

# Sensitivity of CO<sub>2</sub> Flux Inversions to the Temporal and Spatial Distribution of Observations

Brendan Byrne, Dylan Jones, Kim Strong

Department of Physics, University of Toronto

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# Introduction

- ▶ Question
  - ▶ How do differences in spatio-temporal observational coverage affect CO<sub>2</sub> flux estimates?
- ▶ Plan
  - ▶ Use GEOS-Chem adjoint model to look at sensitivity of observations to surface fluxes spatially and temporally for each season

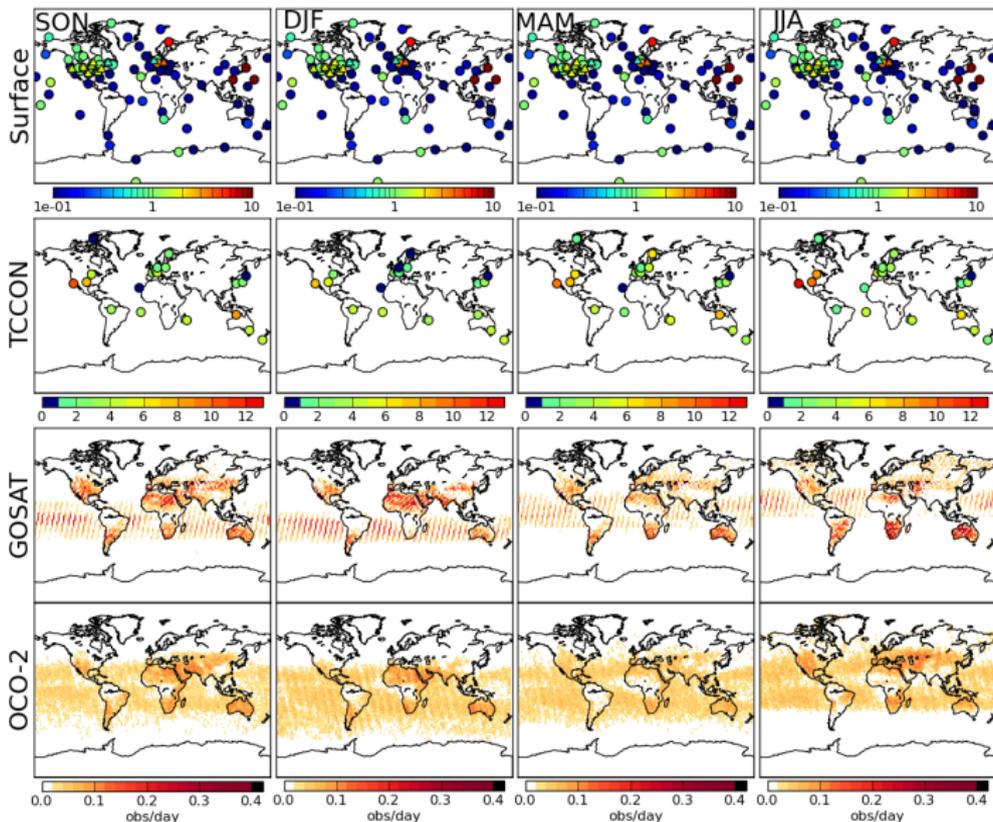
# Observing Systems

- ▶ **Surface:** Network of surface and tower sites. ObsPack PROTOTYPE package contains 190 data sets from 20 labs.
- ▶ **TCCON:** Network of  $>20$  ground-based spectrometers which make measurements of solar spectra to retrieve  $XCO_2$ .
- ▶ **GOSAT:** TANSO-FTS infers  $XCO_2$  from reflected insolation. Glint mode over ocean, nadir over land.
- ▶ **OCO-2:** Infers  $XCO_2$  from reflected insolation. Alternates glint and nadir modes.

# Observations

- ▶ Use ideal set of observations:
  - ▶ **Surface**: Prototype surface and tower observations (similar selection to CarbonTracker). Fixed observations from SON 2011 to each season so that identical observations occur for site for each season.
  - ▶ **TCCON**: Observations from years with most observations for each season at each site.
  - ▶ **GOSAT**: QF=0 (ACOS, Sept 2011 - Aug 2012)
  - ▶ **OCO-2**:  $WL \leq 10$ , QF=0 (ACOS, Sept 2014 - Aug 2015)
- ▶ Observations times are aggregated into  $2 \times 2.5$  degree spatial grids and 1 hour time steps, such that there can only be one observation for a given grid-cell over a given time-step.

