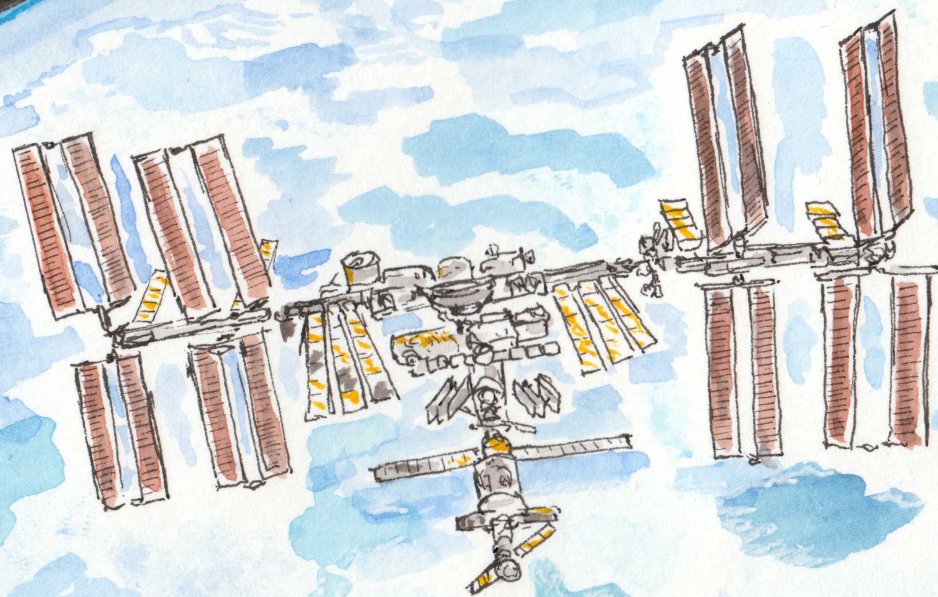
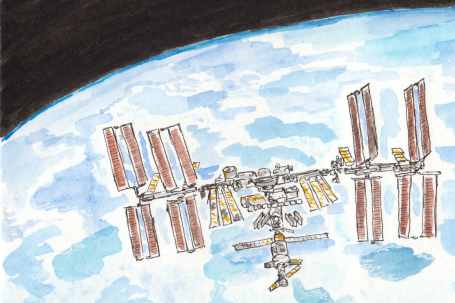


Urban fossil fuel CO₂ emissions from space: lessons learned from the OCO missions

Thomas Lauvaux¹, Sha Feng², Ruixue Lei², Tomohiro Oda³, Alexandre Danjou¹, Gregoire Broquet¹, Andrew Schuh⁴, Ryan Pavlick⁵, and Annmarie Elderling⁵



Orlando



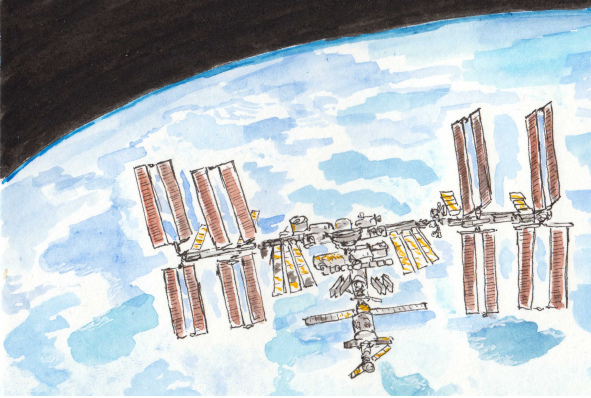
Urban CO₂ emissions from space

Major challenges related to urban emission quantification using XCO₂ measurements

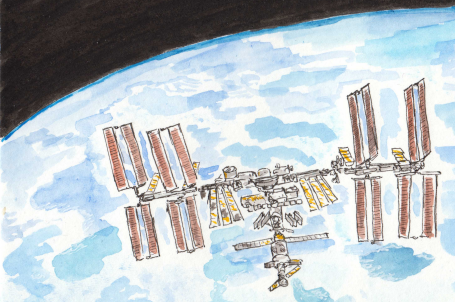
- Atmospheric model errors (varying with terrain complexity)
- Impact of the local vegetation (urban to rural gradients)
- Definition of spatial gradients from distant sources and sinks (background XCO₂)
- Measurement errors (esp. urban aerosols)
- Sampling density for long-term carbon budgets

Study presented today

Based on a selection of OCO-2 tracks near large metropolitan areas, we examined **large metropolitan areas in flat and complex terrain, over arid and vegetated zones, inland and near the shore**, with a state-of-the-art modeling system (WRF-Chem)



