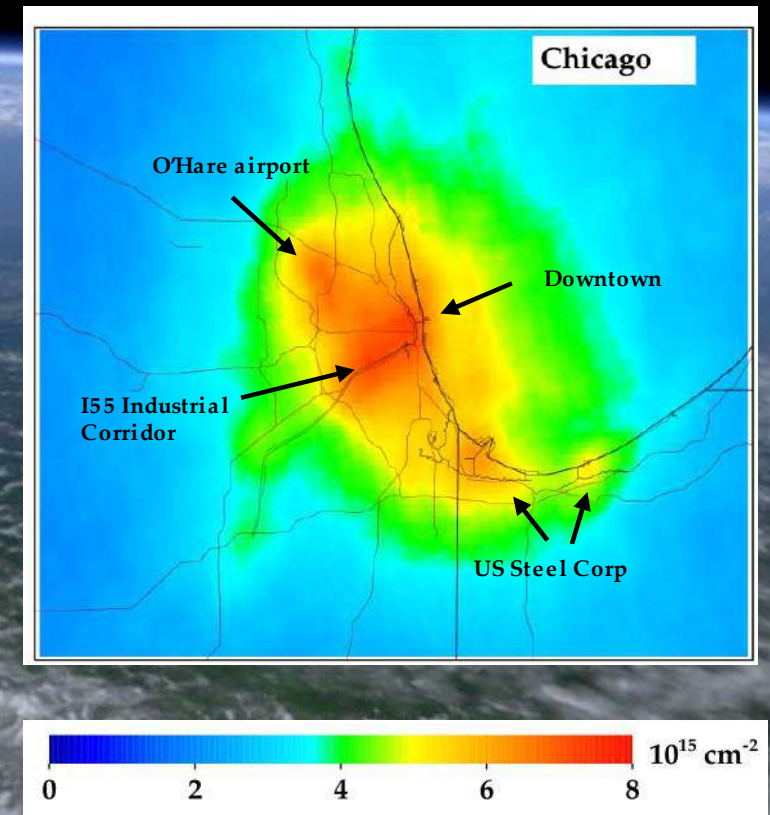
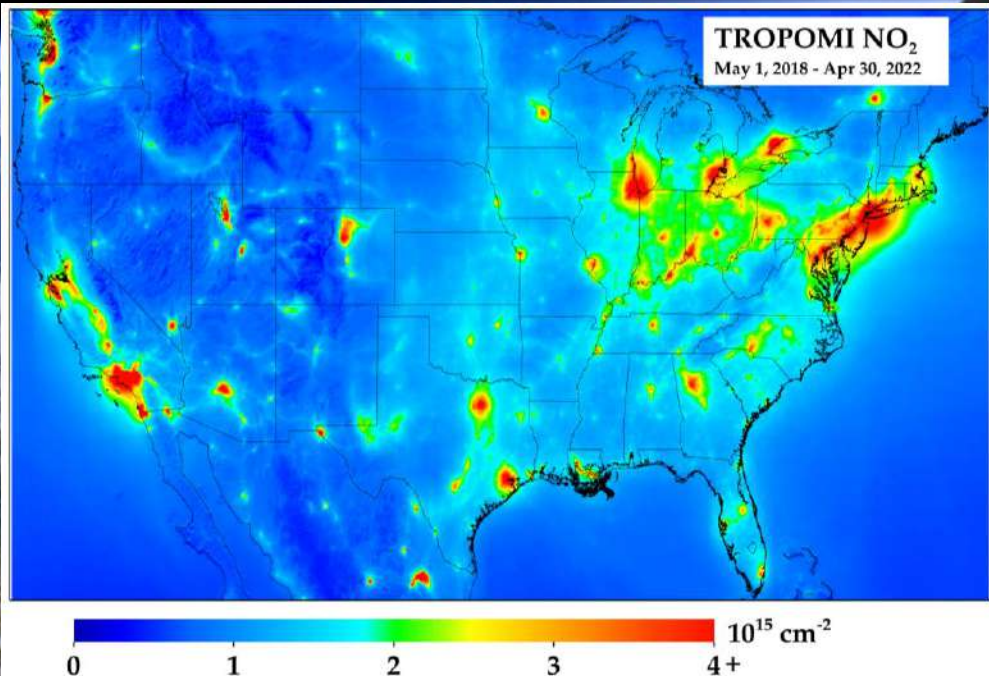
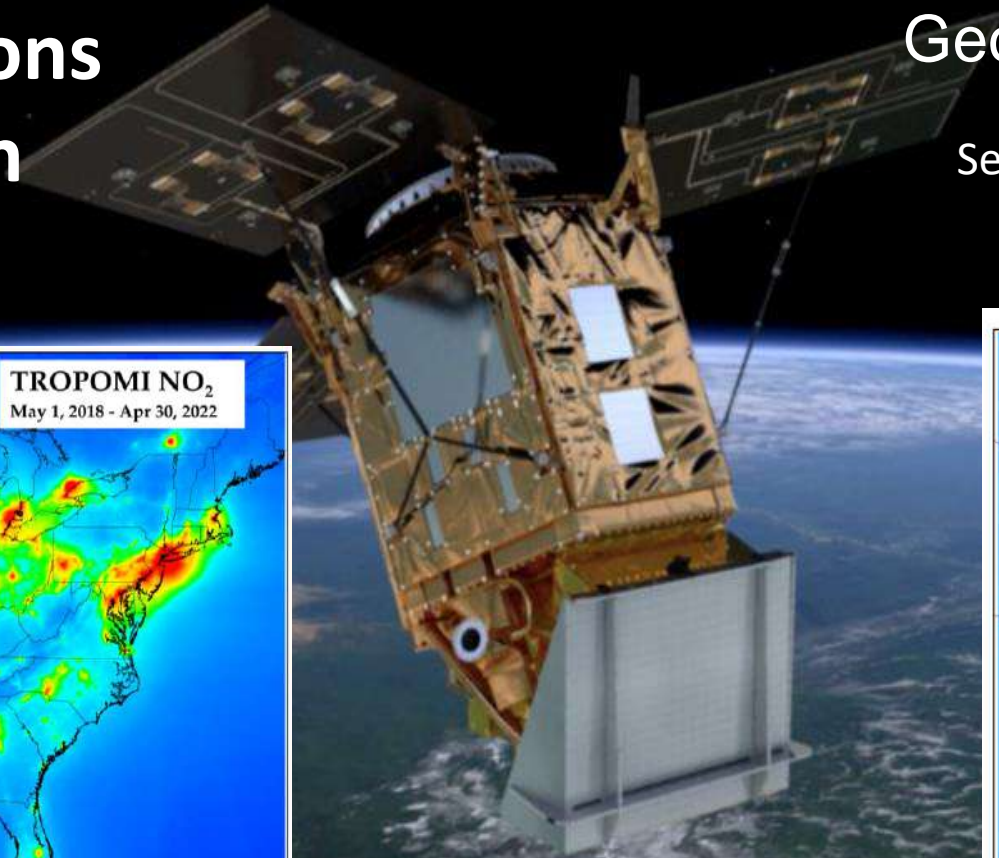


Policy and Health Relevant Applications of TROPOMI NO₂ in the United States

By: Dan Goldberg, PhD
George Washington University

Sentinel-5P Mission: 5 years anniversary
Tuesday 11 October 2022



Milken Institute School
of Public Health

THE GEORGE WASHINGTON UNIVERSITY

ESA: TROPOMI on the Sentinel 5 Precursor Satellite

Thank you Sentinel-5P Operational Science Team!

