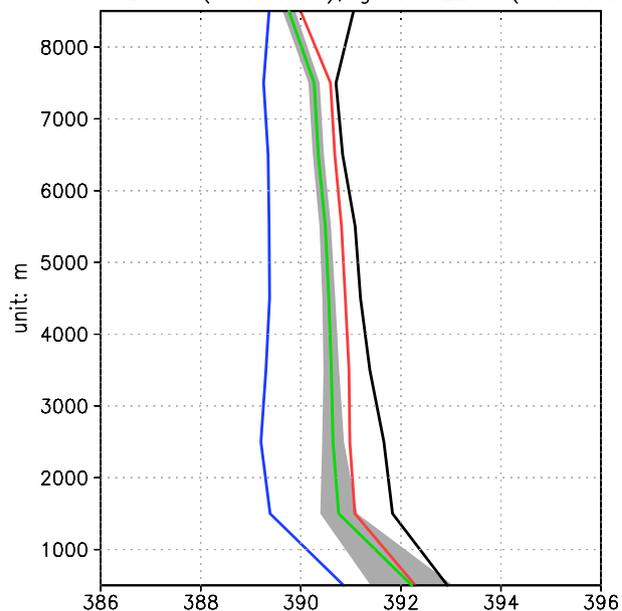
Boundary Conditions

LETKF can provide boundary conditions and concentration uncertainties to force regional models.

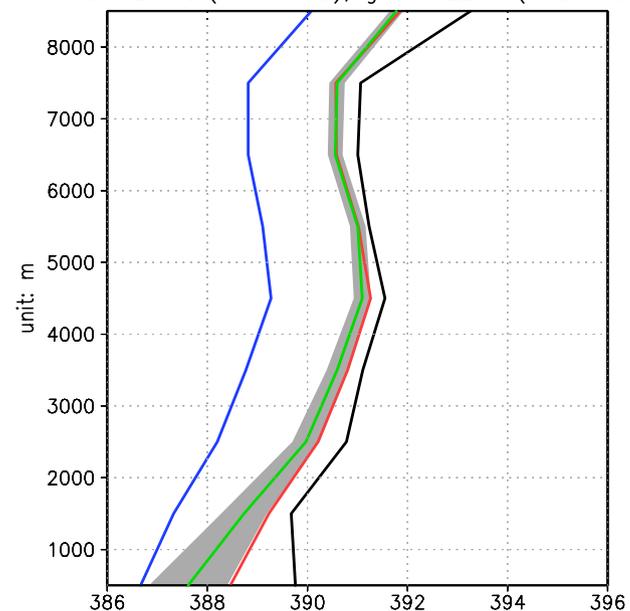
(a) RMS, obs(black),prior(blue)=2.39ppm
4D-Var(red)=0.57ppm,letkf(green)=0.89ppm



(b) two-year mean; black: obs; blue: prior(rms=1.94)
red: 4D-Var(rms=0.57); green: LETKF(rms=0.82)



