



Monitoring facility-scale CO₂ emission changes from space

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Key Points:

- The combustion of coal for electricity generation accounts for more than 40% of global anthropogenic CO₂ emissions
- Orbiting Carbon Observatory 2 observations can be used to quantify CO₂ emissions from individual coal power plants, in selected cases
- This work suggests that a future constellation of CO₂ imaging satellites could monitor fossil fuel power plant CO₂ emissions to support climate policy

Supporting Information:

- Supporting Information S1

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Quantifying CO₂ Emissions From Individual Power Plants From Space

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Abstract In order to better quantify CO₂ emissions are needed at all scales. Orbiting Carbon Observatory 2 observations show that in some cases, CO₂ individual middle- to large-size estimates for U.S. power plants of the approach to international of future CO₂ imaging satellites plants to support the implementation



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2017 and 2021 papers
demonstrated method
with OCO-2



Advances in quantifying power plant CO₂ emissions with OCO-2

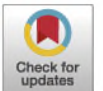
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Overview of Method and Equations

- Identify background and enhancement in OCO-2 XCO₂
- Fit observed OCO-2 XCO₂ enhancements to 2D Gaussian plume model
- Optimize wind direction by iterating fit with small adjustments to wind direction to maximize correlation coefficient (R)
- Determine emission estimates, varying some parameters yielding an ensemble of estimates for quantifying uncertainties

$$V(x, y) = \frac{F}{\sqrt{2\pi}\sigma_y(x)u} e^{-\frac{1}{2} \left(\frac{y}{\sigma_y(x)} \right)^2}$$

$$\sigma_y(x) = a \cdot \left(\frac{x}{x_o} \right)^{0.894}$$

V is the CO₂ vertical column (g/m²) downwind of the point source

x is along wind distance (m) ($x_o = 1000$ m is a characteristic length)

y is across wind distance (m)

F is emission rate (g/s)

u is the wind speed (m/s)

σ_y is the standard deviation in the wide direction (measure of the plume width) (m)

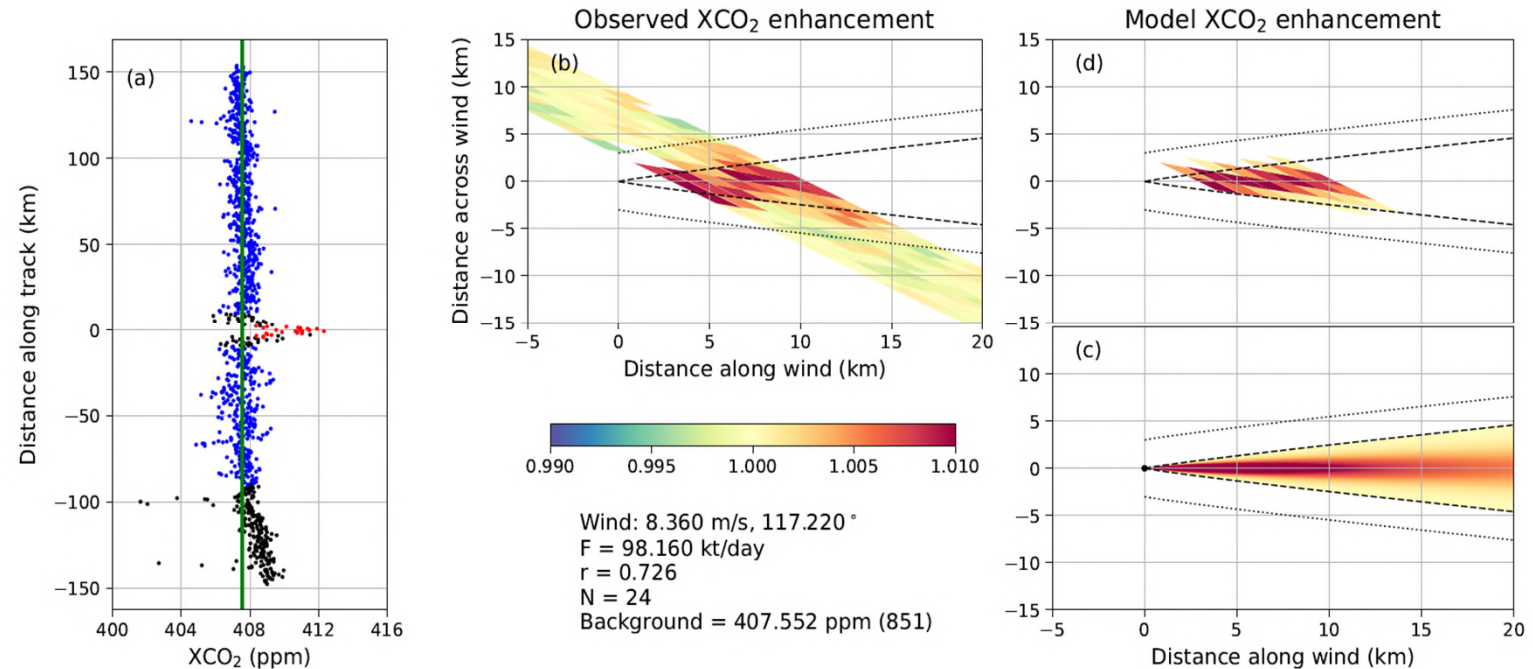
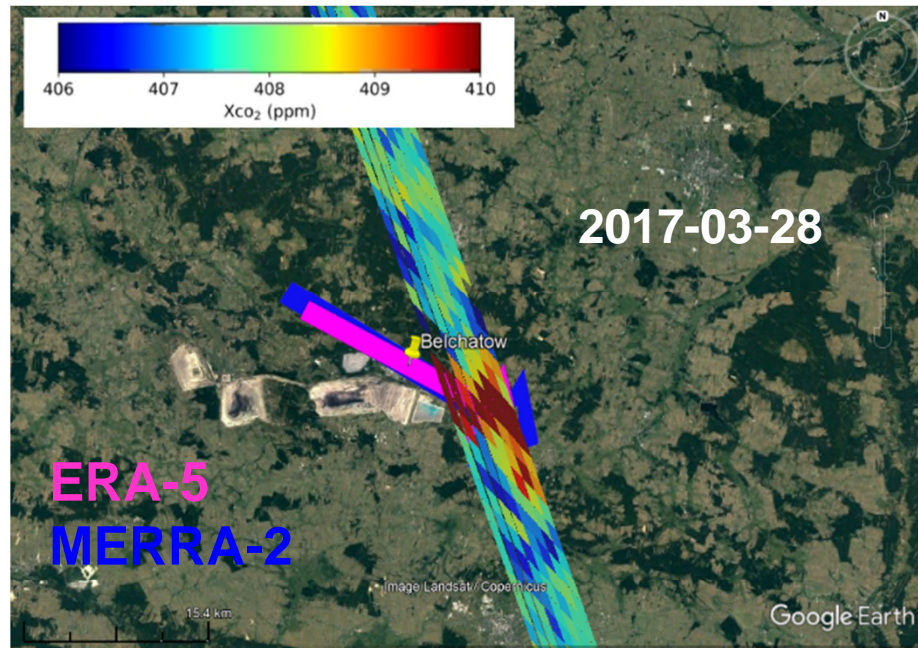
a is the atmospheric stability parameter