Instrument has been extremely useful and reliable from an end-user standpoint





Dr. Maria Tzortziou



Dr. Shobha Kondragunta



Dr. Laura Judd



haqast.org

Milken Institute School of Public Health

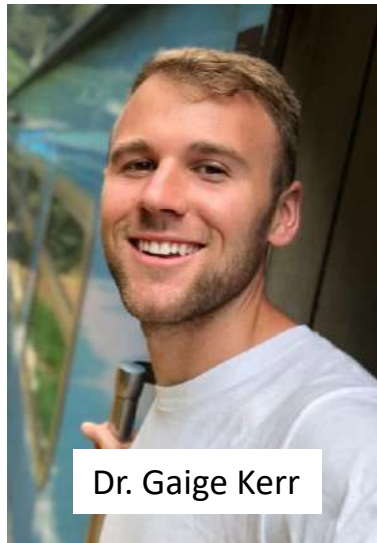
THE GEORGE WASHINGTON UNIVERSITY



Dr. Arlene Fiore



Madankui Tao



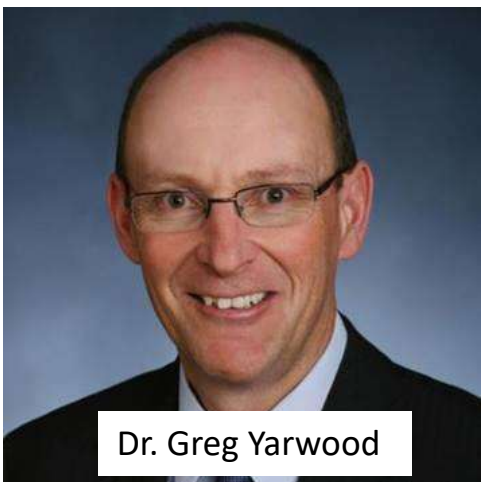
Dr. Gaige Kerr



Dr. Susan Anenberg



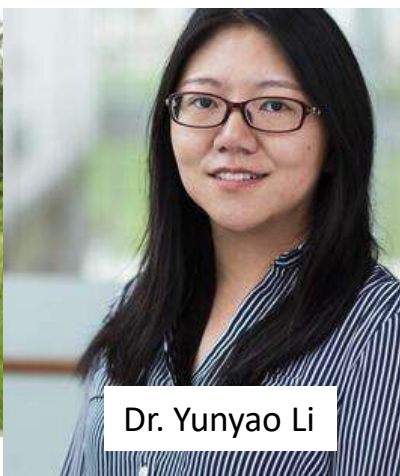
Dr. Tracey Holloway



Dr. Greg Yarwood



Dr. Ben de Foy



Dr. Yunyao Li



Dr. Daniel Tong



Nigel Martis



Perrin Krisko

Health effects of NO₂



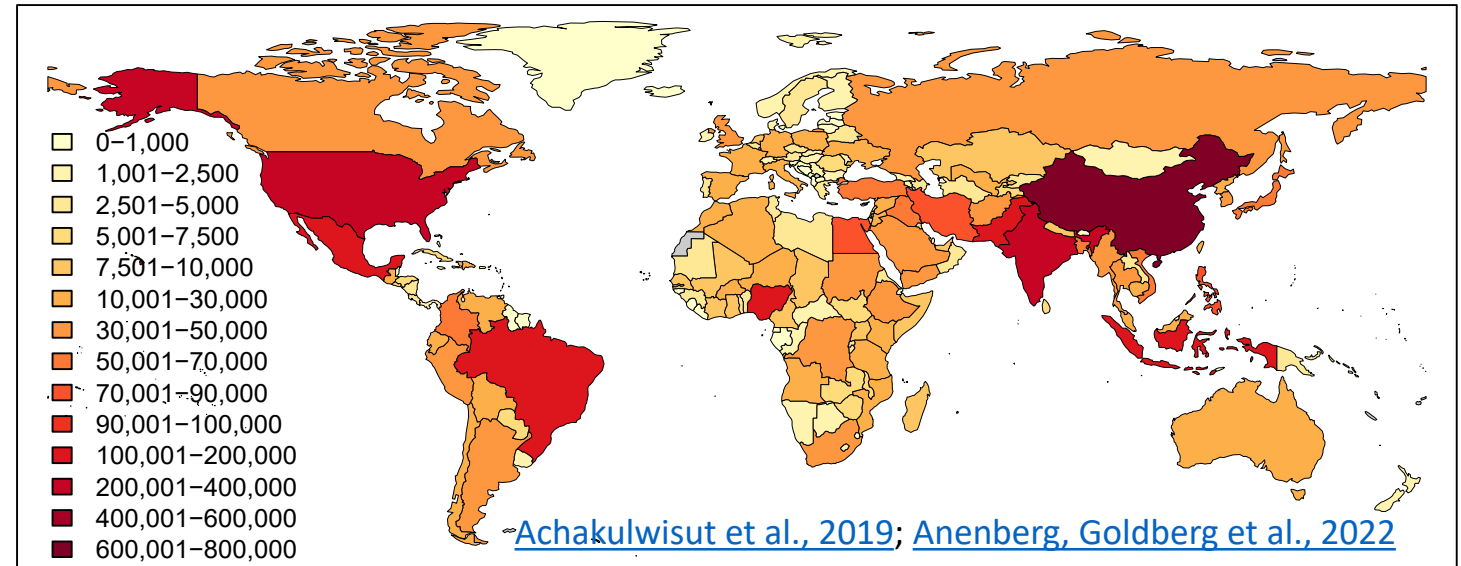
- Impairs cardiovascular function leading to potential cardiovascular diseases and premature mortality

- Causes and exacerbates asthma



In 2019, 1.8 million (95% CI 0.9 - 2.8) children developed asthma due to NO₂ pollution, responsible for 16% of all asthma

(a) Number of new asthma cases due to NO₂ exposure



- Co-emitted with other harmful pollutants (diesel PM, VOC air toxics, heavy metals, etc.)
- Inequitably distributed across the urban landscape; racialized, marginalized, and minoritized communities experience worse NO₂