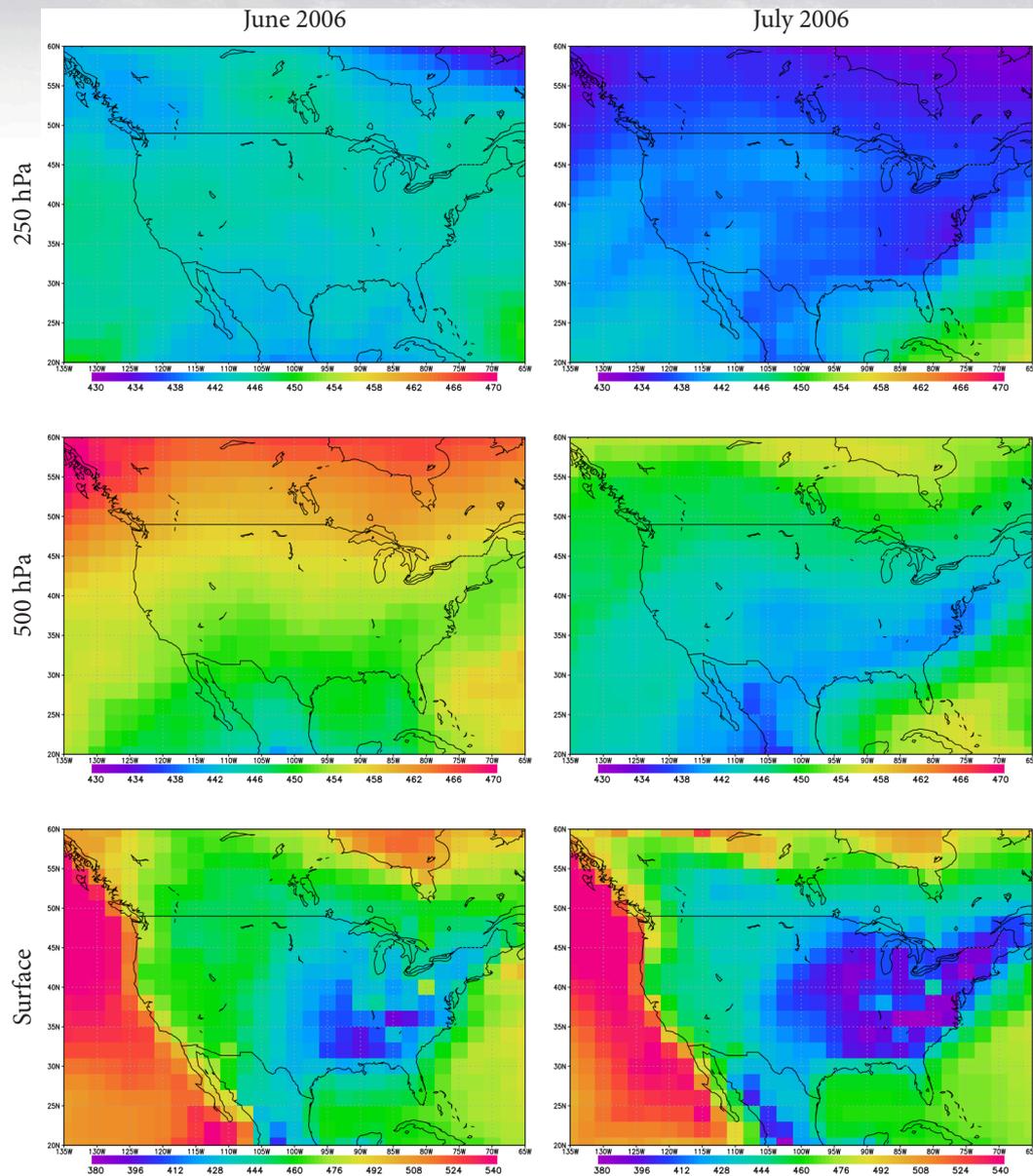
(c) 01June2011-31Aug2011; black: obs; blue: prior(rms=2.51)
red: 4D-Var(rms=0.73); green: LETKF(rms=1.01)





Carbonyl Sulfide

CMS-Flux has integrated COS fluxes building off of Kuai *et al*, 2014, 2015 using TES OCS measurements.



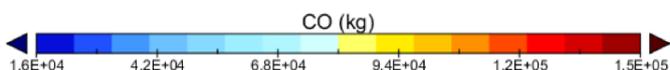
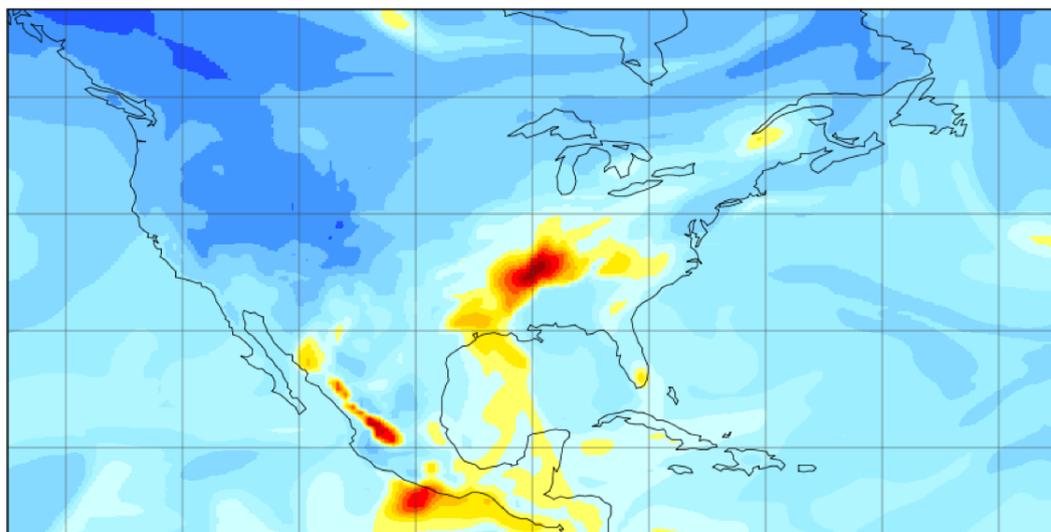


Active Species

CMS-Flux is based upon GEOS-Chem, which is a full chemistry and transport model.