Transport model errors in flat and complex terrain



Urban CO₂ emissions from space: analysis of OCO-2 tracks

Flat terrain in arid climate: Riyadh, Saudi Arabia

A first look at urban XCO₂ plumes

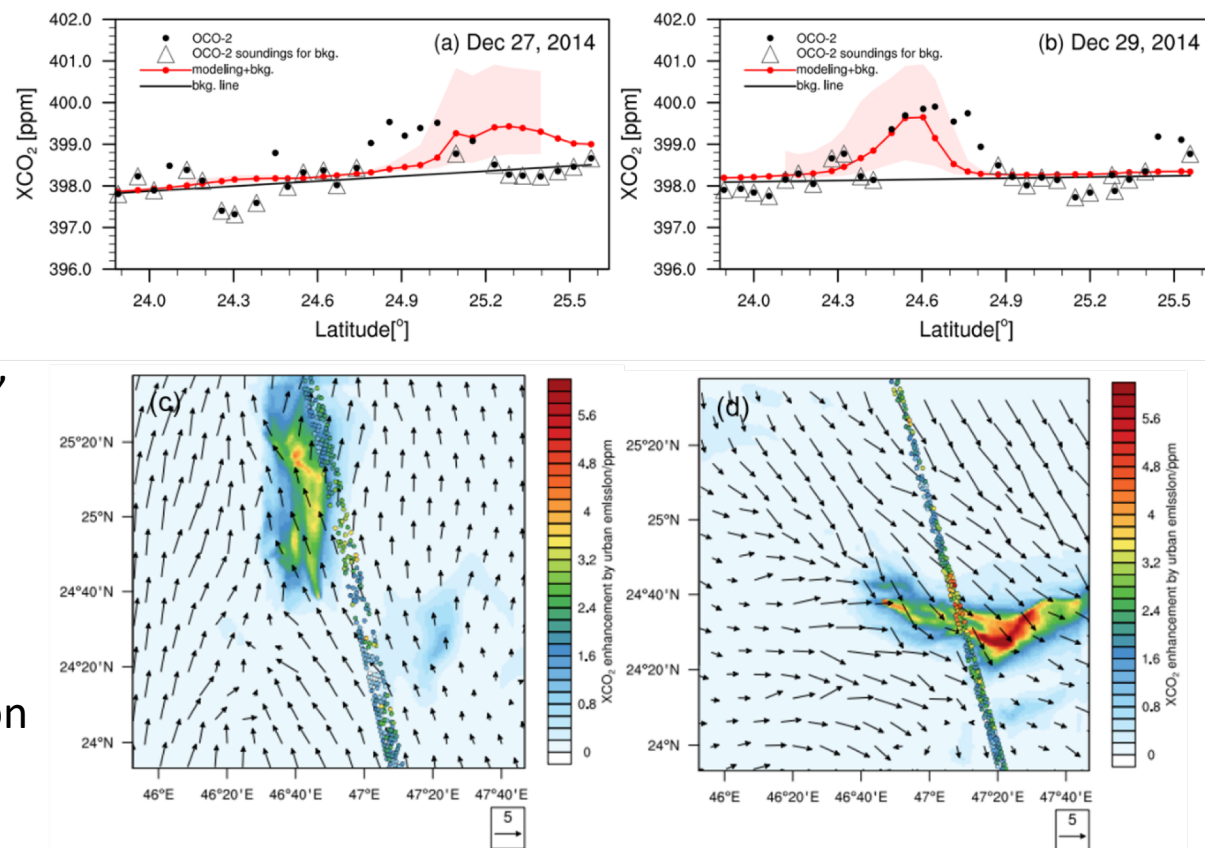
- Selection of OCO-2 tracks near large metropolitan areas
- First selected cases: simple topography, low vegetation, clear sky

Analysis of local XCO₂ enhancements

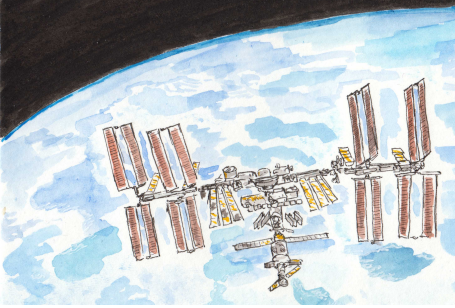
- WRF-Chem simulation at high resolution (1km) coupled to ODIAC emissions
- Smoothing (1-s averages) and filtering (QF=0)

First conclusions (city: Riyadh, Saudi Arabia)

Overall agreement between simulated and observed XCO₂ enhancements, with displacement of the plume structures (wind speed/direction errors)

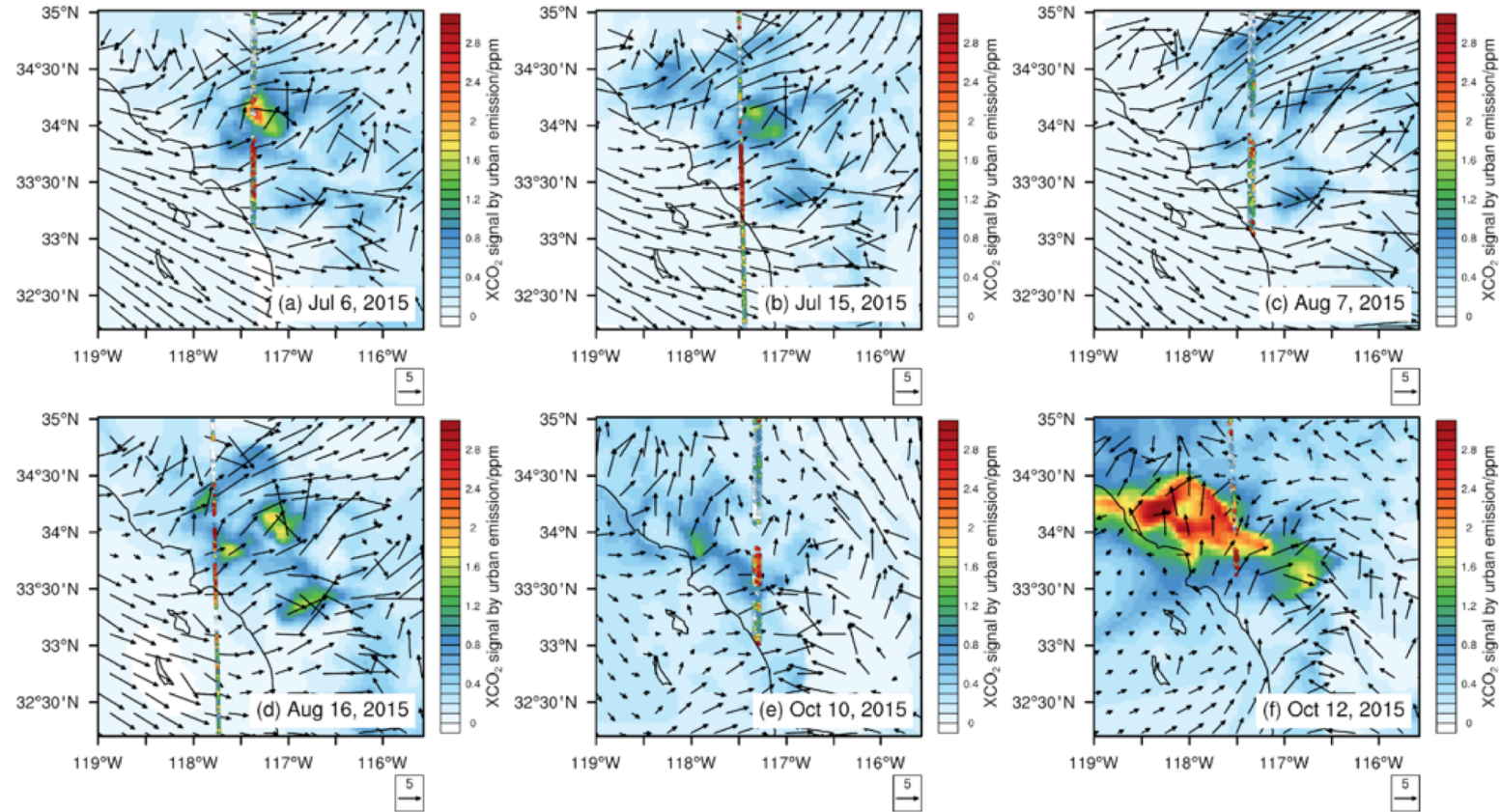


Comparisons of modeled and observed ffX_{CO_2} enhancements by the OCO-2 data on 27 and 29 December 2014 at 10 UTC over Riyadh, Saudi Arabia