$$\varepsilon = \sqrt{\varepsilon_w^2 + \varepsilon_b^2 + \varepsilon_e^2 + \varepsilon_r^2}$$

Wind Background Enhancement Rise

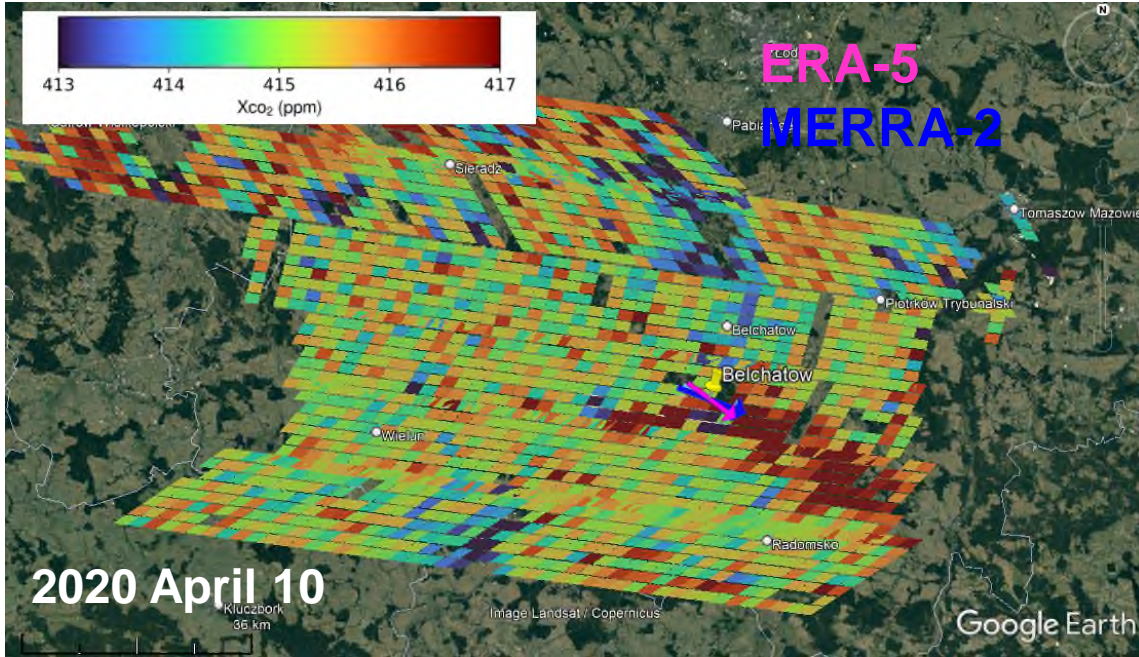
Bełchatów Power Plant

- Largest fossil fuel power plant in Europe
- 5th largest in the world (5102 MW)
- Reported emissions for 2017 are 37.6 MtCO₂, average of 103.0 ktCO₂/day



