



IWGGMS-14

# Precision, Accuracy, Resolution, and Coverage: A few insights from GOSAT and OCO-2

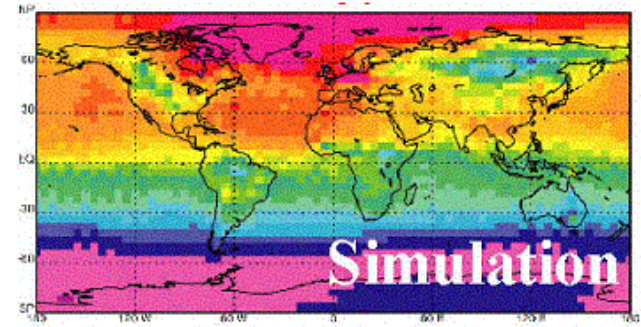
David Crisp and Annmarie Eldering,  
Jet Propulsion Laboratory, California Institute  
of Technology

May 8, 2018

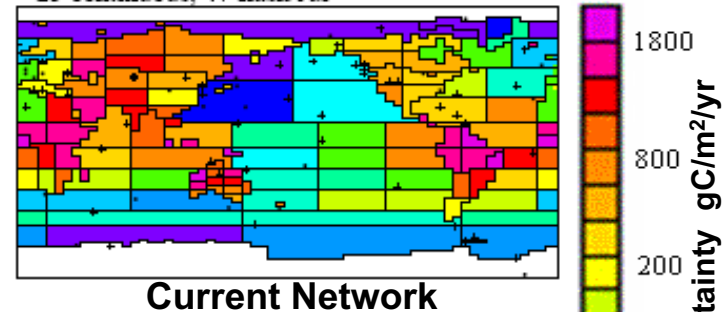


# From Crisp et al, IWGGMS-1 (2004)

- Space-based measurements of  $X_{CO_2}$  with precisions of 1–2 ppm (0.3 – 0.5%) will resolve
  - pole to pole  $X_{CO_2}$  gradients on regional scales
  - the  $X_{CO_2}$  seasonal cycle in the Northern Hemisphere
- Improve constraints on  $CO_2$  sources and sinks compared to the current knowledge
  - Continental scale flux uncertainties reduced below  $30 \text{ gC m}^{-2} \text{ yr}^{-1}$
  - Regional scale flux uncertainties reduced from  $>2000 \text{ gC m}^{-2} \text{ yr}^{-1}$  to  $< 200 \text{ gC m}^{-2} \text{ yr}^{-1}$

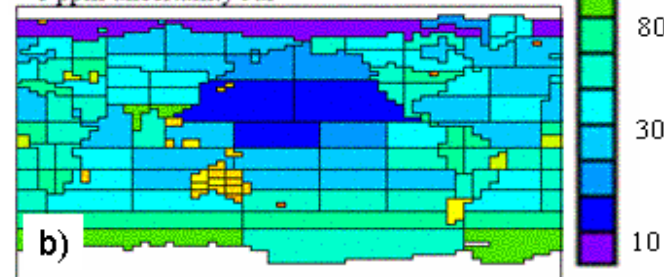


25 continuous, 47 flask Jul



Current Network

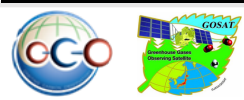
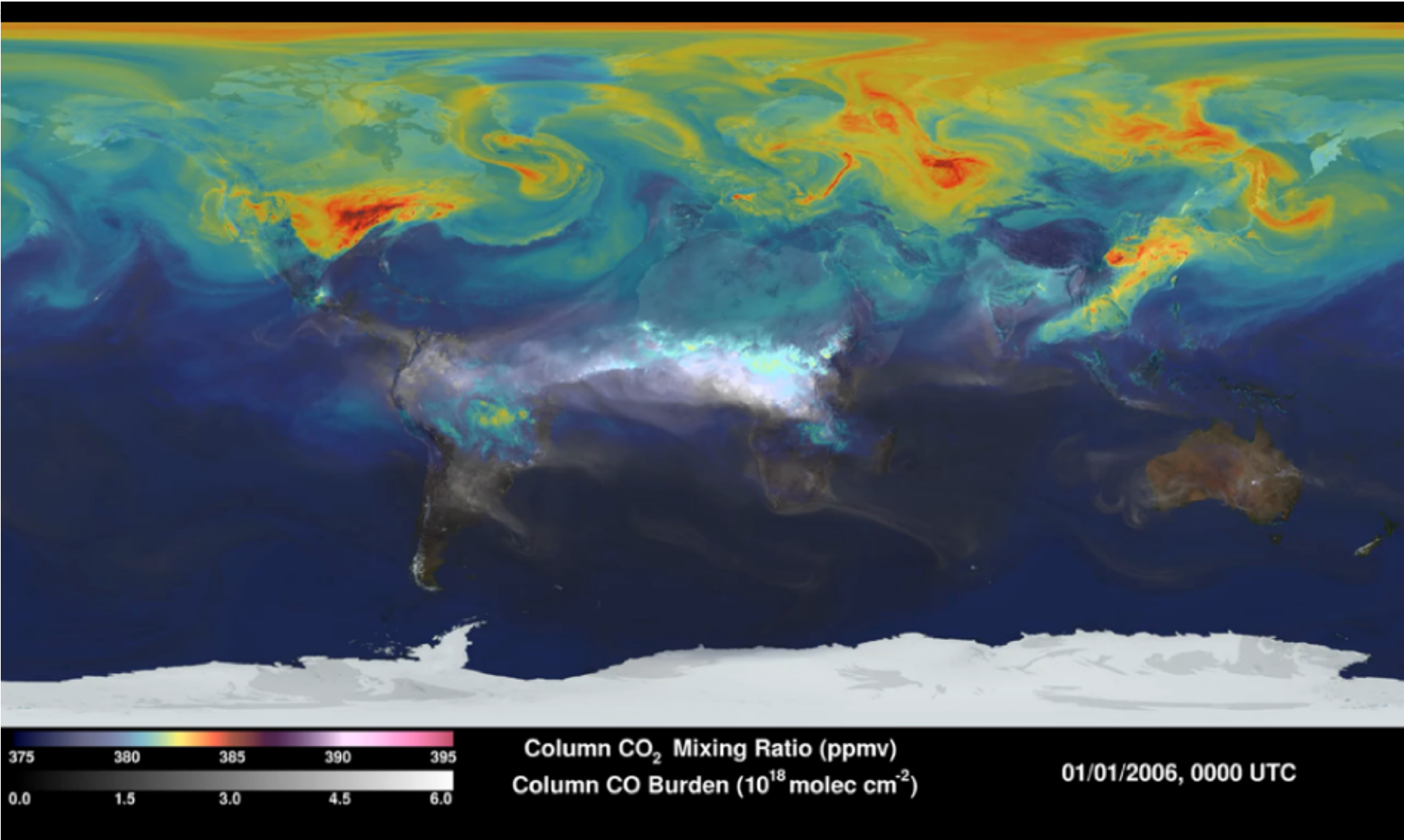
1 ppm uncertainty Jul