Urban CO₂ emissions from space: analysis of OCO-2 tracks

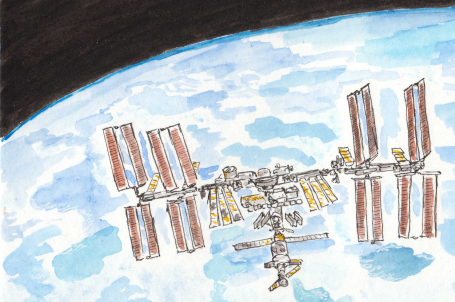
Complex topography near the shore: Los Angeles, CA



Comparisons of modeled and observed ffX_{CO_2} enhancements by the OCO-2 data over Los Angeles, CA

Ye et al., 2020; JGR-Atmos.

Complexity of the mesoscale circulation over the LA basin responsible for large differences in the observed XCO₂ enhancements



Urban CO₂ emissions from space: analysis of OCO-2 tracks

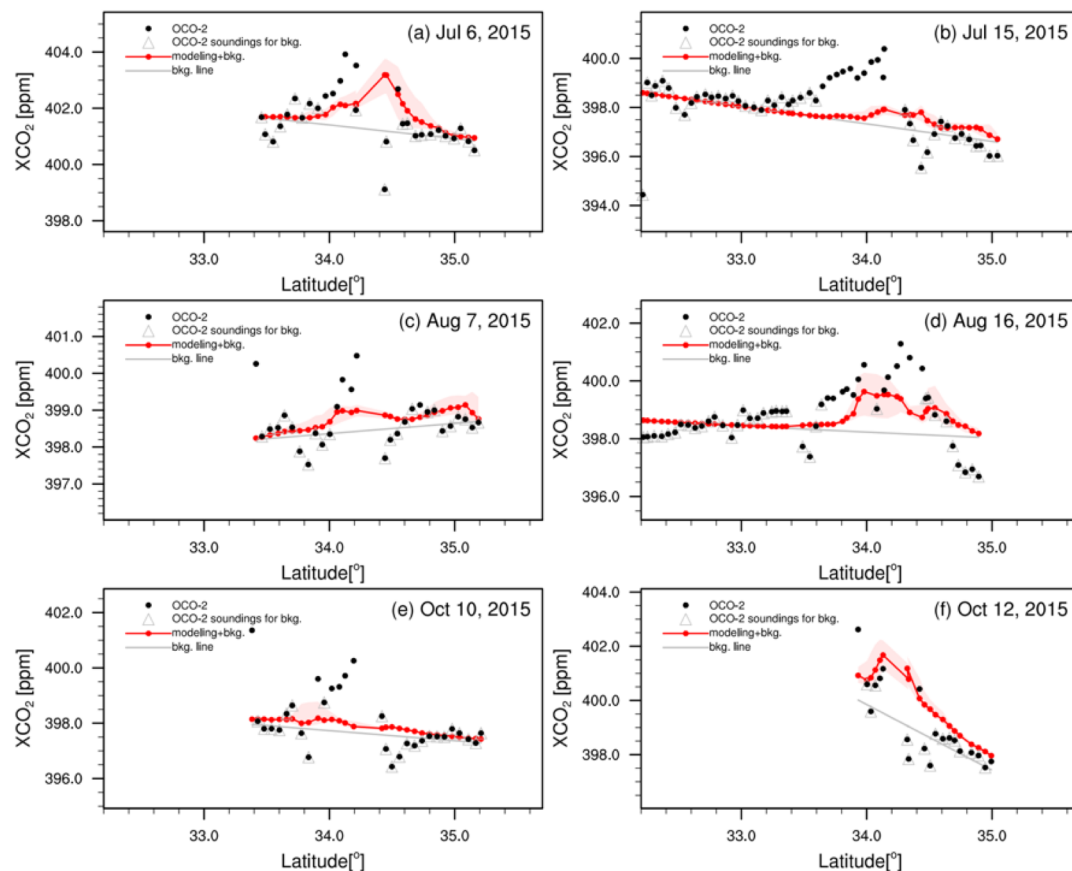
Complex topography near the shore: Los Angeles, CA

Impact of complex topography

- Large disagreement on individual tracks
- Definition of the background more uncertain (linear regression)

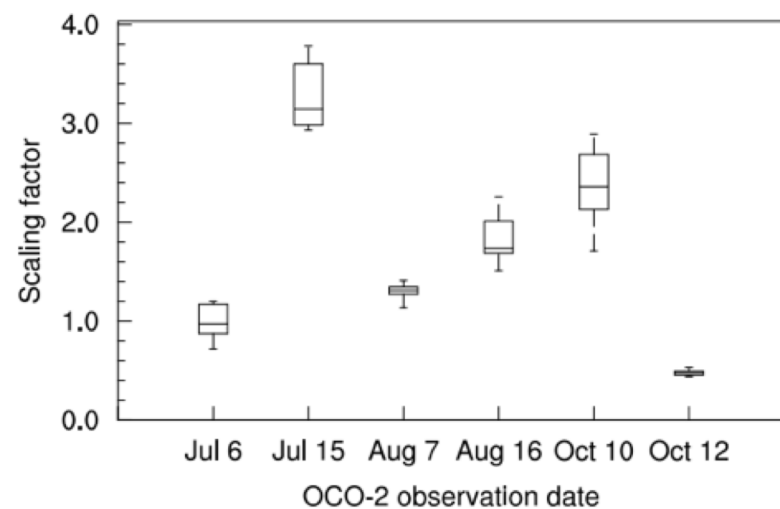
Conclusions

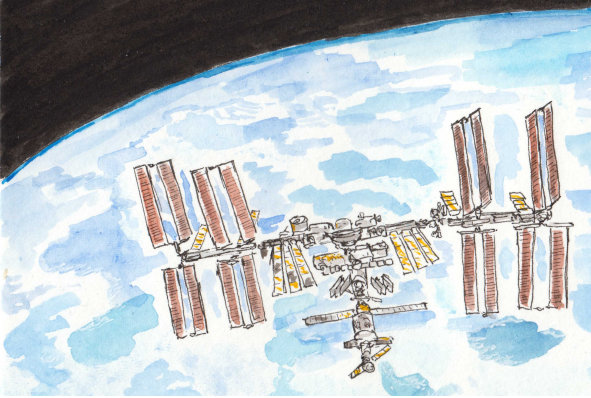
Uncertainties from mesoscale model simulations increase with significant gradients in the background