- Wind rotation of -2.0° applied, gives very good model-data correlation (R = 0.726)
- Estimate 98.2 ± 12.1 ktCO₂/day with ± 9.6 ktCO₂/day due to wind speed uncertainty

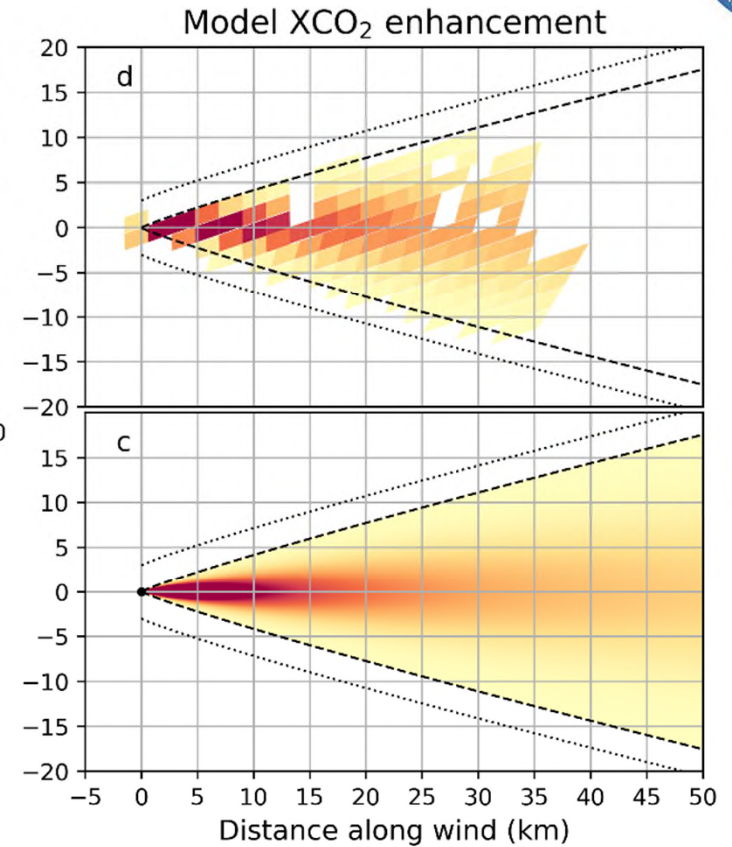
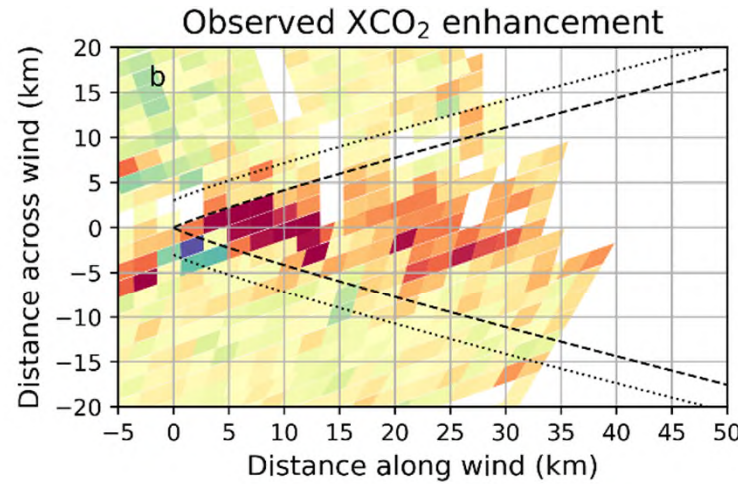
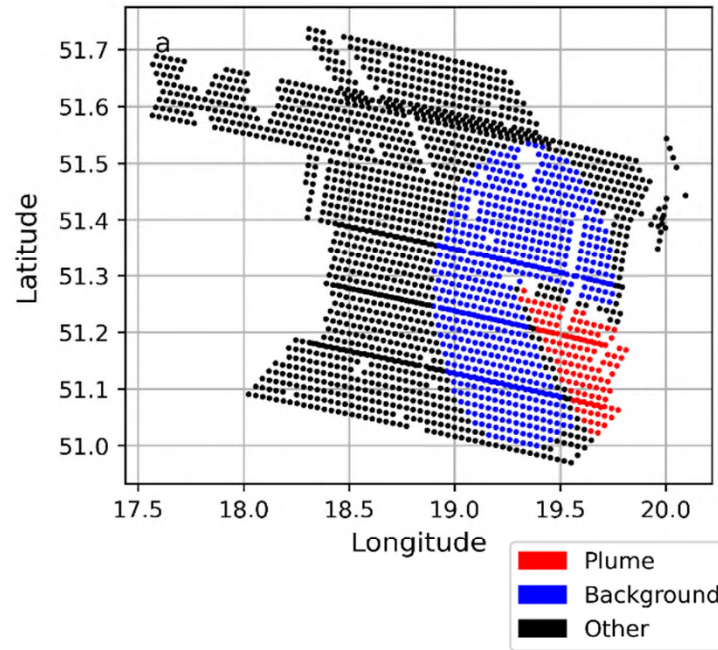
Quantifying CO₂ Emission Changes at Bełchatów