Space Based, 1 ppm

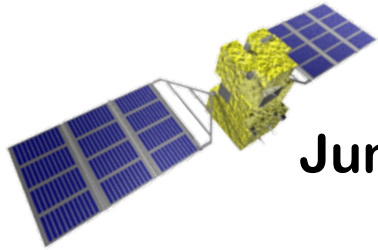


# But the Actual $X_{\text{CO}_2}$ Field Looked more Like This

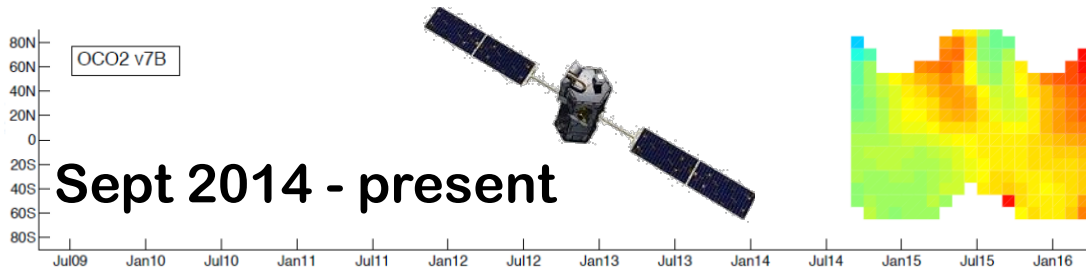
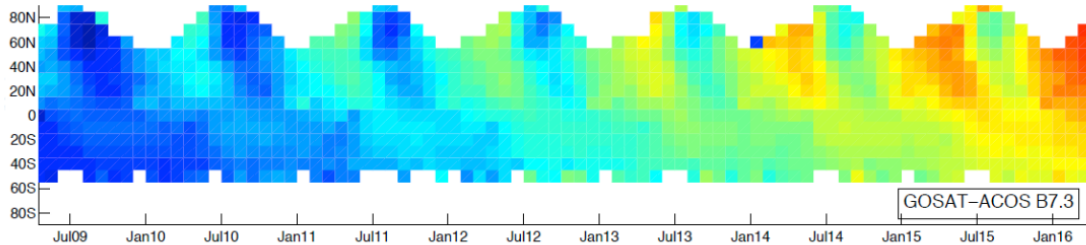