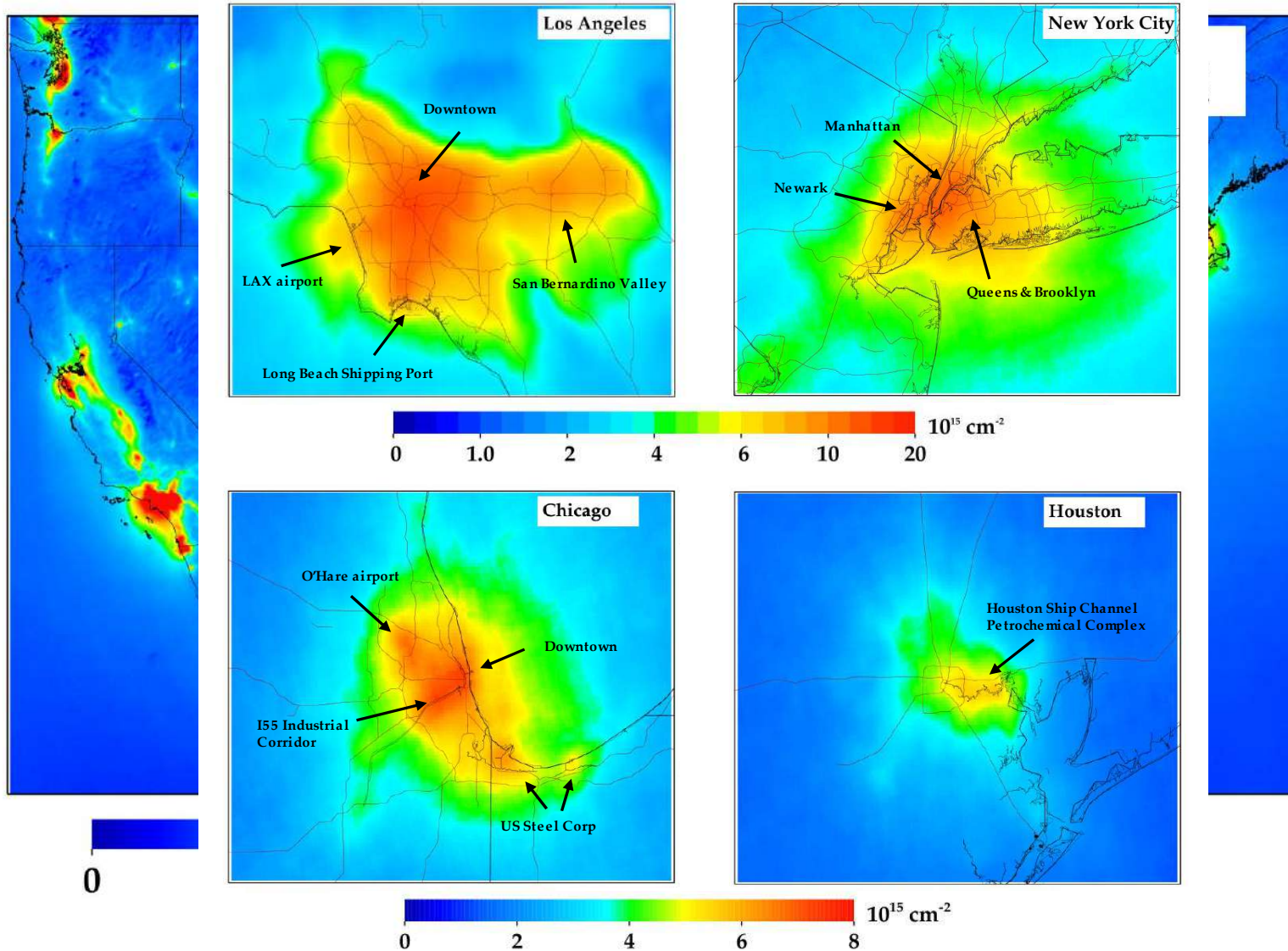


Improved spatial resolution of TROPOMI now allows us to assemble information at the local scale (~1 km).

Questions:

- Can we use TROPOMI data to differentiate NO_x emissions from highways, ports, airports, and large point sources within a metropolitan area?
- Can we use TROPOMI data to diagnose environmental justice issues within urban areas (e.g., NO_2 in poorer neighborhoods) without the use of an additional model?