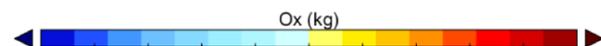
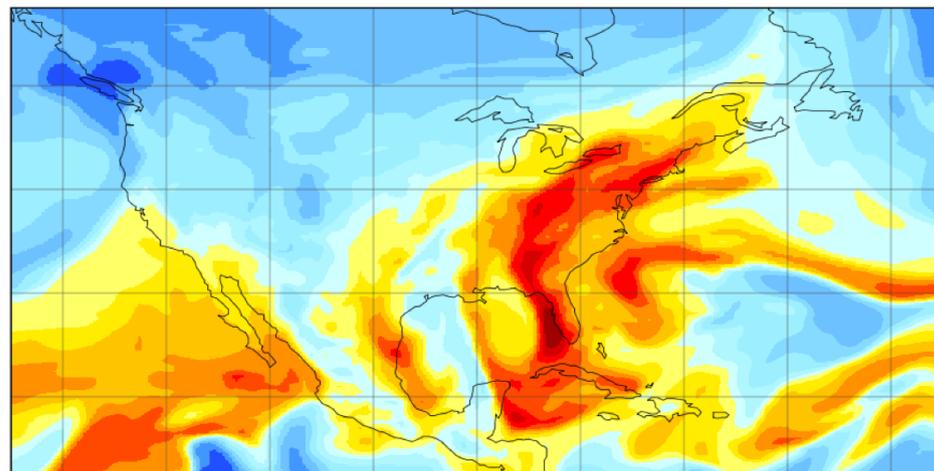
Developed a North America “nested” forward and adjoint mode (0.5x0.667) for both carbon and active species.

CO (650 hPa)

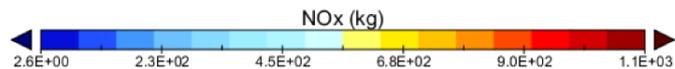
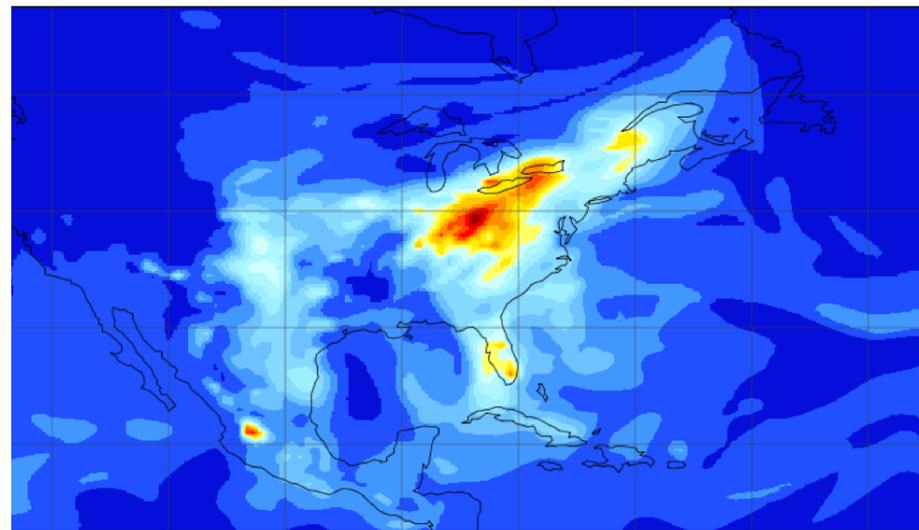


Data Min = 1.6E+04, Max = 1.5E+05

Ox (650 hPa)



NOx (650 hPa)