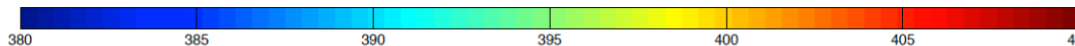
# So we Flew GOSAT and OCO-2



June 2009 - present



Sept 2014 - present

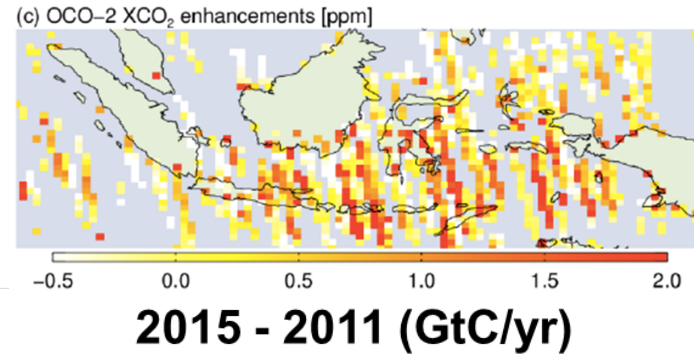
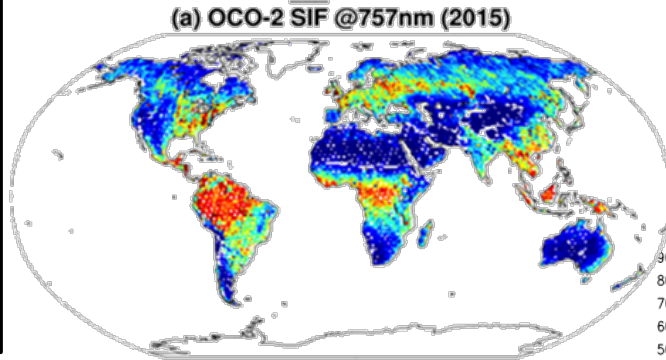
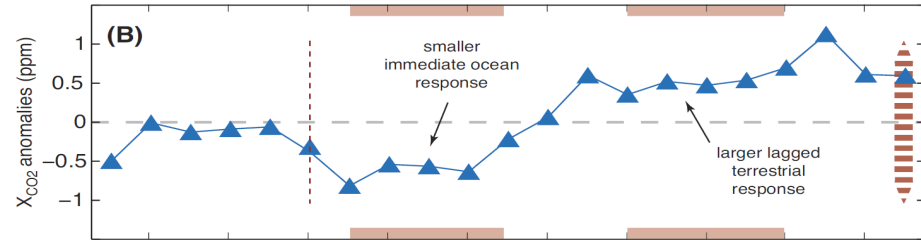
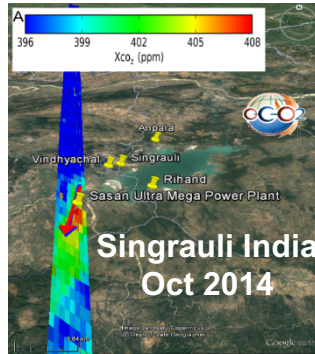
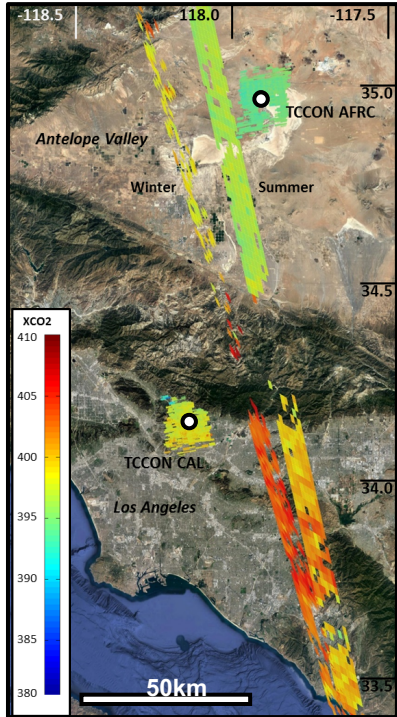


TCCON and other standards have been used to cross validate OCO-2 and GOSAT  $X_{CO_2}$  to extend the climate data record

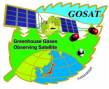
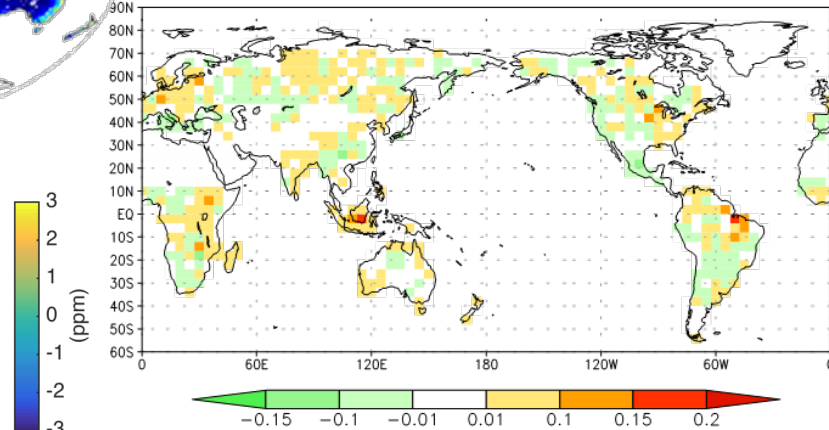
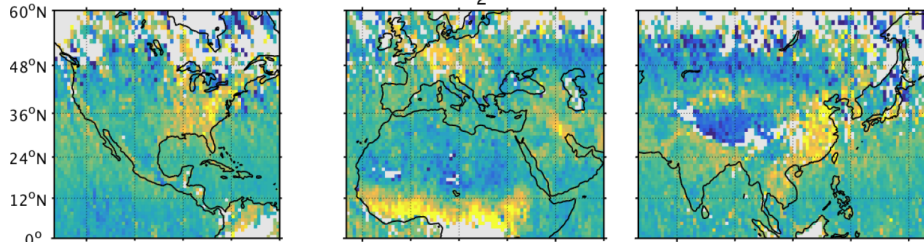
- The magnitude of differences between GOSAT-ACOS B7.3 and OCO2 v7r are within  $\pm 1$  ppm for overlap regions