4-year average of TROPOMI NO₂ at 0.01° × 0.01°

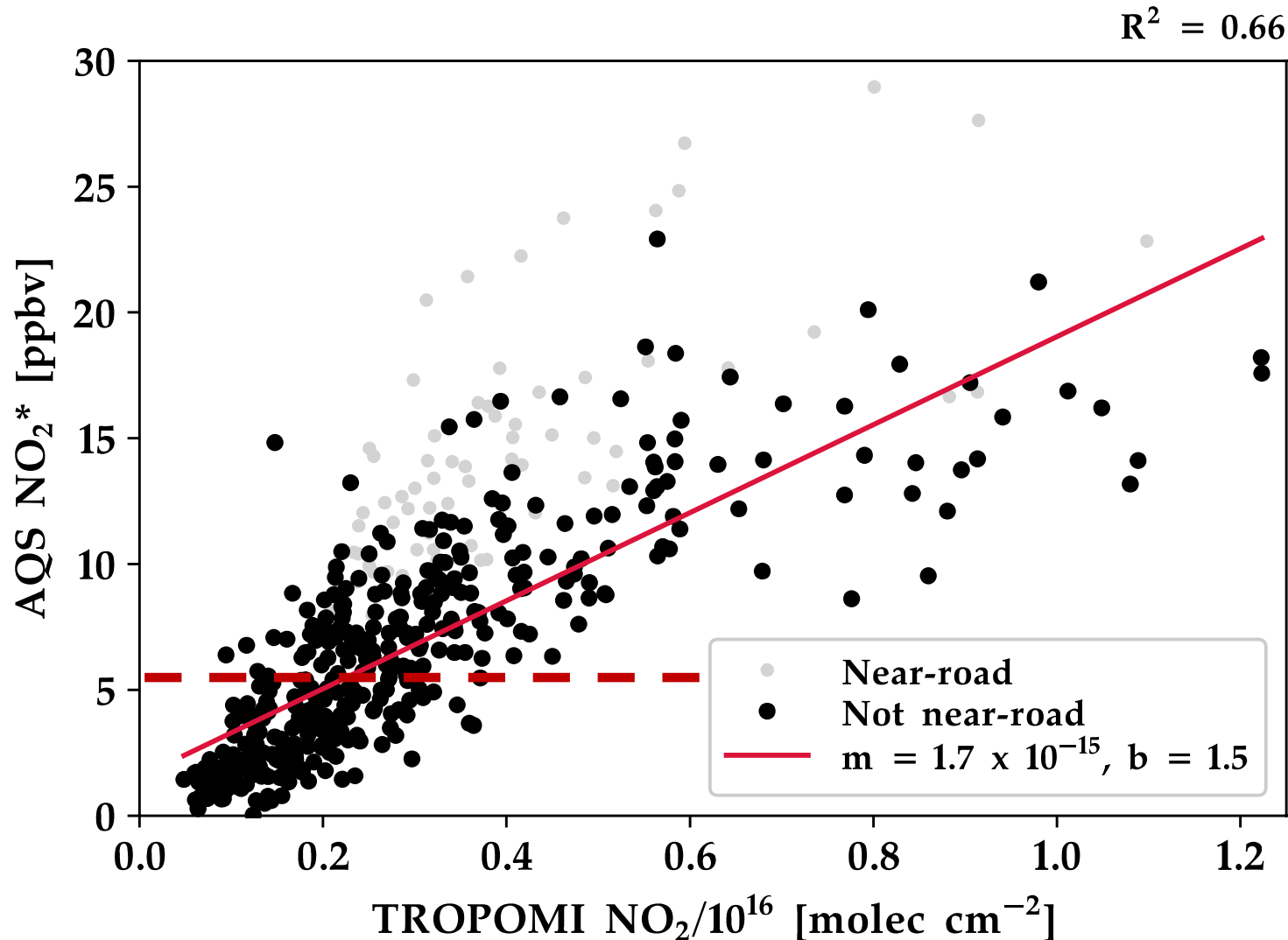


US areas with “worst” NO₂

State	Lat	Lon	Value	Detailed location
CA	34.03	-118.18	1.41E+16	E Los Angeles, CA
NY	40.72	-73.97	1.13E+16	East River, Brooklyn, NY
NJ	40.69	-74.14	9.75E+15	Port Newark, NJ
IL	41.82	-87.77	7.31E+15	Cicero, Chicago, IL (near MDW)
WA	47.46	-122.26	6.90E+15	Tukwila, WA (SE Seattle)

[Goldberg et al., 2021a](#)

TROPOMI NO₂: Great correlation with surface measurements

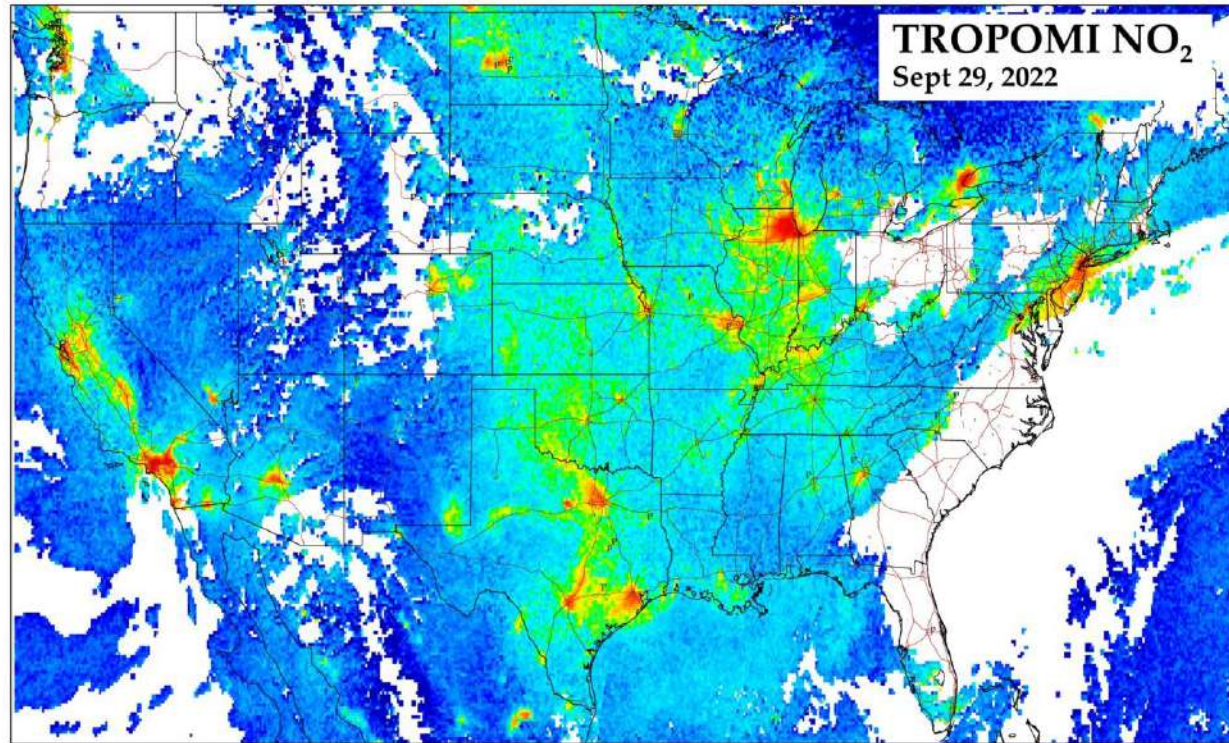


- $R^2 = 0.66$; great correlation between satellite and surface monitors
- WHO (health) guideline: 5.3 ppb
- EPA standard: 53 ppb
- 0.2×10^{16} molec cm⁻² \approx 5 ppb NO₂
- 0.5×10^{16} molec cm⁻² \approx 10 ppb NO₂
- 1.0×10^{16} molec cm⁻² \approx 18 ppb NO₂