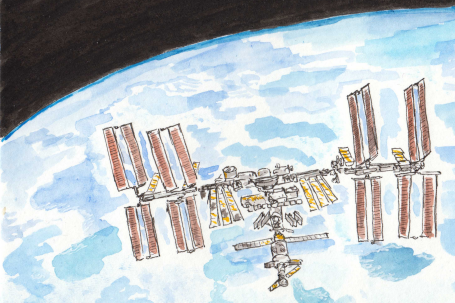
Comparisons of modeled and observed ffX_{CO_2} enhancements by the OCO-2 data over Los Angeles, CA

Scaling factors applied to ODIAC emissions for the different OCO-2 tracks



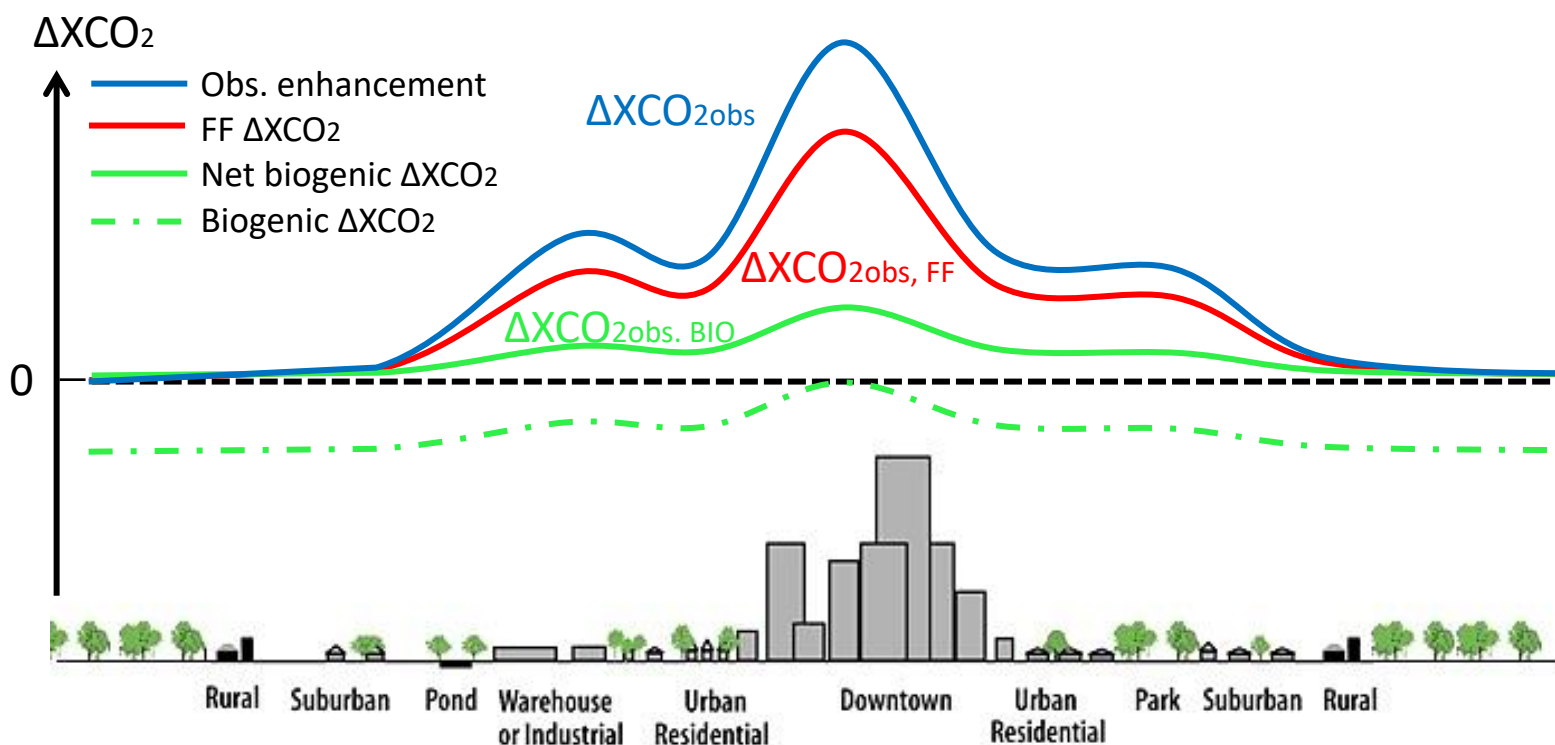


Biogenic flux uncertainties

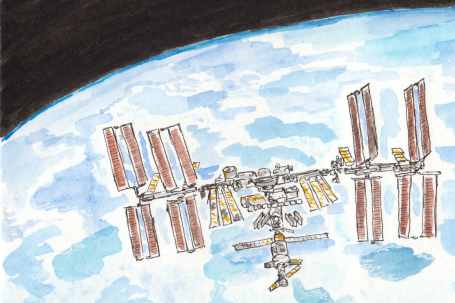


Urban CO₂ emissions from space: analysis of OCO-2 tracks

Coastal city in densely-vegetated area: Yangtze River Delta, China



Representation of the biogenic and fossil fuel contribution to the observed XCO₂ enhancements across the urban-to-rural spatial gradient