# These Systems are Now Being Used to Study the Carbon Cycle



OCO-2 mean XCO<sub>2</sub> anomalies, 2014-2016





# Fast Forward to 2015: COP21



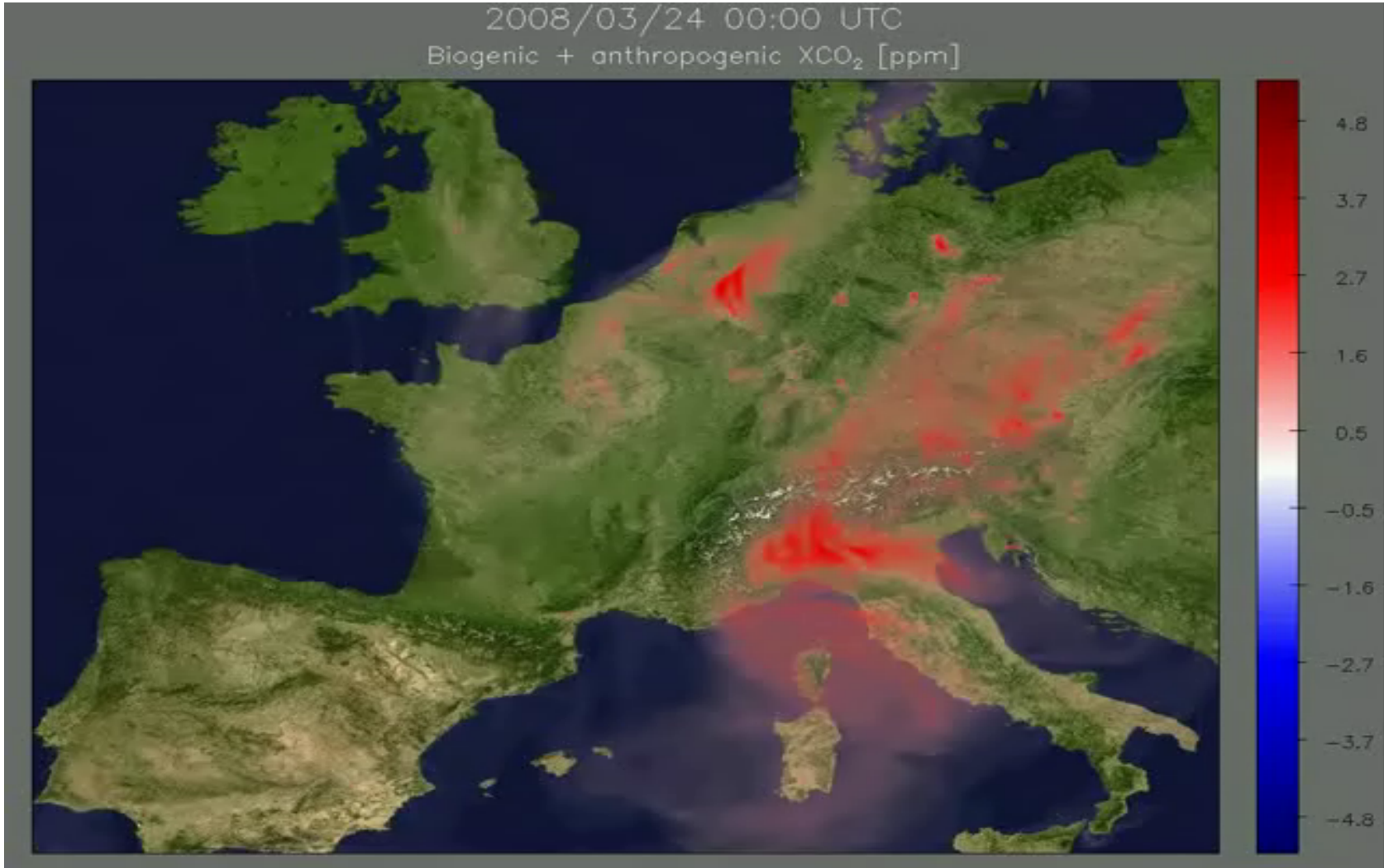
## To support the Paris Agreement:

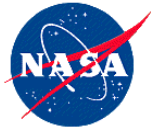
- The overall goal is to develop a sound, scientific, measurement-based approach that:
  - reduces uncertainty of **national emission inventory reporting**,
  - identifies large and additional emission reduction opportunities
  - provides nations with timely and quantified guidance on progress towards their emission reduction strategies and pledges (Nationally Determined Contributions, NDCs)
- In support of these efforts, atmospheric measurements of greenhouse gases from satellites could
  - Improve the frequency and accuracy of inventory updates for nations not well equipped for producing reliable inventories, and
  - help to “close the budget” by measurement over ocean and over areas with poor data coverage
- **We now have strong support, but new marching orders**





# Anthropogenic Emissions



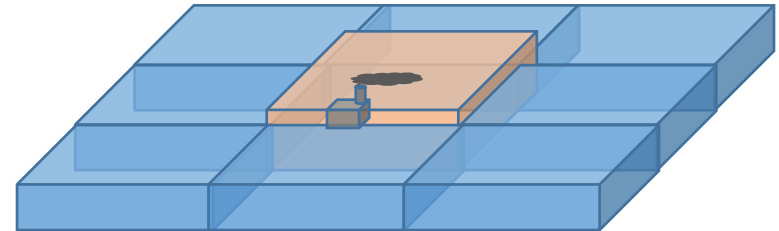


# Compact Source Uncertainties Drive Precision

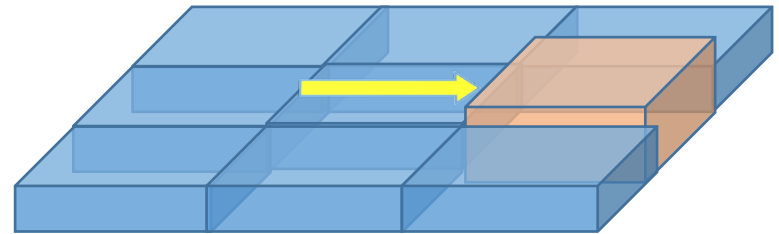
- For emission sources that are smaller than the footprint size, the minimum detectable mass or mass change depends on instrument precision ( $\Delta X_{CO_2}$  or  $\Delta X_{CH_4}$ ) and footprint area,  $A$ .
- The minimum detectable flux change depends on precision, the effective wind speed at the emission level and the footprint's cross section in the direction of the prevailing winds.