Data Min = 2.6E+00, Max = 1.1E+03

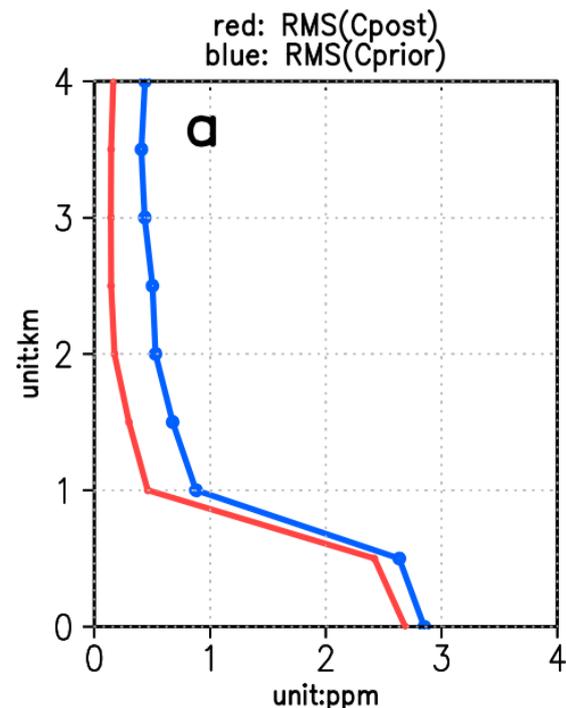


Attribution of improved fluxes

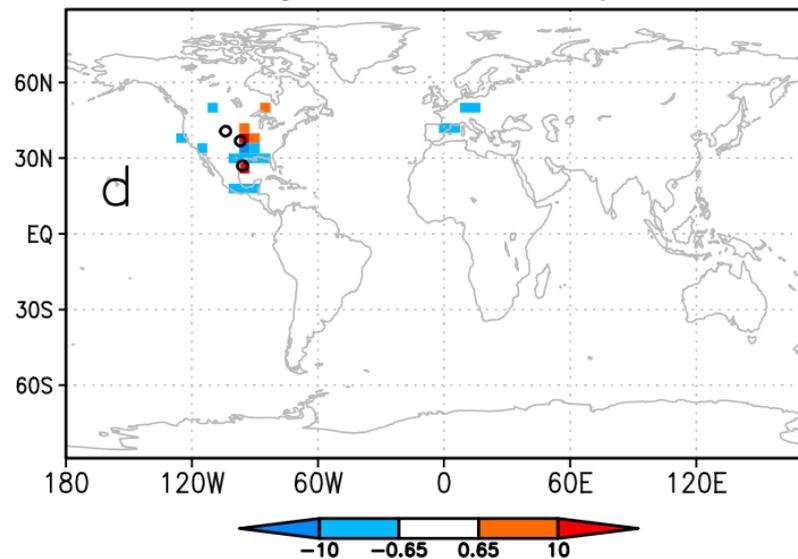
If predicted concentrations, e.g., CO₂, CO, are different from observed, what fluxes are implicated?

Liu and Bowman, GRL (2016) developed an adjoint methodology to attribute model-data differences to surface fluxes.

This approach can be applied to both Eulerian and Lagrangian techniques.



reduction of CO₂ errors (ppm²) from the changes of fluxes at each point





Summary

- CMS-Flux can simulate CO₂, CO, COS, (CH₄), and active chemistry (O₃, NO₂, etc.)
- LETKF can produce boundary conditions faster than our 4D-var approach.
 - Current driver is OCO-2 and MOPITT (1-2 month latency)
 - Working with Penn State (Lauvaux et al)
- Developing a NA nested forward and adjoint mode (0.25x0.325 or 0.5x0.667) for CO₂, CO, COS, and SIF.
 - Interested in using multi-constituents to separate flux and meteorological drivers of carbon variability using Liu and Bowman methodology.
 - Like to partner with CSU (Denning, Baker), Stanford (Berry)--Others?
- Active species, e.g., ozone, could be valuable to interpret CO₂ transport, e.g., Deng *et al*, 2015, and are interesting in their own right.
 - Not planning to pursue yet, depends on group interest.