Urban CO₂ emissions from space: analysis of OCO-2 tracks

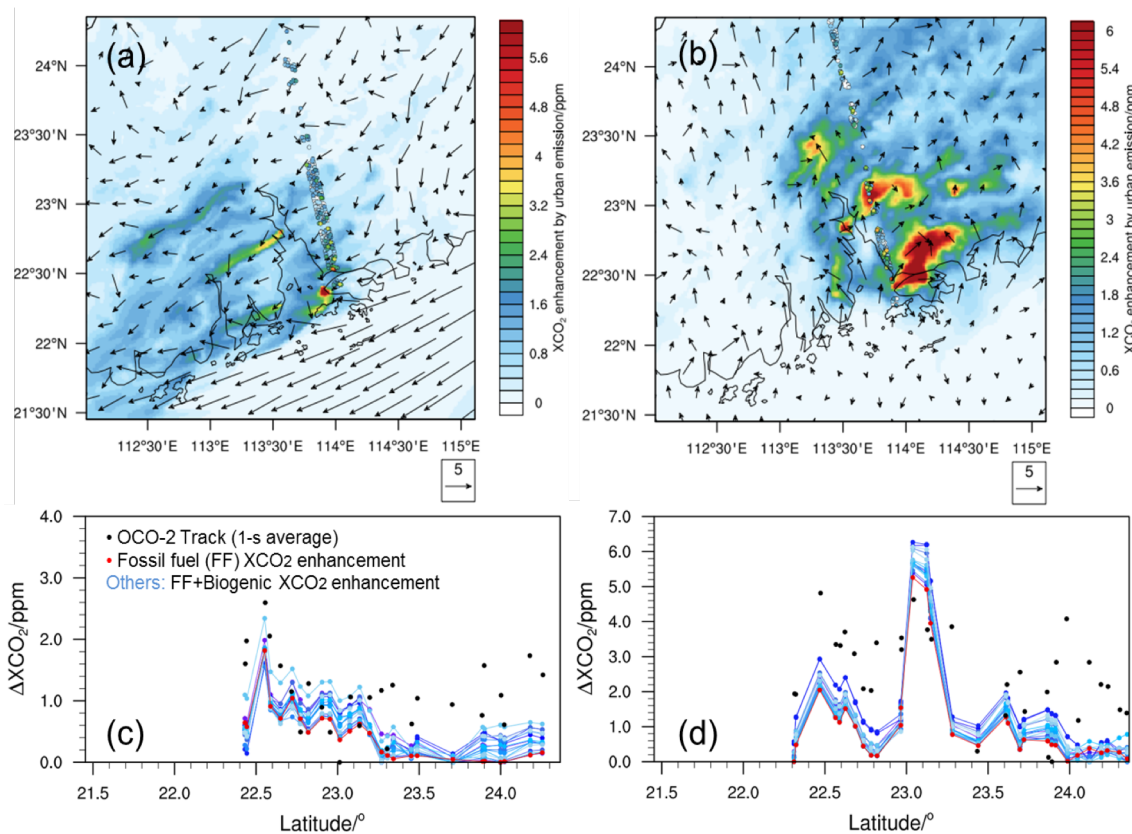
Coastal city in densely-vegetated area: Pearl River Delta, China

Biogenic CO₂ fluxes

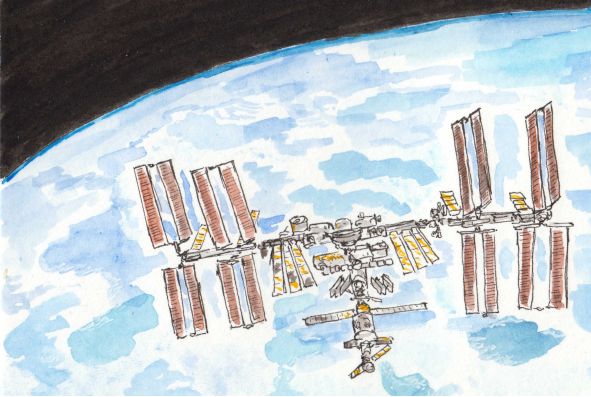
- Ensemble of 15 biogeochemical models (MsTMIP)
- Upscaled using Green Vegetation Fraction from MODIS
- Urban and rural vegetation assumed similar

Impact of vegetated surroundings

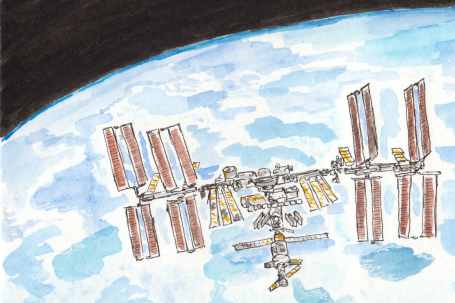
- Large uncertainties in fossil fuel CO₂ emissions due to biogenic flux uncertainty (32% and 24%)



Simulated ffX_{CO_2} over the PRD region and the 10-m wind vectors in the 1.333-km resolution domain at (a) 05:00 UTC January 15, 2015, and (b) 05:00 UTC August 4, 2015