$$F_{min} = 2 \cdot u \cdot \Delta M_{CO_2}(\Delta X_{CO_2_{min}}) / L$$

- Detection limits increase with random error, footprint size, and wind speed



$$\Delta M (1ppm X_{CO_2}) = 0.016 \text{ kT/km}^2$$



Flux (MTCO<sub>2</sub> /year) vs Footprint area and single sounding precision for a 5 km/hour wind

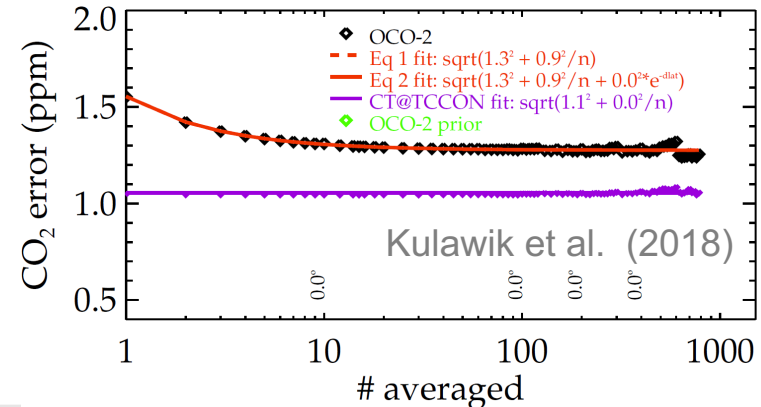
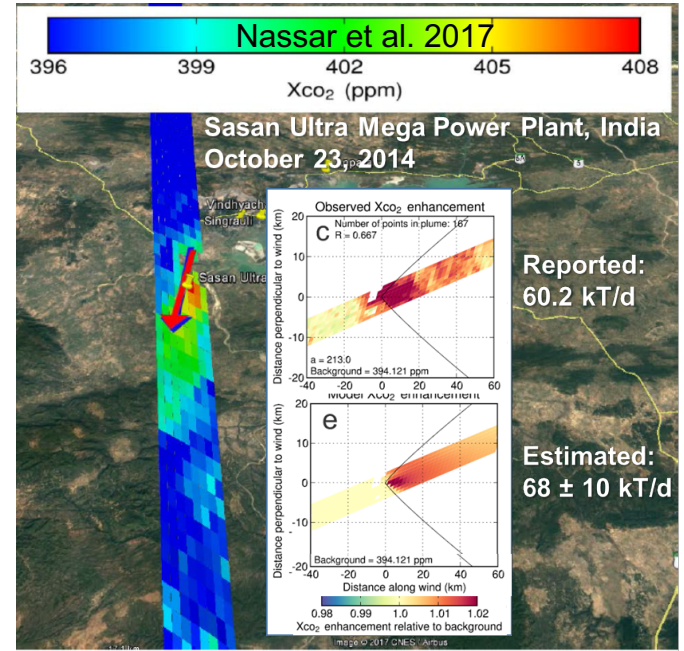
	DXCO2(ppm)				
Area (km <sup>2</sup> )	0.25	0.5	1	2	4
1	0.341	0.683	1.37	2.7	5.47
2	0.483	0.966	1.93	3.86	7.73
4	0.685	1.37	2.7	5.47	10.9
10	1.08	2.16	4.33	8.66	17.3
50	2.41	4.83	9.66	19.3	38.6
85	3.14	6.29	12.6	25.1	50.4
1800	14.4	28.9	57.8	115	231





# Emissions from Compact Sources: plume models

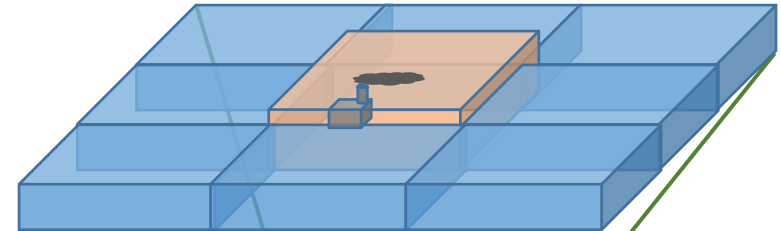
- The OCO-2 (0.5 ppm single sounding random errors) can clearly detect plumes that fall along its ground track
- Plume imaging methods can exploit information from multiple footprints to reduce uncertainties if
  - biases are not spatially correlated
  - footprints within the plume can be discriminated from the background
    - Proxies (NO<sub>2</sub>, CO) help for CO<sub>2</sub> plumes
- Averaging typically reduces  $X_{\text{CO}_2}$  anomaly uncertainties (and thus flux uncertainties) by less than a factor of 2
- Wind speed and  $X_{\text{CO}_2}$  uncertainties contribute comparable flux uncertainties