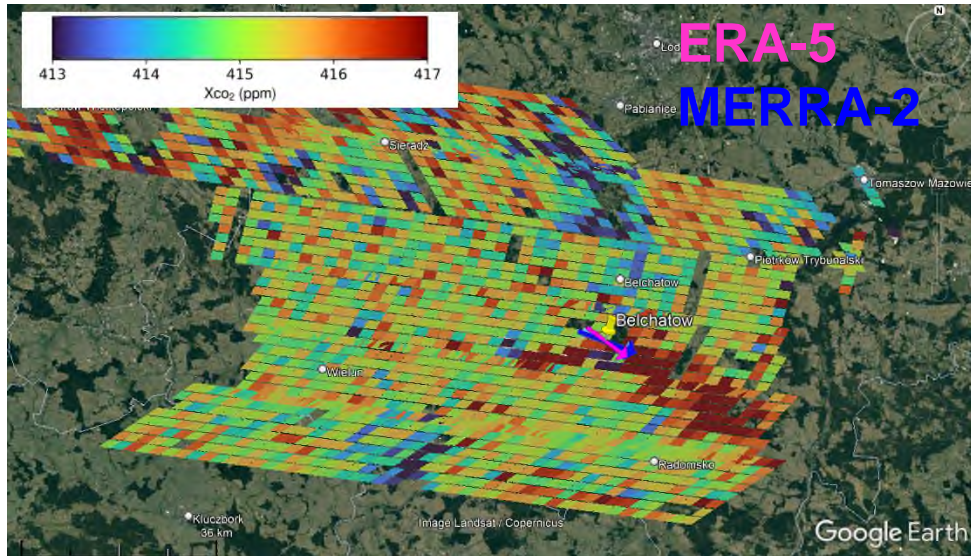
Overpass	Mission	Power Generated at overpass time (MW)*	Expected emissions (ktCO ₂ /day)
2017-03-28	OCO-2	4755	103.0
2020-04-08	OCO-3	3615	78.3
2020-04-10	OCO-3	3601	78.0
2020-04-17	OCO-3	3230	70.0
2021-06-18	OCO-3	3666	79.4
2021-06-19	OCO-3	3724	80.7
2021-06-20	OCO-3	1971	42.7
2021-10-08	OCO-3	2785	60.3
2021-10-09	OCO-3	1784	38.6

- Multiple OCO-3 v10 Snapshot Area Maps (SAMs) of Bełchatów power plant in 2020-2021 now available
- We can compare our emissions estimates derived from OCO-2/OCO-3 to those expected based on hourly power generation available from the European Network of Transmission System Operators for Electricity Transparency Framework