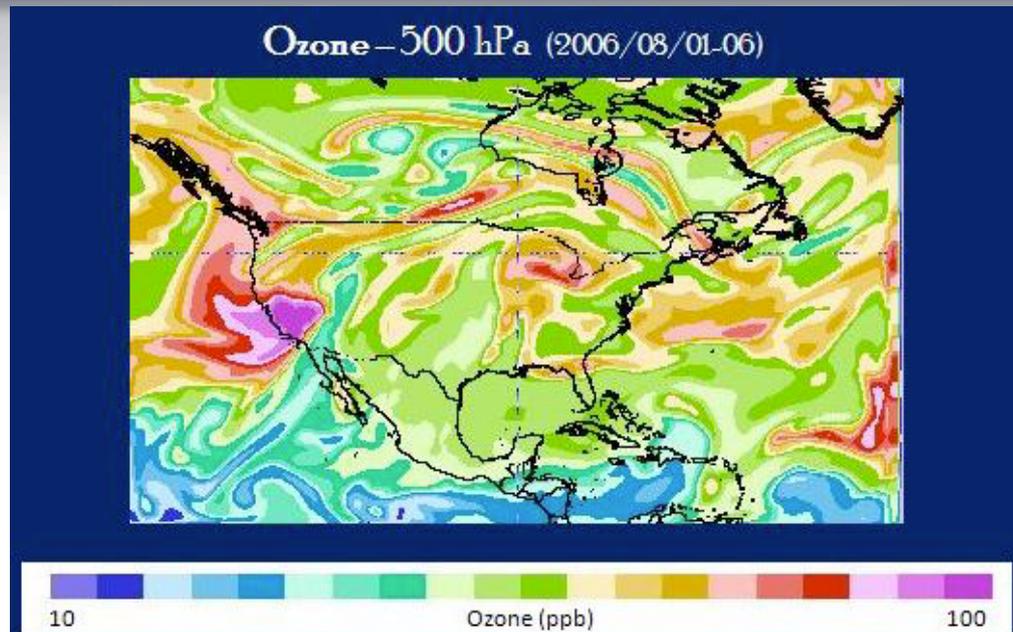


BACKUP

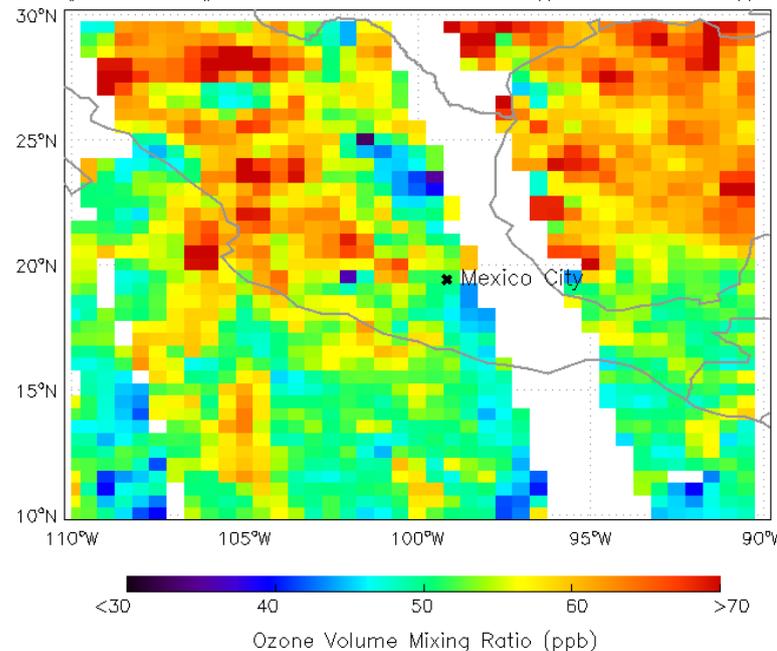


Tropospheric ozone

CMS-Flux is based upon GEOS-Chem, which is a full chemistry and transport model.



AIRS-OMI: Ozone, Pres=681.3 hPa, 2013-10-15 to 2013-10-17
Tot # Obs = 3429, # Good Obs = 2534, Min Val = 21.6 ppb, Max Val = 135.5 ppb



New AIRS/OMI ozone products from the TES team could provide a synoptic satellite observations



	truth	prior	4D-Var (land)	LETKF (land)	4D-Var (land+ocean)	LETKF (land+ocean)
North American Boreal	0.085	0.085±0.10	-0.08±0.09	-0.23±0.07	-0.08	-0.24±0.07
North American temperate	-0.88	-1.10±0.25	-0.75±0.19	-0.75±0.12	-0.79	-0.72±0.11
South American tropical	0.69	0.68±0.33	0.59±0.21	0.69±0.25	0.60	0.64±0.17
South American temperate	-0.37	-0.71±0.31	-0.31±0.21	-0.37±0.15	-0.32	-0.36±0.12
Northern Africa	-0.43	-0.20±0.21	-0.61±0.13	-0.39±0.16	-0.45	-0.36±0.12
Southern Africa	-1.73	-1.29±0.23	-1.62±0.18	-1.66±0.08	-1.63	-1.72±0.06
Eurasian Boreal	-0.38	-0.41±0.12	-0.55±0.09	-0.60±0.13	-0.58	-0.61±0.13
Eurasian Temperate	-0.63	-0.69±0.18	-0.41±0.22	-0.41±0.13	-0.33	-0.39±0.13
Tropical Asia	-0.26	-0.29±0.29	-0.39±0.23	-0.41±0.18	-0.36	-0.30±0.14
Australia	-0.27	-0.24±0.13	-0.15±0.09	-0.14±0.12	-0.20	-0.18±0.09
Europe	-0.86	-1.02±0.21	-1.12±0.13	-1.08±0.11	-1.20	-1.14±0.11