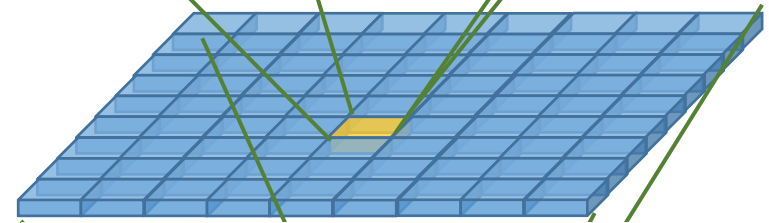


# Low Bias Critical for Estimating Fluxes over Extended Areas – like Nations

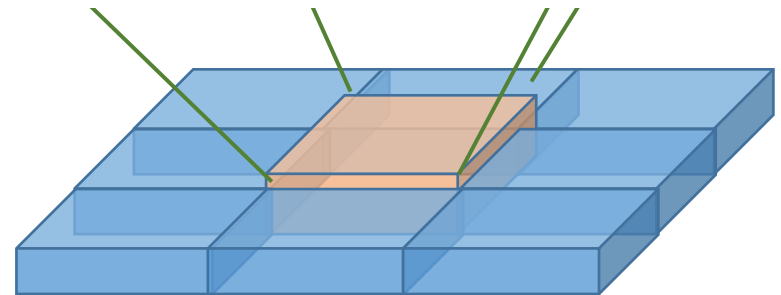
- Over large areas ( $> 10,000 \text{ km}^2$ ), random errors average out, but biases are more critical
  - A persistent, 1 ppm  $X_{\text{CO}_2}$  bias between 2 adjacent  $1^\circ \times 1^\circ$  latitude areas corresponds to a 0.2 Mt  $\text{CO}_2$  error
  - A 1 ppm bias between two average-sized countries France, with an area of  $643,801 \text{ km}^2$ ) grows to 10 Mt  $\text{CO}_2$
- If our average-sized country is roughly equidimensional, and we assume a mean 10 m/sec wind over this area, this corresponds to a flux error of **3400 Mt $\text{CO}_2$ /year**
  - This is about 10 times the annual fossil fuel  $\text{CO}_2$  emissions from France
- Clearly, biases this large are unacceptable for informing fossil fuel inventories



$$\Delta M (1 \text{ ppm } X_{\text{CO}_2}) = 0.016 \text{ kT/km}^2$$



$$\Delta M (1 \text{ ppm } X_{\text{CO}_2}) = 0.2 \text{ MT}/(1^\circ \times 1^\circ)$$

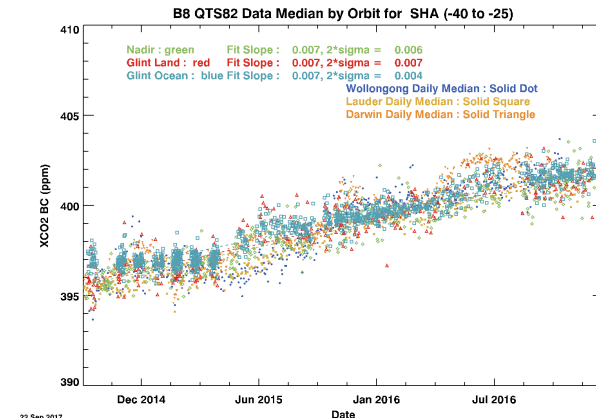
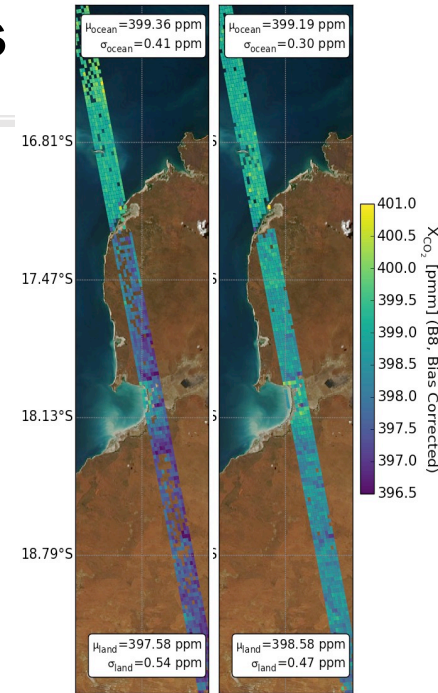


$$\Delta M (1 \text{ ppm } X_{\text{CO}_2}) = 10 \text{ MT}/644,000 \text{ km}^2$$



# Mitigating the Impact of Biases

- Fortunately, only spatially and temporally coherent biases operating on the scale of interest can introduce flux errors as large as the one illustrated on the previous slide
  - Biases that are spatially and temporally invariant do not introduce large flux errors, because fluxes are proportional to the product of the anomaly amplitude and the wind,  $F \propto u \times \Delta X_{CO2}$
  - Small scale biases often average out
- Some processes can introduce spatially coherent biases
  - surface pressure, air mass dependence, optically-thin clouds and/or aerosols, surface albedo, ...)
- Many of these processes can be identified and mitigated through a well designed calibration/validation program