OCO-3 v10 Bełchatów 2020-04-10



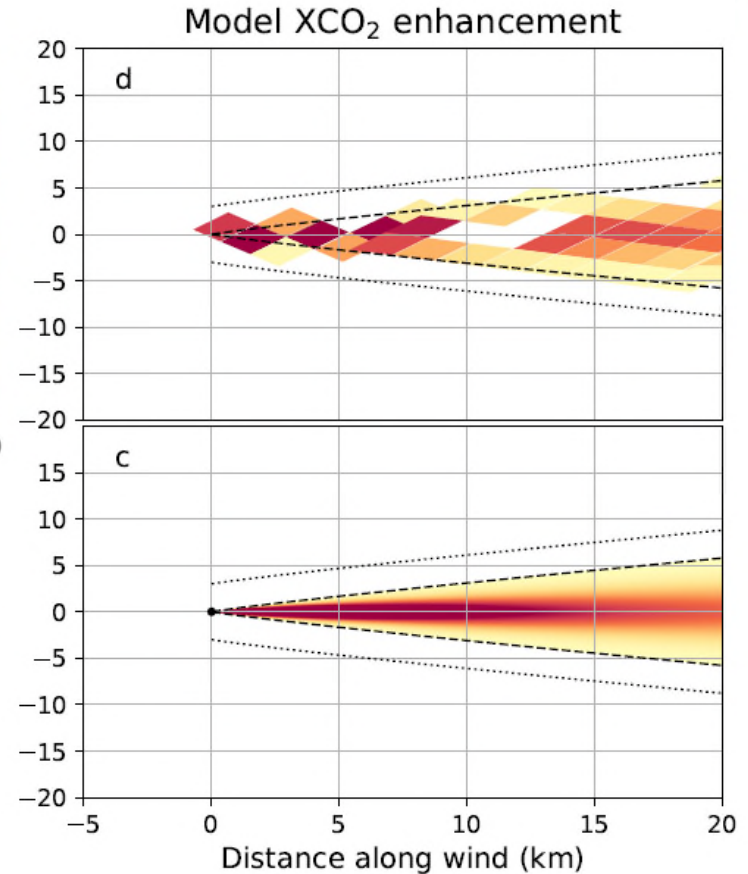
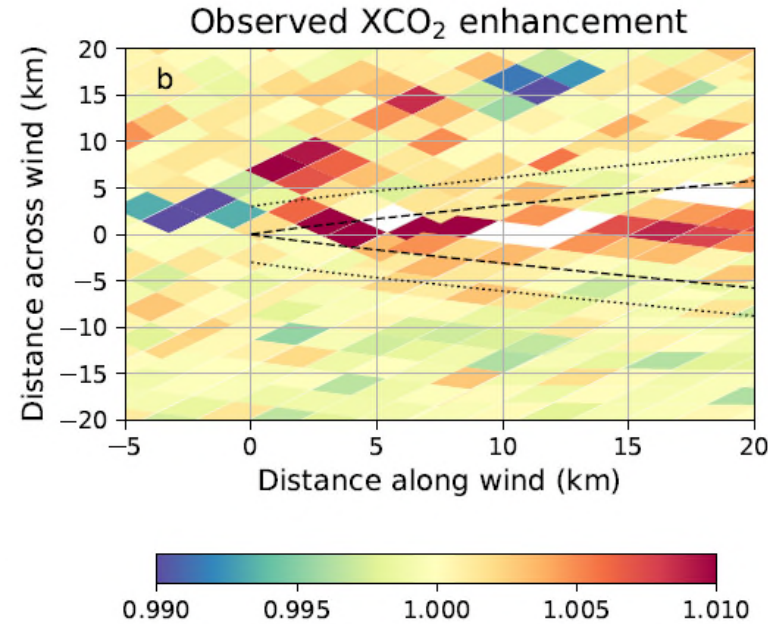
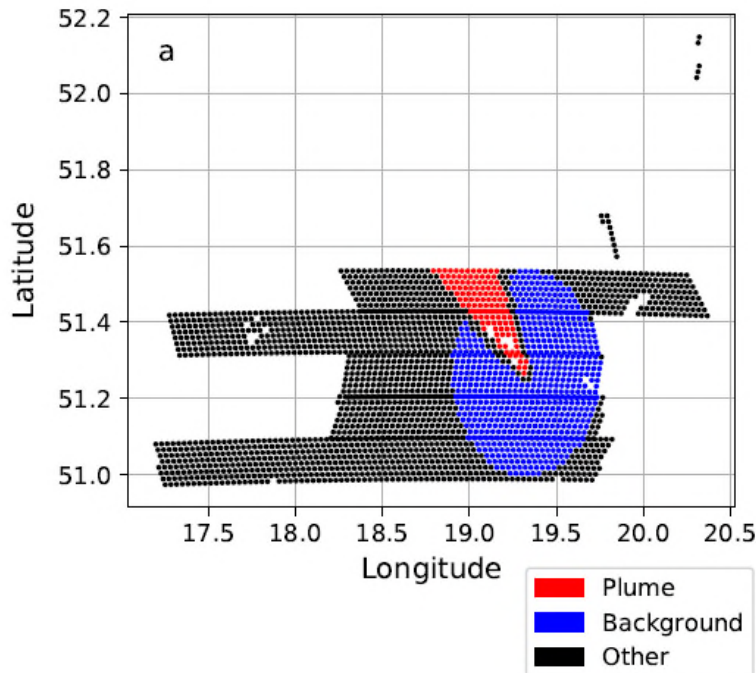
Wind: 3.857 m/s, 121.000°
 F = 80.978 kt/day
 R = 0.657
 N = 129
 Background = 415.150 ppm (614)