Measurement quality assessment of XCO₂ retrievals

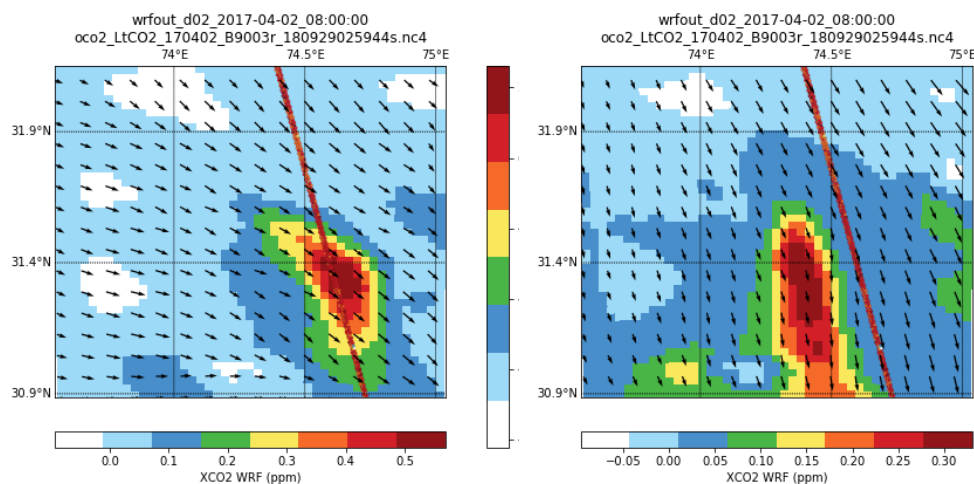


Urban CO₂ emissions from space: analysis of OCO-2 tracks

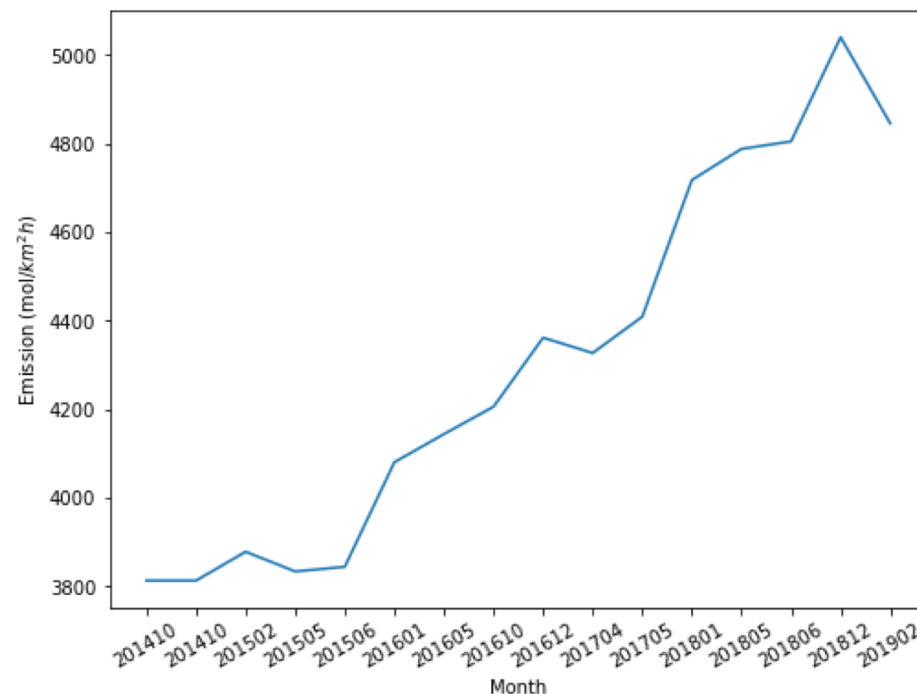
Fast-growing city in flat terrain: Lahore, Pakistan

XCO-2 retrievals over Lahore

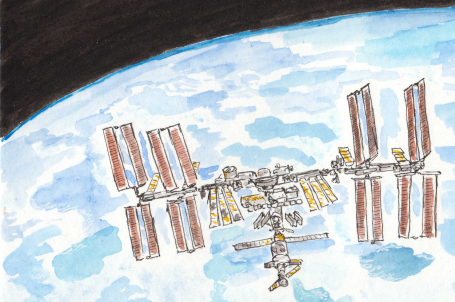
- Fast-growing urban area with potentially high aerosol content
- Meteo data assimilation identified as critical to represent the local enhancements



Simulations of XCO₂ mixing ratios with meteorological data assimilation (left) and without (right) over Lahore



Evolution of fossil fuel CO₂ emissions over Lahore, Pakistan based on national fuel consumption statistics (ODIAC) from 2014 to 2019

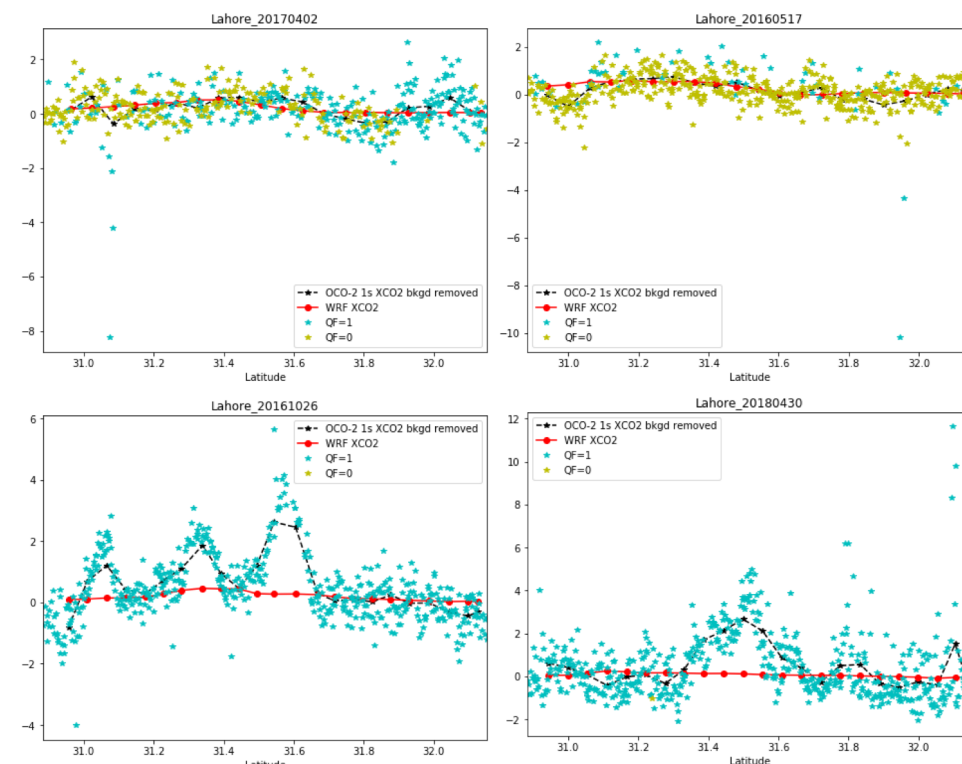
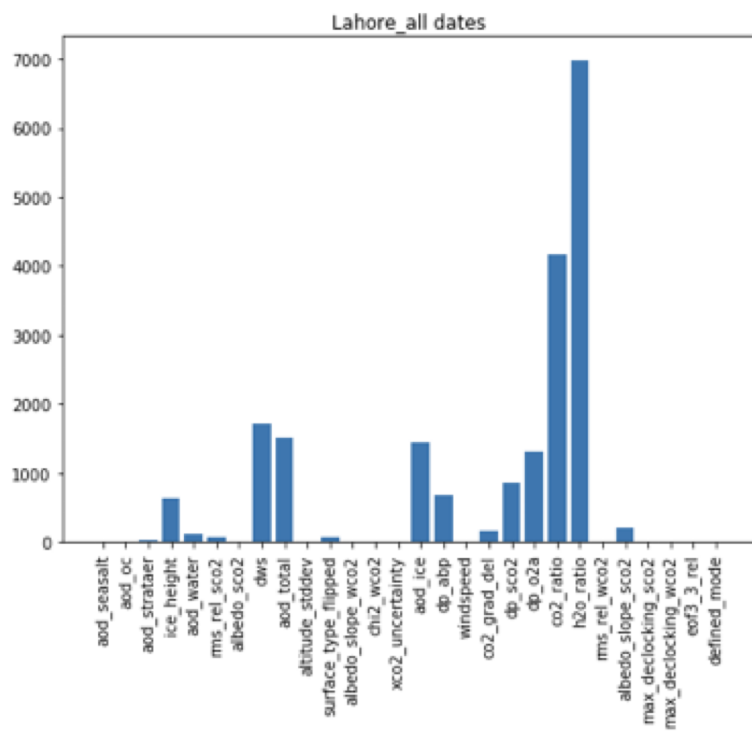