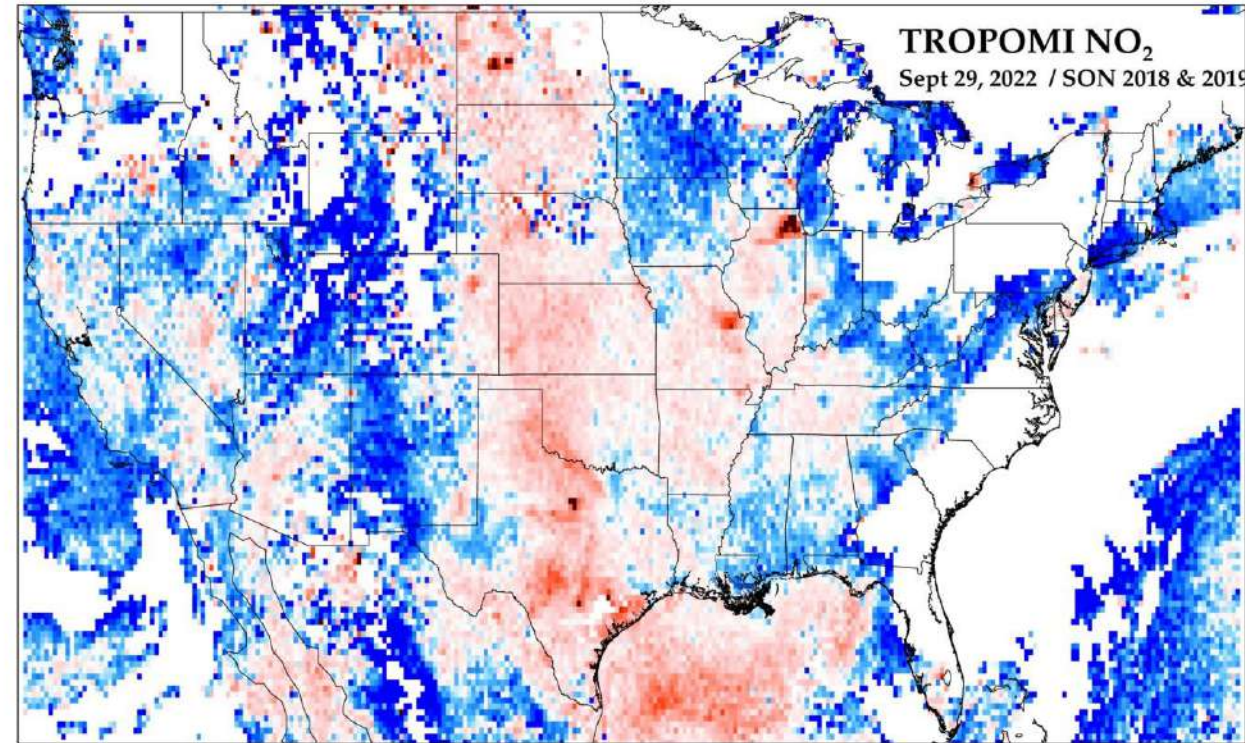
Near-real-time images of TROPOMI NO₂



tropomino2.us



0 0.5 1 2 3 5 10 + 10^{15} cm^{-2}

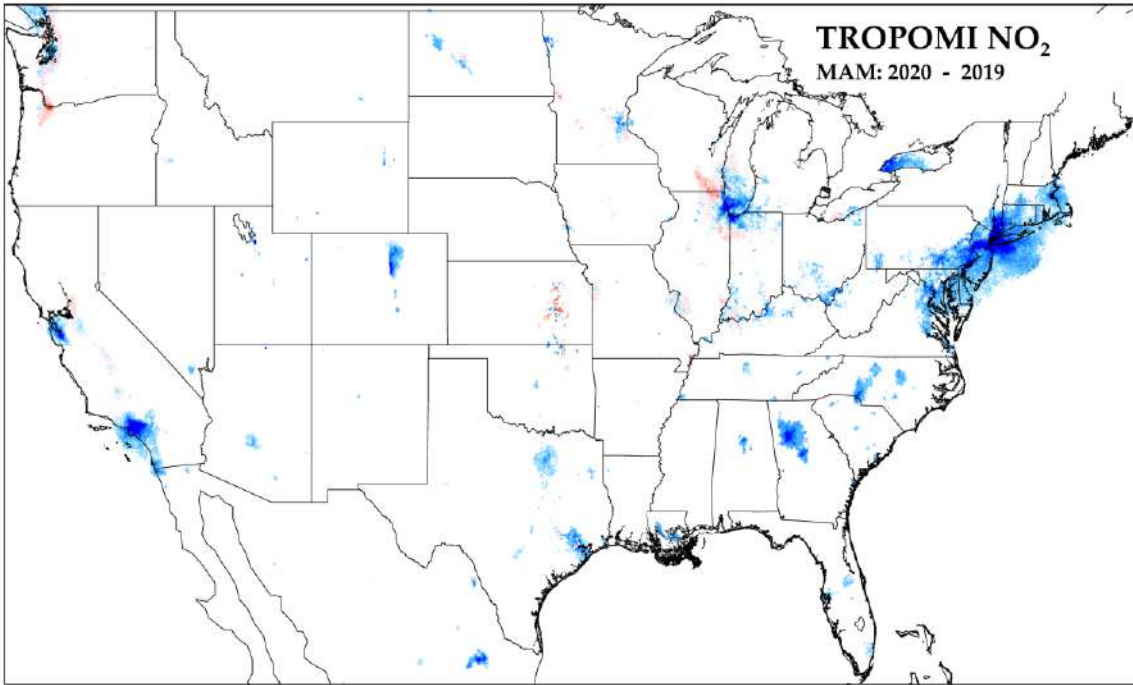


0.33 0.50 0.75 1.00 2.00 3.00 Ratio

Pandemic temporarily reduced NO₂ concentrations, but did not eliminate NO₂ disparities



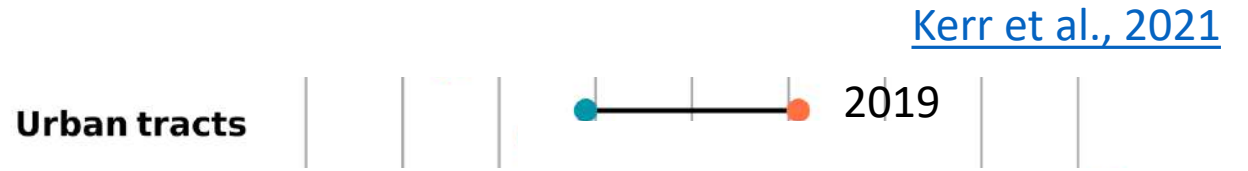
Spring 2020



NO₂ drops in most major US cities (as expected)

Values in rural areas are filtered out to highlight changes near cities

Most white Least white



NO₂ in least white communities during the pandemic exceeded levels in most white areas prior to the pandemic.

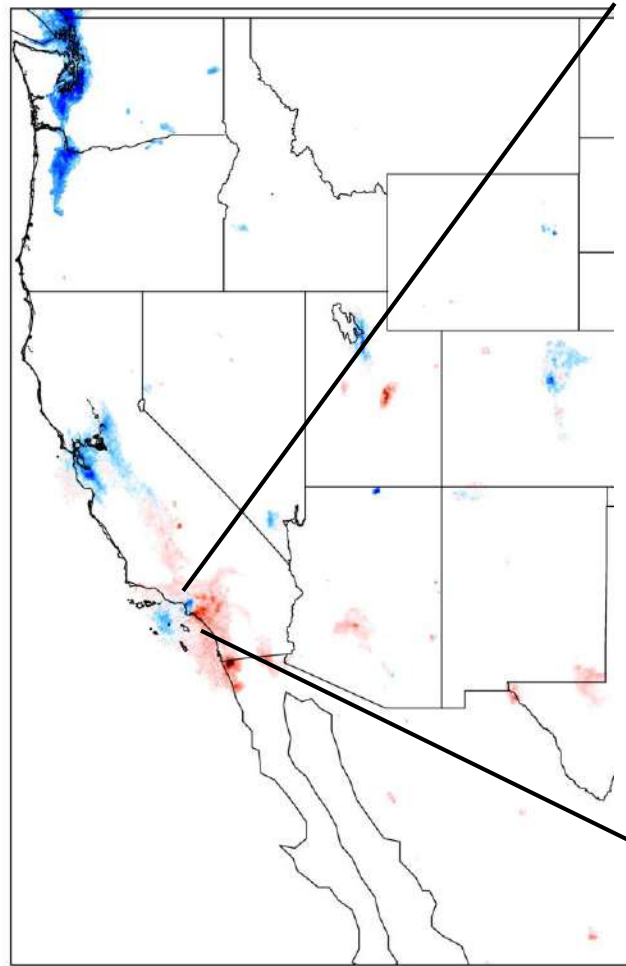
TROPOMI NO₂: Rapidly assessing changes after COVID-19