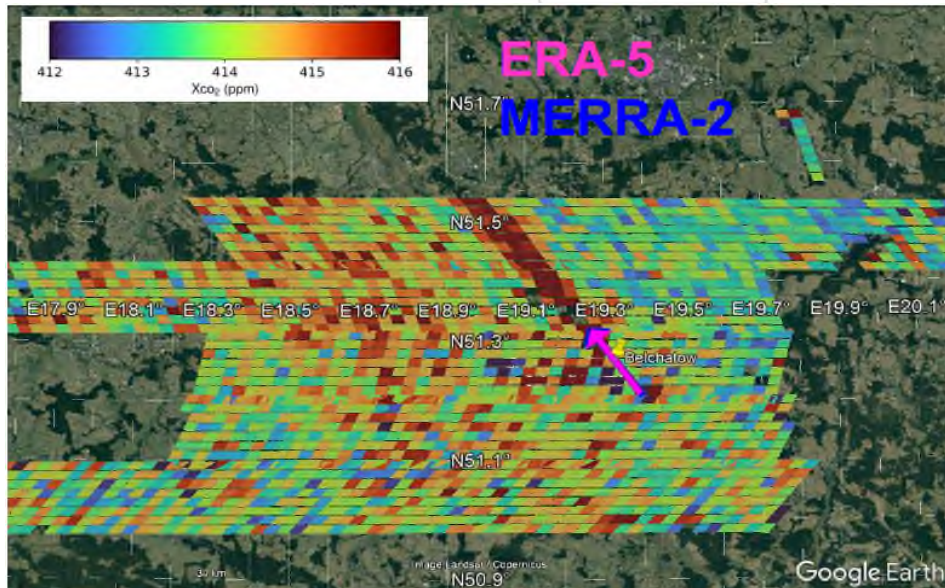
OCO-3 background is average of footprints taken within a specified radius from the source, excluding a sector corresponding to the plume and a narrow buffer zone.

78.0 kt/day (Power Generation) **81.0±8.3** kt/day (OCO-3)
 with wind uncertainty of 8.2 kt/day

OCO-3 v10 Bełchatów 2021-06-18



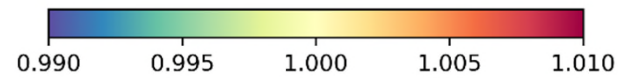
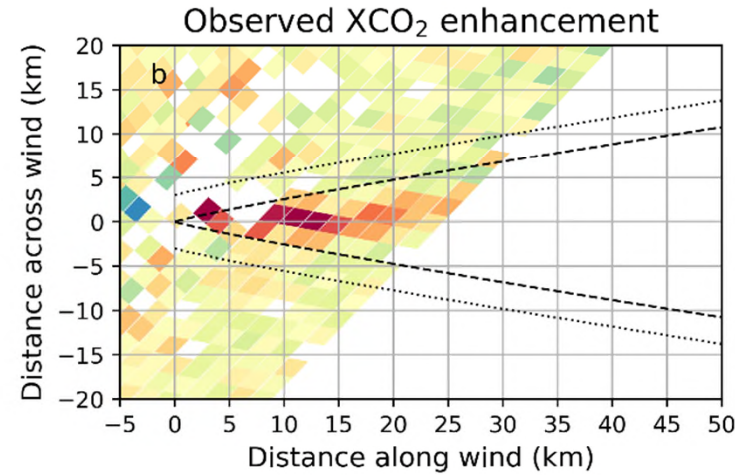
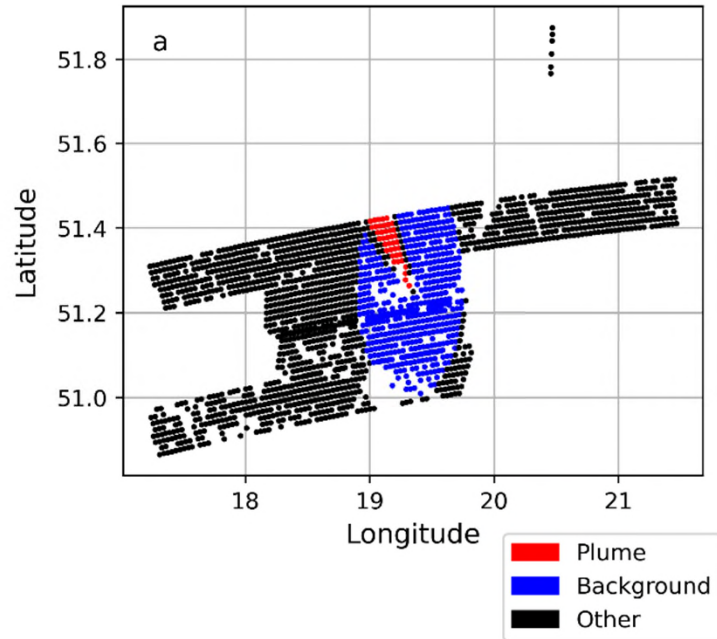
Wind: 5.777 m/s, -36.718°
 F = 101.163 kt/day
 R = 0.715
 N = 121
 Background = 414.038 ppm (676)