# Observation Density (number per day)



## Method: Calculating Sensitivities

- ▶ We relate variations in observed CO<sub>2</sub> at the locations and times of the observations by taking the derivative of the following sensitivity function with respect to the fluxes:

$$J = \sum_{i=1}^N \left[ \frac{\text{CO2}_i}{\text{Air}_i} \right] \cdot 10^6 \quad (\text{ppm})$$

CO<sub>2</sub> = mols of CO<sub>2</sub>

Air = mols of Air

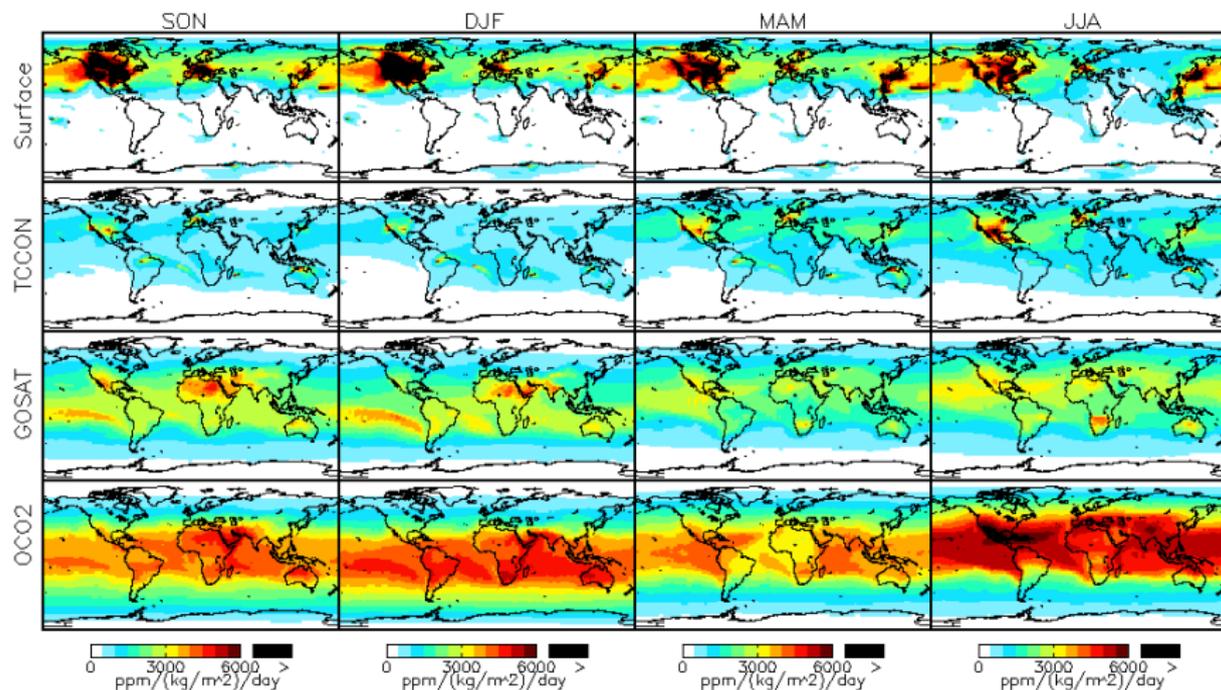
N = number observations (over a season)