Urban CO₂ emissions from space: analysis of OCO-2 tracks

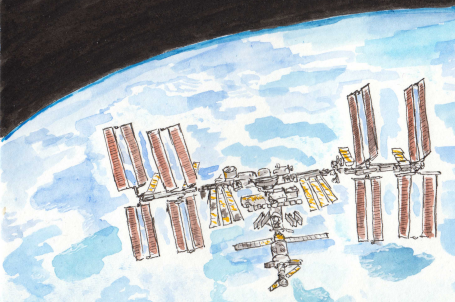
Fast-growing city in flat terrain: Lahore, Pakistan

Quality flags in OCO-2 retrievals

- Large plumes detected in both high-quality and low-quality data
- Unclear if quality flags are relevant at local scales



Examples of low-quality (in blue) and high-quality (in green) XCO₂ data for four tracks over Lahore, Pakistan



Urban CO₂ emissions from space: analysis of OCO-2 tracks

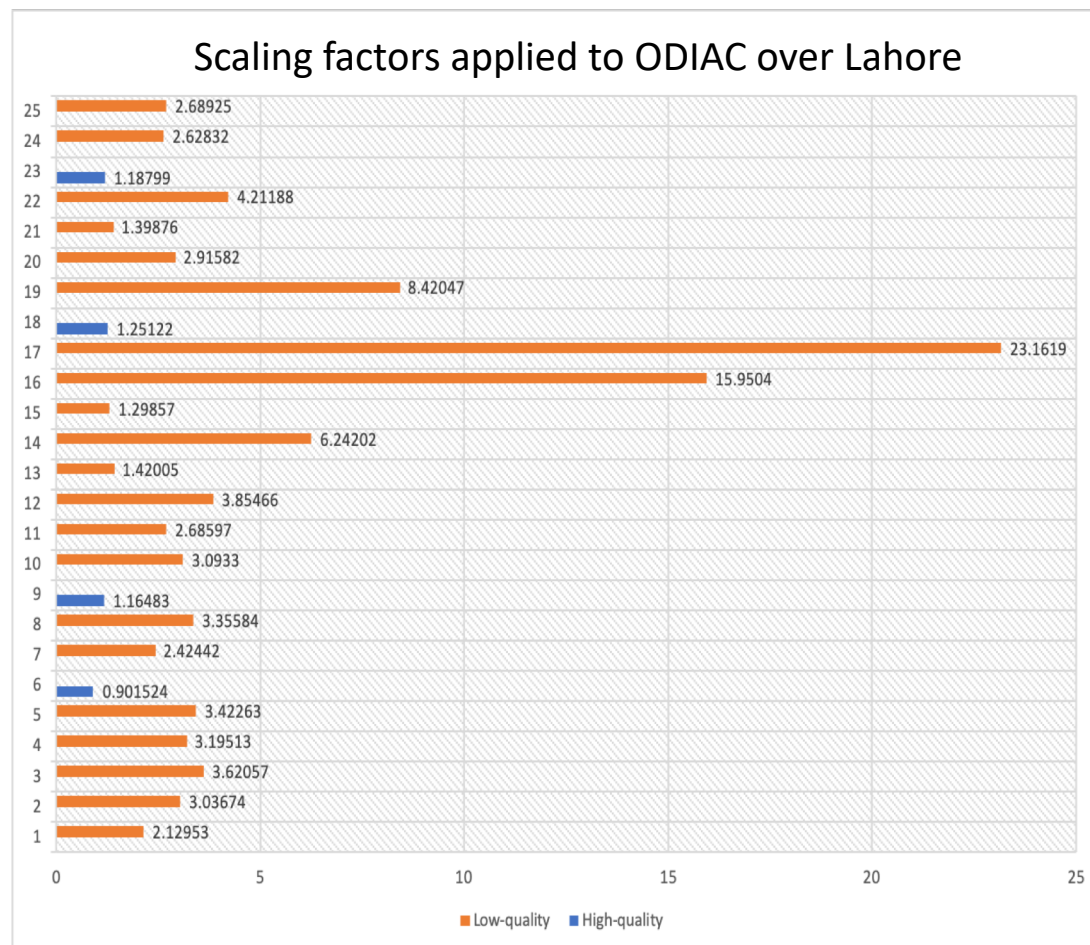
Fast-growing city in flat terrain: Lahore, Pakistan

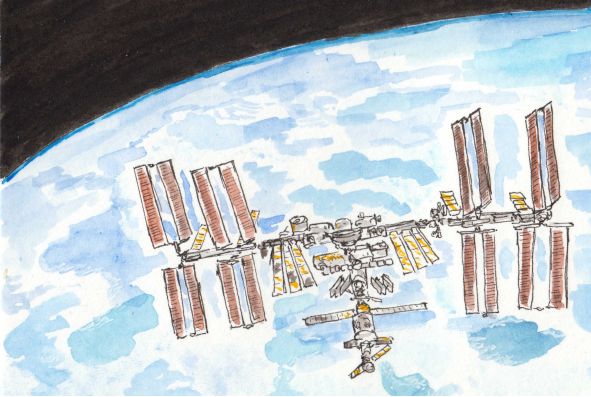
Quality flags for OCO-2 emissions

- High-quality tracks produce consistent CO₂ emission estimates (in blue)
- Low-quality flags show inconsistent scaling factors (in orange)

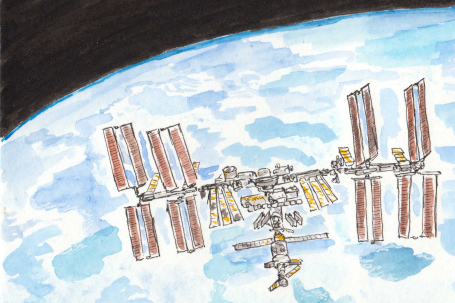
Conclusions on OCO-2 quality flags

- Plumes detected in low-quality tracks caused by aerosol/cloud contamination
- Quality flags are highly-relevant to local source estimation