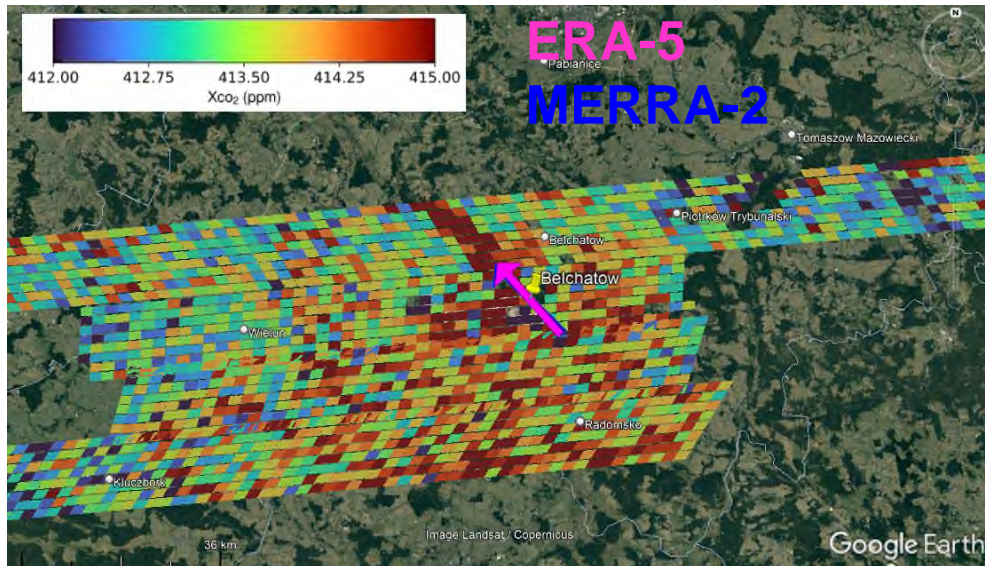
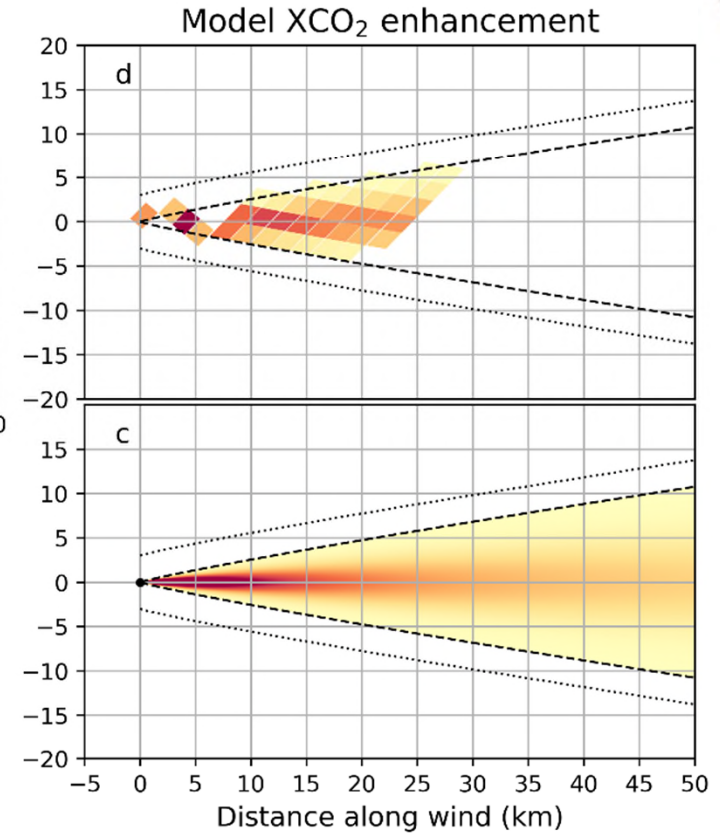
79.4 kt/day (Power Generation) 101.1±4.3 kt/day (OCO-3)
 with wind uncertainty 4.0 kt/day

Strong symmetric plume, moderate wind speed, good correlation.
 Asymmetric background may be source of discrepancy.

OCO-3 v10 Bełchatów 2021-06-19



Wind: 6.550 m/s, -42.639°
 F = 79.748 kt/day
 R = 0.703
 N = 39
 Background = 413.912 ppm (488)



80.7 kt/day (Power Generation) **79.8±3.0 kt/day** (OCO-3).
 Background uncertainty of 2.7 kt/day is largest source.