Difference between 2018 & 2019 vs. 2021

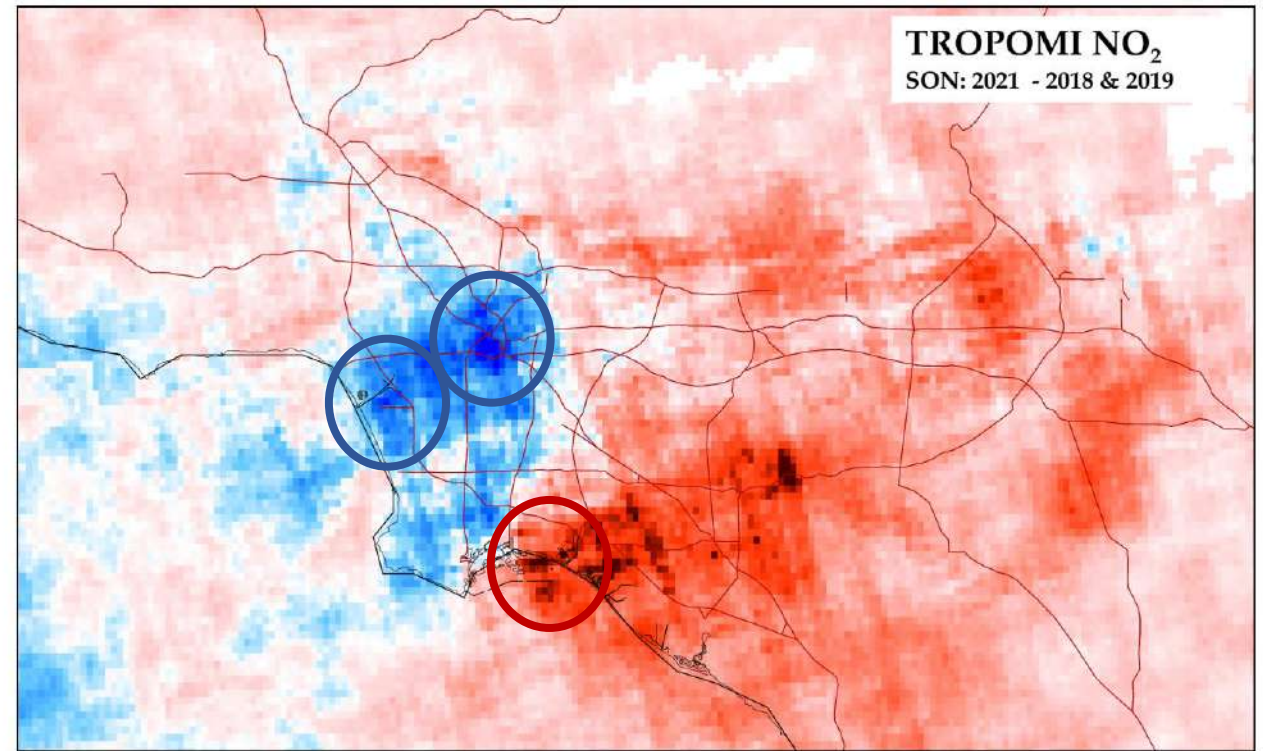


Fall 2021

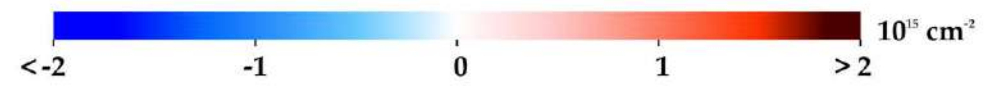
Values $< 2 \times 10^{15}$
are filtered out to
highlight changes
near cities



Los Angeles, CA: South Coast Air Basin



TROPOMI NO₂
SON: 2021 - 2018 & 2019

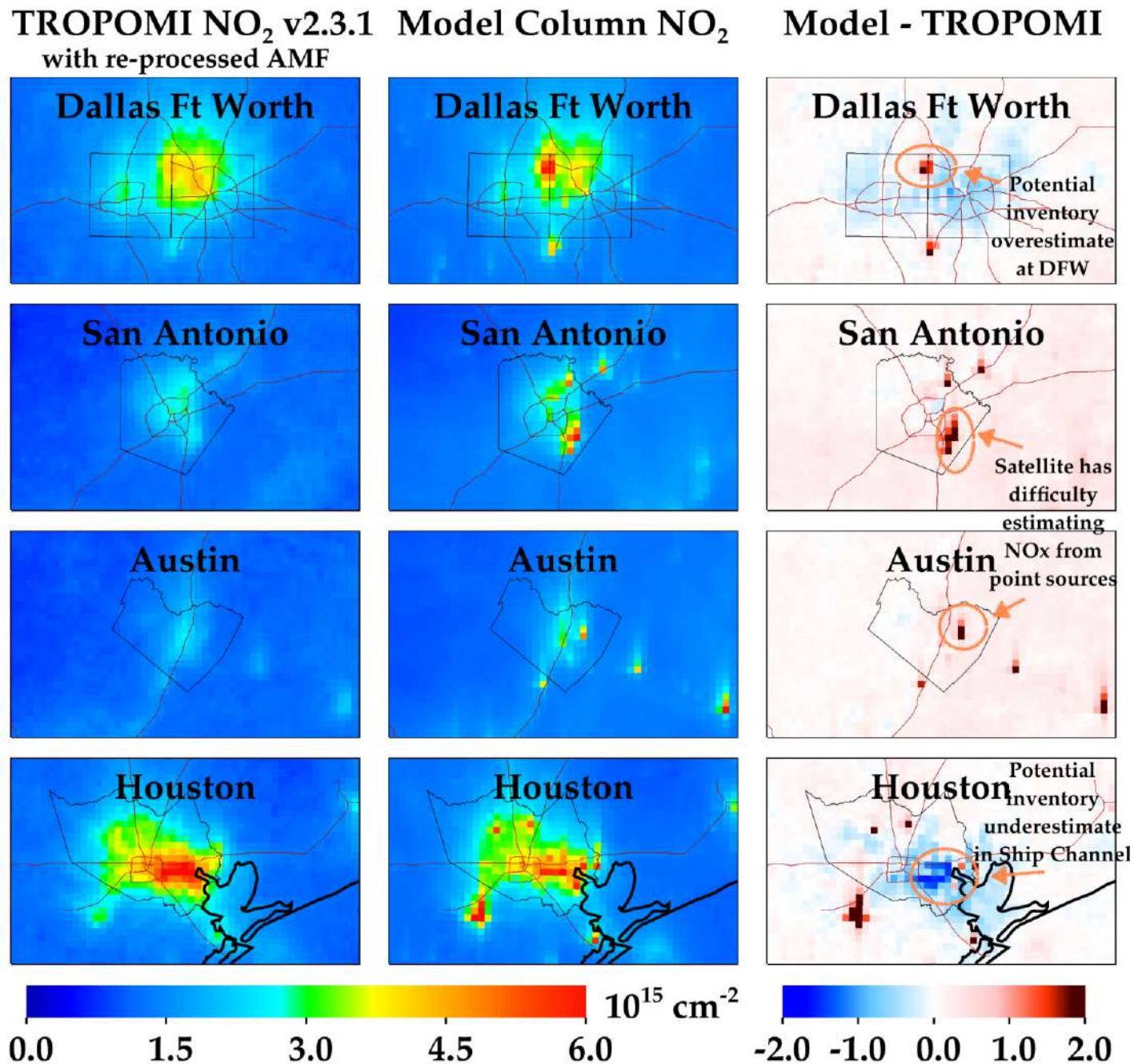


New paper published in *Atmospheric Chemistry and Physics*

[Goldberg et al., 2022](#)