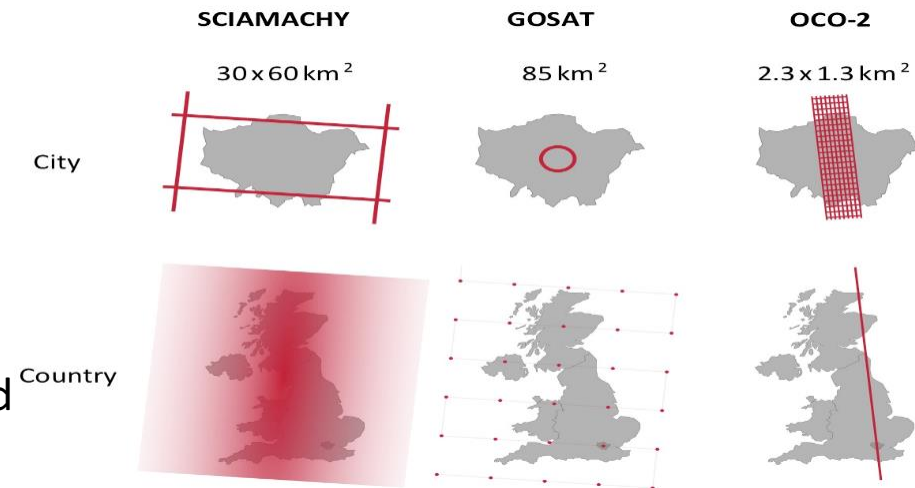
22 Sep 2017





# Resolution and Coverage: Sampling Strategy

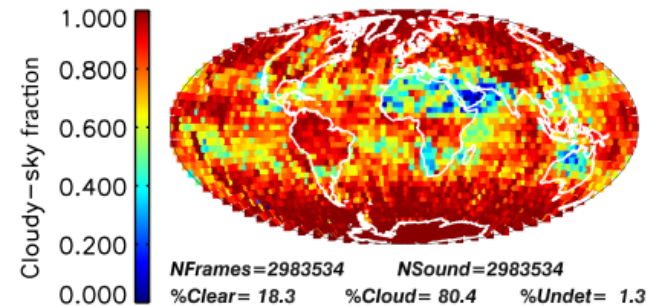
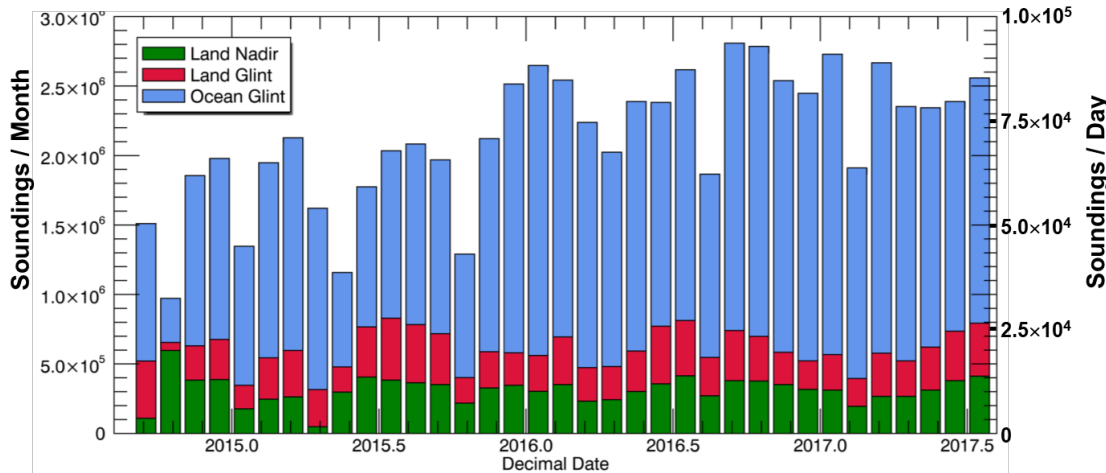
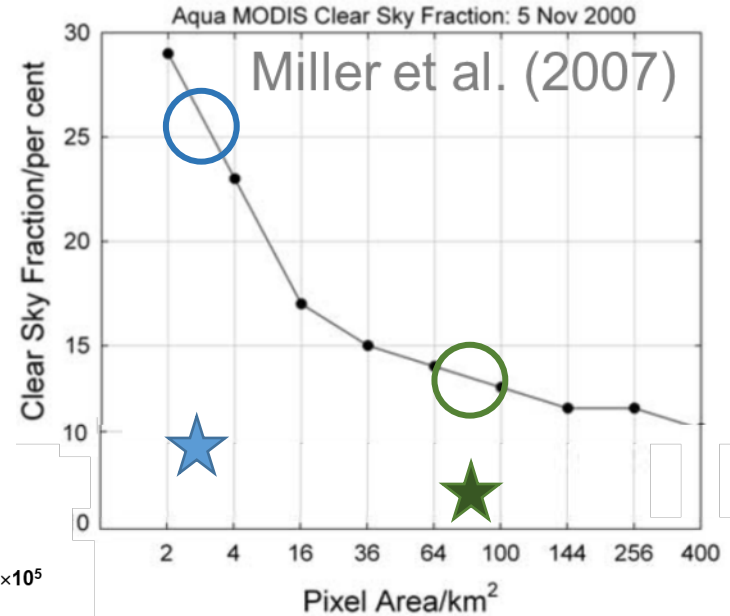
- The resolution and coverage of space based greenhouse gas observations is limited by the spatial sampling strategy adopted
  - The large (30 km x 60 km) footprints used by SCIAMACHY provided good coverage of the Earth, but most were contaminated by clouds or aerosols
  - Systems that collect spatially-isolated sample (GOSAT, Feng Yun 3D, Gaofen-5) cannot resolve localized emissions (plumes) as well as their background
  - Continuous “stripes” like those collected by OCO-2, TanSat, and MicroCarb provide high spatial resolution along a narrow track but there are large distances between sample tracks
  - Systems that cannot observe the glint spot over the full range of latitudes cannot collect observations over the oceans, which cover 70% of the surface of the Earth
  - Passive solar systems can only collect observations while the sun is up