- ▶ The sensitivity of an observation to surface fluxes is given by,

$$\gamma_{i,j} = \sum_t \frac{\partial J}{\partial f_{i,j,t}}$$

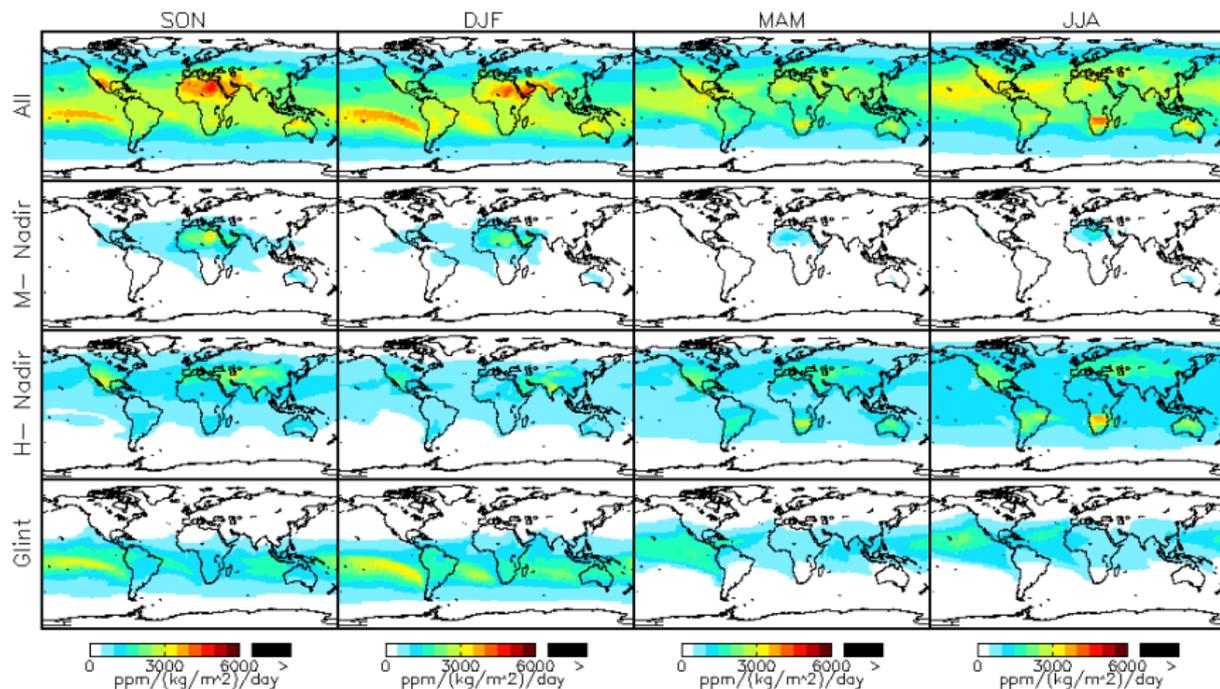
f = surface fluxes

# Sensitivities



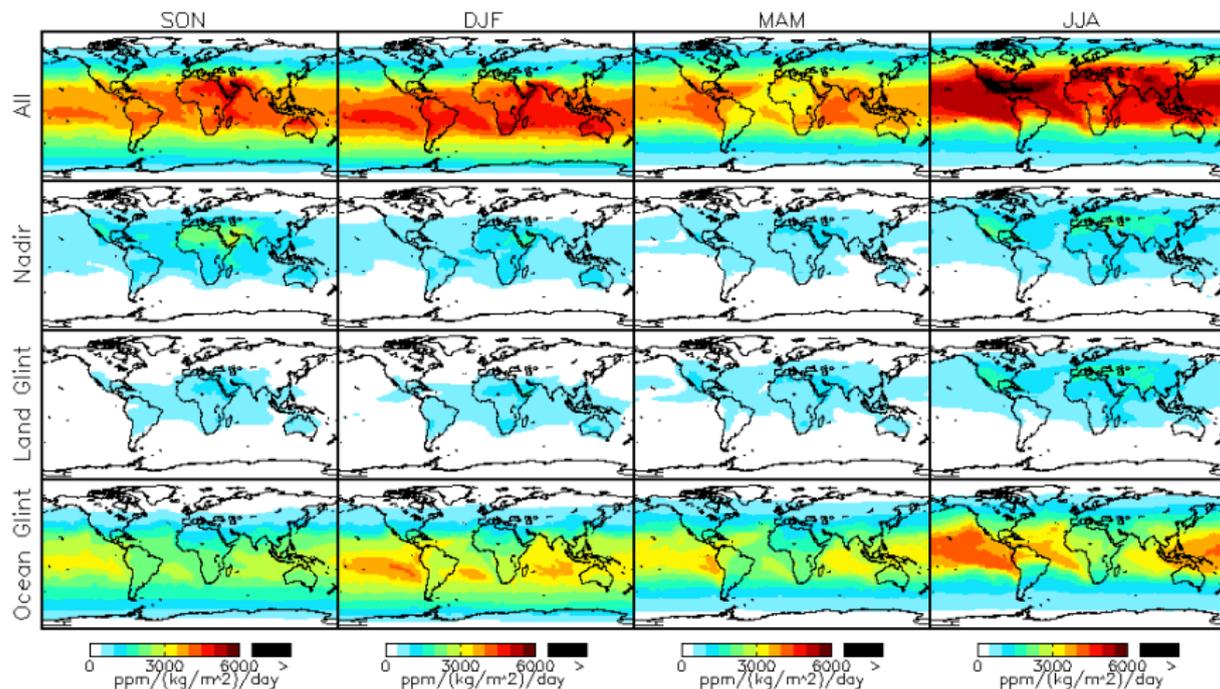
- ▶ Surface obs highest over most of northern extratropics
- ▶ OCO-2 highest in tropics and southern hemisphere