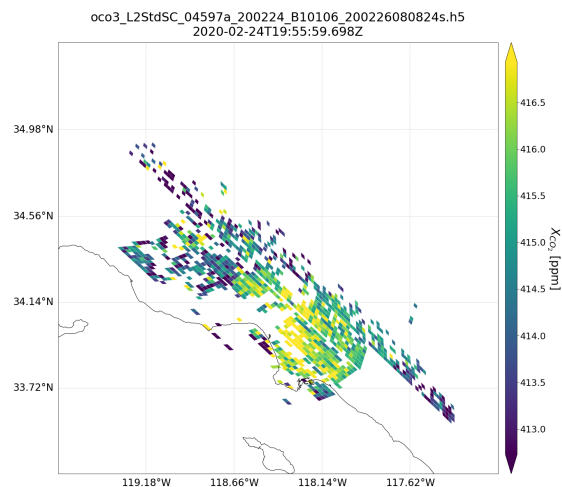
First look at OCO-3 Scanning Area Mode



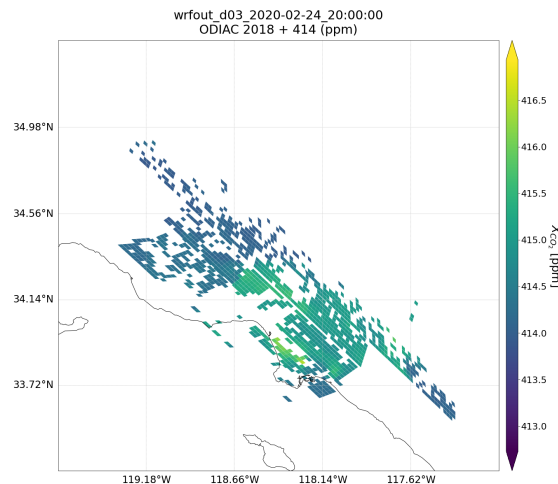
Urban CO₂ emissions from space: analysis of OCO-3 SAMs

Los Angeles, CA

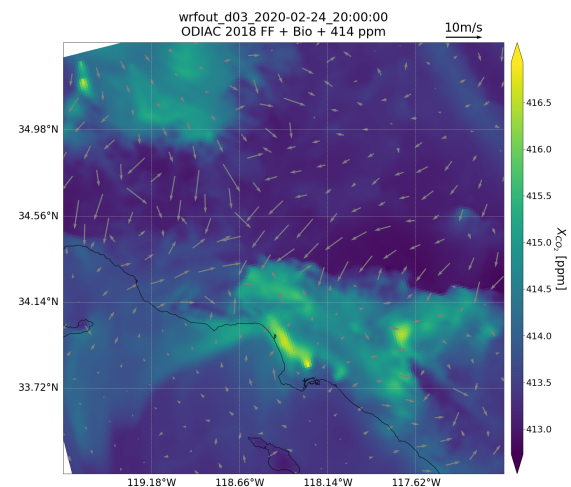
OCO-3



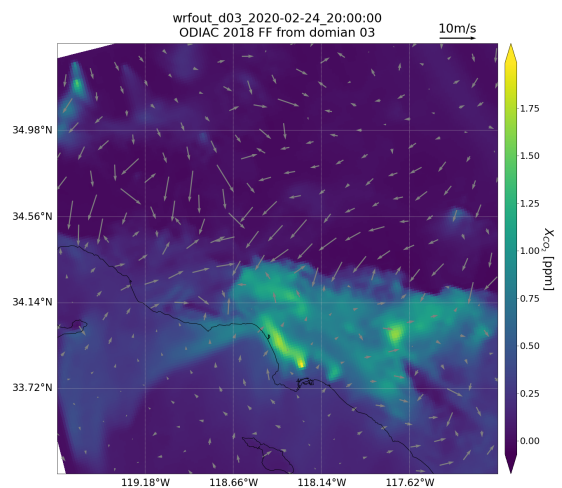
WRF ODIAC 2018 XCO2 (OCO-3 sampled)



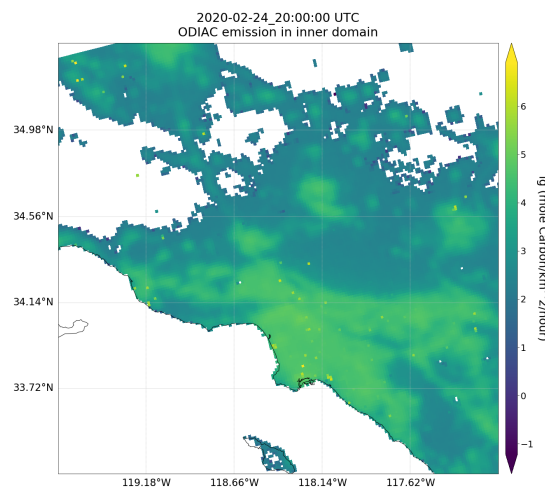
WRF ODIAC 2018 XCO2



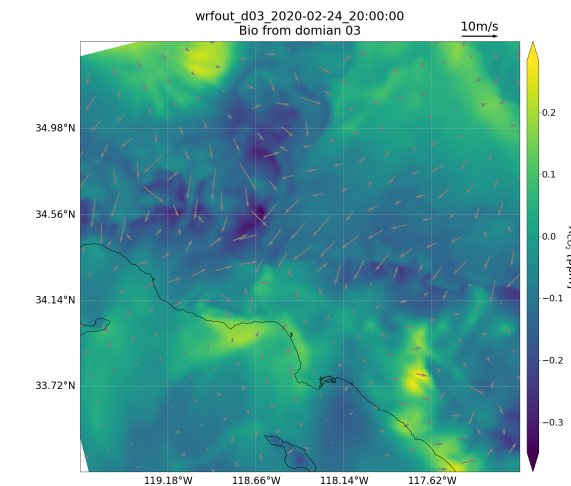
WRF Fossil Fuel XCO2

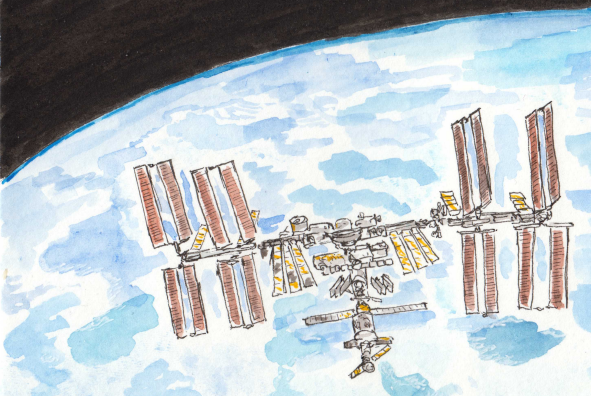


ODIAC emission



Biogenic XCO2 (GVF+MstMIP)





Conclusions

Illustration by Orlanda Marin Lopez

High-resolution modeling systems agree within 25% compared to ODIAC (for high-quality tracks)

Meteorological data assimilation is required to obtain such an agreement

Quality flags defined for global-scale inversions are relevant for local source determination

Large fraction of the tracks are lost due to aerosol/cloud contamination (21 out of 25 tracks)

First SAM's over Los Angeles and simulated XCO₂ mixing ratios are consistent