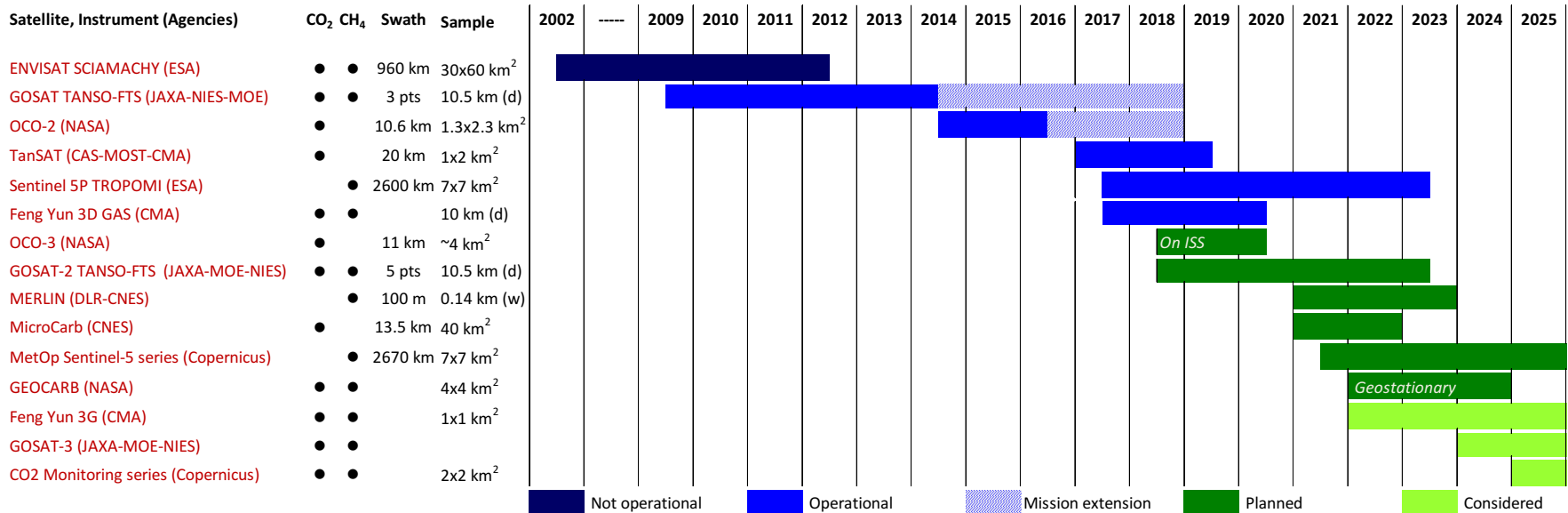
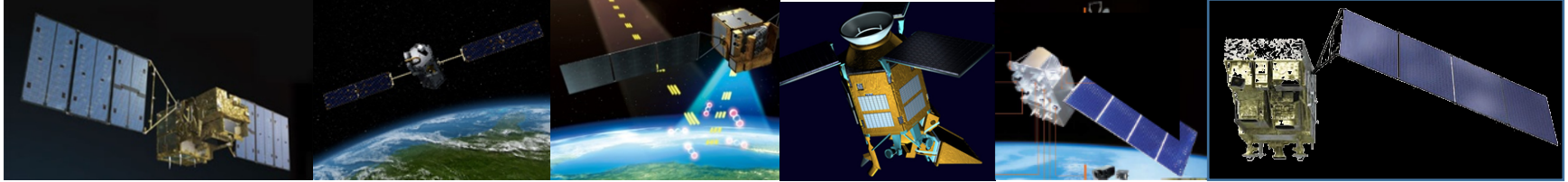
# Resolution and Coverage: Clouds!

- Early in the evolution of the OCO and GOSAT missions, optically thick clouds were identified as significant limitation on coverage
- Based on MODIS cloud studies, a small footprint was adopted for OCO (and OCO-2) to mitigate this issue



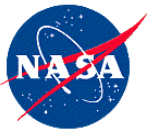


# Improving Resolution and Coverage: Combining Data from the Emerging Fleet



- A broad range of GHG missions will be flown over the next decade.
- We could improve resolution and coverage by combining their results





# Improving Resolution and Coverage: Dedicated Greenhouse Gas Constellations

- The coverage, resolution, and precision requirements could be achieved with a constellation that incorporates
  - A constellation of 3 (or more) satellites in **LEO** with
    - A broad ( $> 200$ ) km swath
    - A small mean footprint size  $< 4 \text{ km}^2$
    - A single sounding random error near 0.5 ppm and vanishingly small regional scale bias ( $< 0.1 \text{ ppm}$ ) over  $> 80\%$  of the sunlit hemisphere
    - One (or more) satellites carrying ancillary sensors (CO, NO<sub>2</sub>, CO<sub>2</sub> and/or CH<sub>4</sub> Lidar)
  - A constellation with 3 (or more) satellites in **GEO** to monitor diurnally varying processes (e.g. diurnal variations in the biosphere, diurnal changes in anthropogenic emissions, SIF)
    - Stationed over Europe/Africa, North/South America, and East Asia
- This constellation could be augmented with one or more **HEO** satellites to monitor carbon cycle changes in the high arctic





# Tools Needed to Meet New Requirements

- Sensors with improved precision, spatial resolution, and coverage
  - Improved instrument calibration accuracy and stability
  - Add hoc constellation consisting of the satellites in the “program of record”
  - Dedicated LEO and Geo GHG constellations
- Improved remote sensing retrieval algorithms
  - More accurate description of gas absorption and aerosol scattering
  - Optimized to more fully exploit the information content of solar GHG spectra
- More comprehensive and accurate validation standards
  - Expand and improve ground based in situ, TCCON, AirCore/Aircraft
- Improved atmospheric inversion models
  - Higher spatial resolution
  - More accurate description of both horizontal and vertical transport
  - More complete assimilation of ground-based, aircraft, and space based data
  - Methods to validate estimated fluxes on local, national, and regional scales