# Sensitivities: GOSAT Observing Modes



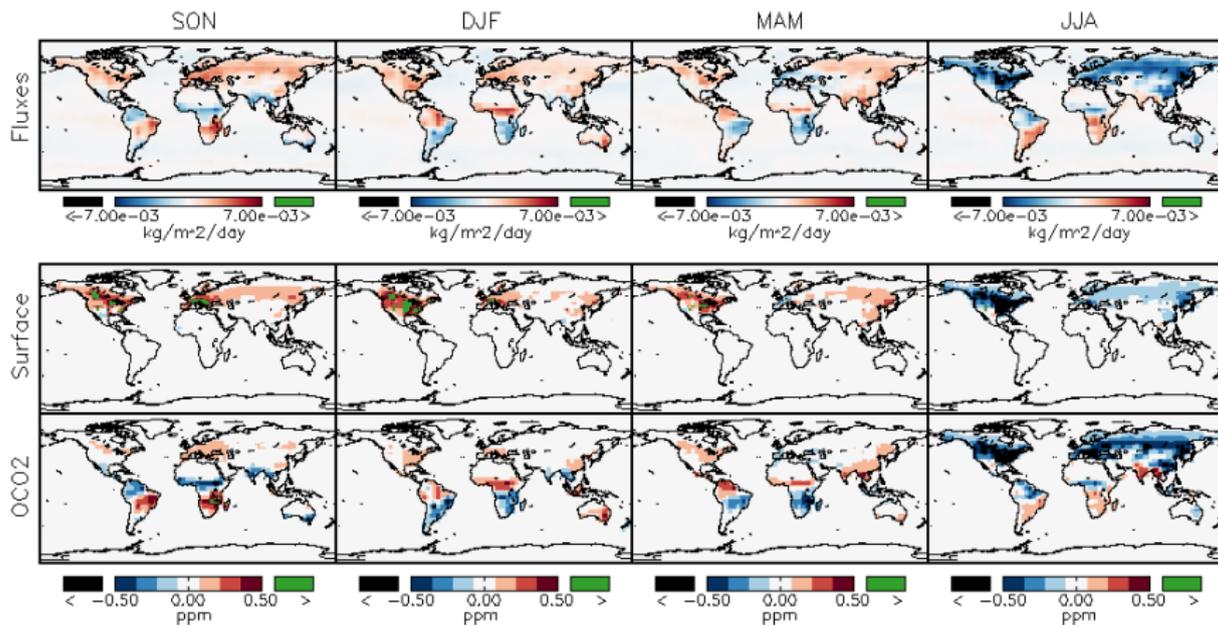
- ▶ Ocean glint and H-Gain nadir have similar importance
- ▶ Spatial distribution of ocean glint varies seasonally

# Sensitivities: OCO-2 Observing Modes



- ▶ Ocean glint dominates
- ▶ Land glint and nadir are similar

# Contribution: Sensitivities $\times$ Flux



- ▶ Surface observations are sensitive to North American and European seasonal cycle
- ▶ OCO-2 is sensitive to tropical seasonal cycle and northern extratropic in JJA

# Conclusions

- ▶ OCO-2 has highest sensitivity for most of globe over all seasons.
  - ▶ provides the highest sensitivity to fluxes across Eurasia in JJA.
  - ▶ captures the seasonal cycle in the tropics and southern subtropics.
- ▶ Surface observations have highest sensitivity to northern hemisphere for SON, DJF, MAM.
  - ▶ captures the seasonal cycle in North America and Europe.
- ▶ Combining OCO-2 and the surface data should enable us to better capture the global seasonal cycle and the inter-hemispheric gradient in CO<sub>2</sub>.
- ▶ The substantial sensitivity differences between observation systems means careful consideration is required in comparing inversion flux estimates.

# Acknowledgments

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- ▶ ACOS GOSAT data were produced by the ACOS/OCO-2 project at the Jet Propulsion Laboratory, California Institute of Technology, and obtained from the JPL website, [co2.jpl.nasa.gov](http://co2.jpl.nasa.gov).
- ▶ GOSAT Project for acquiring these spectra.
- ▶ OCO-2 data were produced by the OCO-2 project at the Jet Propulsion Laboratory, California Institute of Technology, and obtained from the OCO-2 data archive maintained at the NASA Goddard Earth Science Data and Information Services Center.
- ▶ Cooperative Global Atmospheric Data Integration Project. 2013, updated annually. Multi-laboratory compilation of atmospheric carbon dioxide data for the period 2000-2012 (obspack\_co2\_1\_PROTOTYPE\_v1.0.4b\_2014-02-13). Compiled by NOAA Global Monitoring Division: Boulder, Colorado, U.S.A. Data product accessed at <http://dx.doi.org/10.3334/OBSPACK/1001>.
- ▶ TCCON data were obtained from the TCCON Data Archive, hosted by the Carbon Dioxide Information Analysis Center (CDIAC) - [tcon.onrl.gov](http://tcon.onrl.gov).