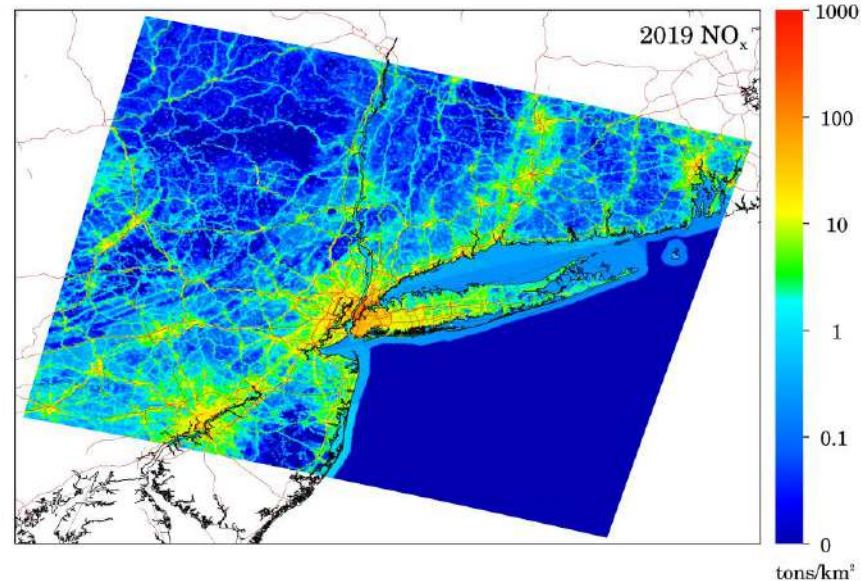
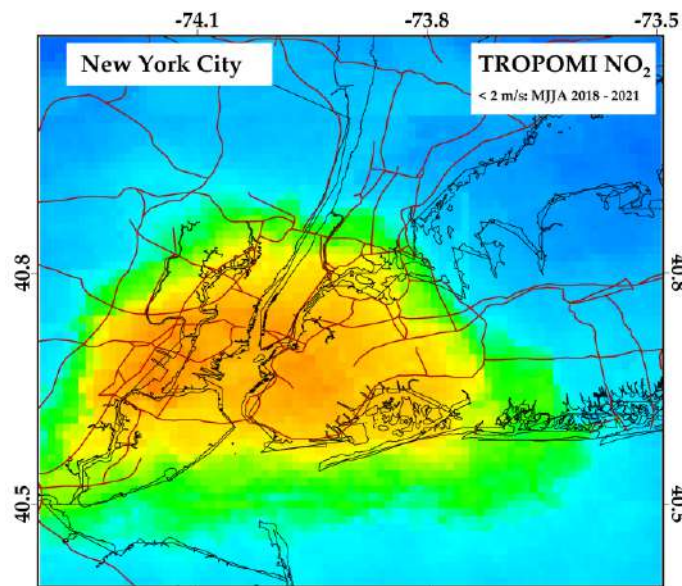
Also see [Twitter thread](#) for summary

- Satellite and inventory NO_x emissions generally agree within 20% in Texas
- Worse agreement near point sources

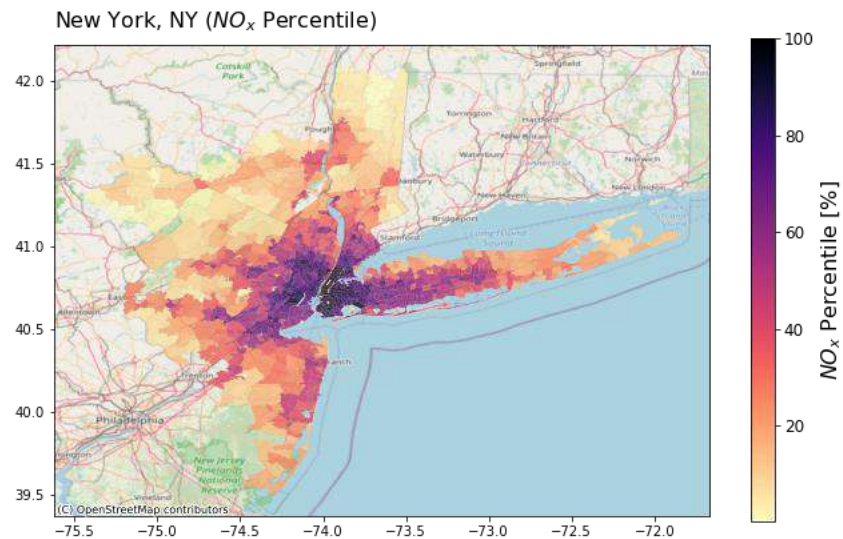
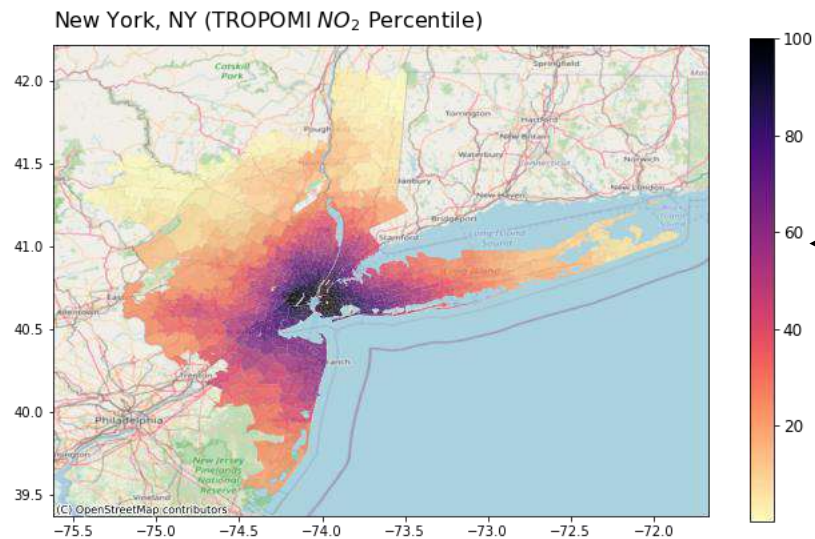