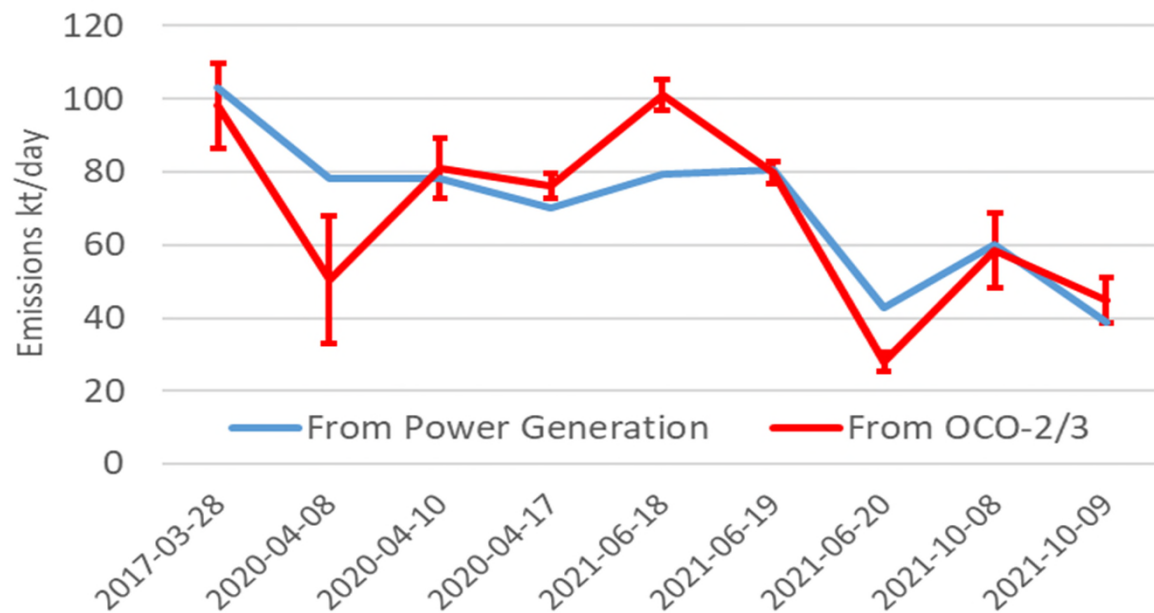
Moderate wind speed, reasonable background, symmetric plume, good correlation and excellent agreement.



Quantifying CO₂ Emission Changes at Bełchatów



Overpass	Mission	Power Generated at overpass time (MW)*	Expected emissions (ktCO ₂ /day)	OCO mission emission estimate (ktCO ₂ /day)	Expected & observed % change	Correlation	Footprints in plume (background)
2017-03-28	OCO-2	4755	103.0	98.2 ± 11.7	Baseline	0.726	24 (851)
2020-04-08	OCO-3	3615	78.3	50.5 ± 17.6	-24 / -49 %	0.636	240 (466)
2020-04-10	OCO-3	3601	78.0	81.0 ± 8.3	-24 / -18 %	0.657	129 (614)
2020-04-17	OCO-3	3230	70.0	76.3 ± 3.4	-32 / -22 %	0.332	91 (476)
2021-06-18	OCO-3	3666	79.4	101.1 ± 4.3	-23 / +3 %	0.715	121 (676)
2021-06-19	OCO-3	3724	80.7	79.8 ± 3.0	-22 / -19 %	0.703	39 (488)
2021-06-20	OCO-3	1971	42.7	28.0 ± 2.6	-59 / -71 %	0.544	81 (549)
2021-10-08	OCO-3	2785	60.3	58.5 ± 10.3	-41 / -40 %	0.471	115 (529)
2021-10-09	OCO-3	1784	38.6	44.7 ± 6.3	-62 / -54 %	0.280	141 (426)



*Hourly power generation at facility unit level from



Estimated CO₂ emissions are consistent with trend expected from reported power generation for ~7 of 9 points in timeseries, demonstrating the ability to quantify short-term emission changes to support policy.

Conclusions

- NASA's OCO-2 and OCO-3 have enabled quantification of CO₂ emissions from large and medium-sized power plants in select cases, but narrow swath and limited coverage are key limitations.
- Despite these limitations, we have demonstrated the ability to quantify emission reductions of a few percent from a large power plant
- Our findings suggest a role for space-based monitoring of facility-scale CO₂ emission reductions in support of the Paris Agreement and capabilities for this application will continue to improve as the constellation of satellites expands with CO2M, GOSAT-GW, GeoCarb and other imaging missions