TROPOMI NO₂

vs. Gridded Emissions Inventory (1 km)



From: EPA National Emissions Inventory & Dr. Daniel Tong



Preliminary analysis, please do not cite

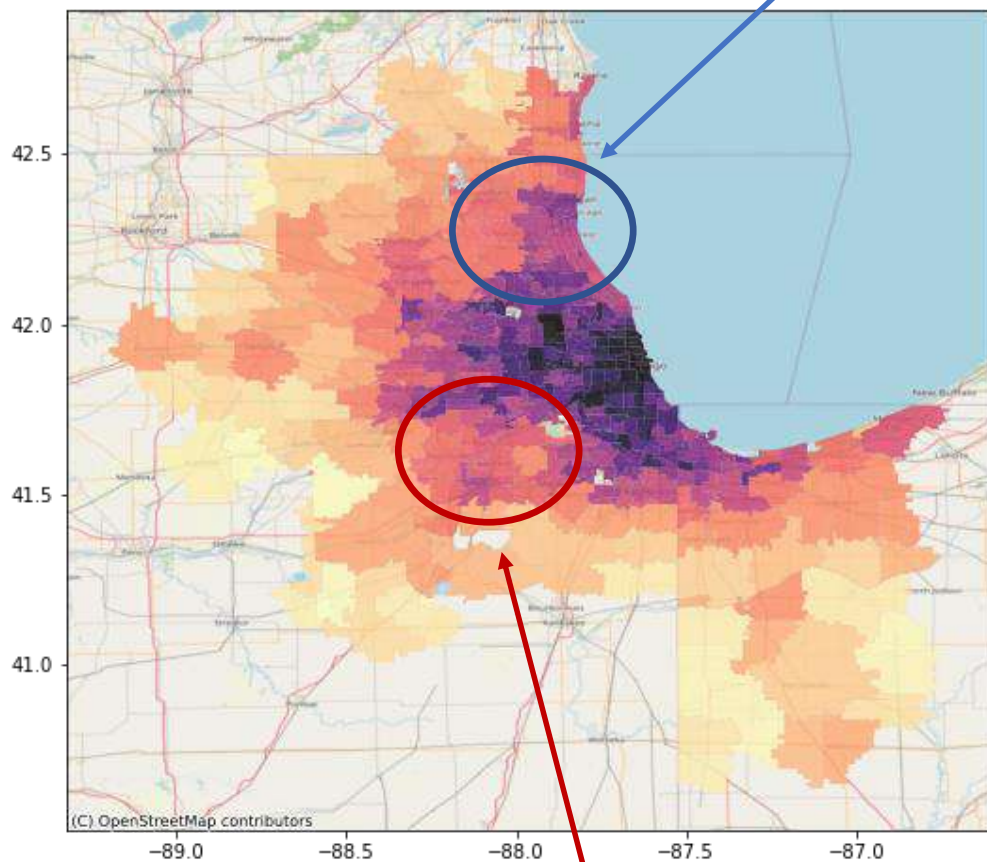
Urban NO_x comparison



NO_x inventory percentile

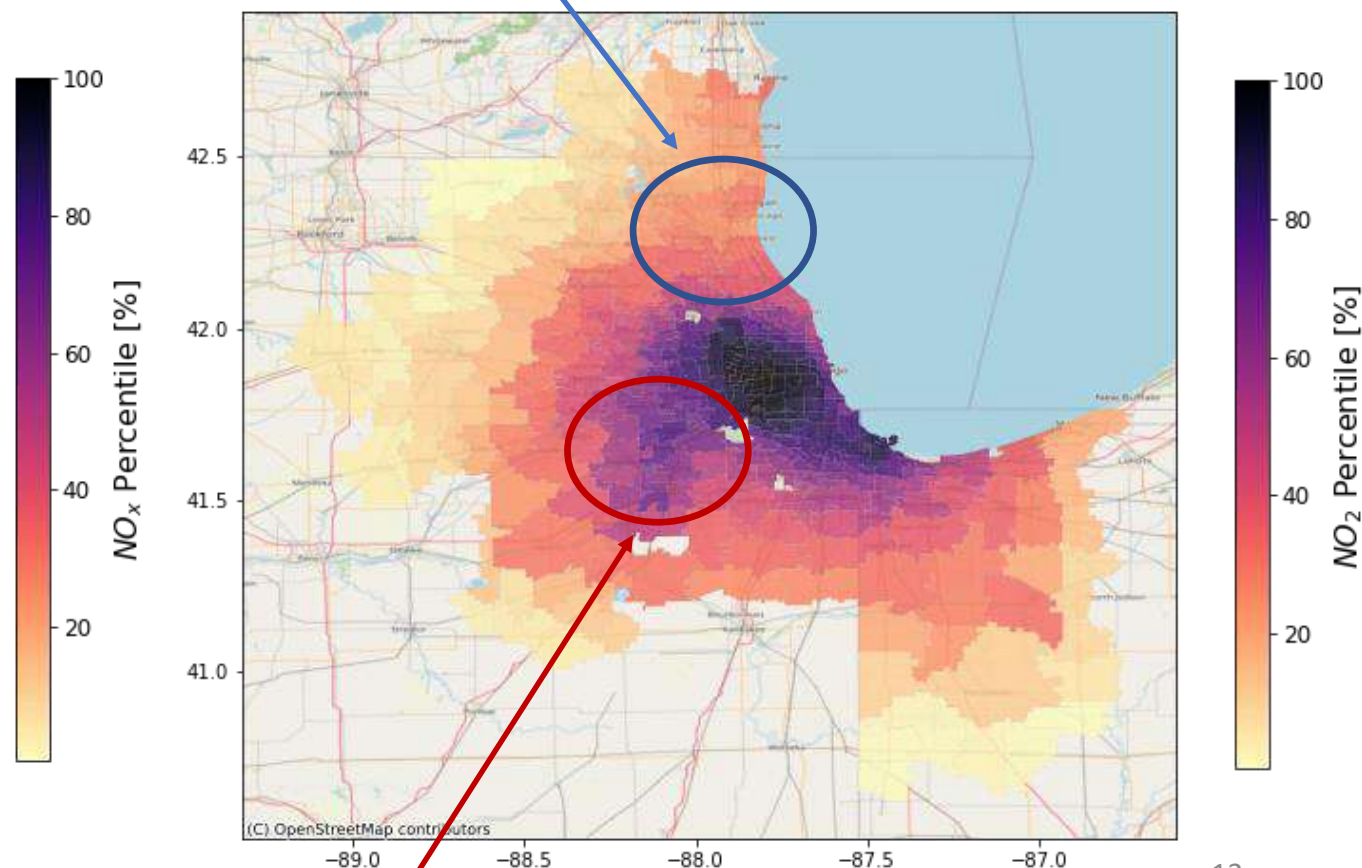
Inventory may be overestimating NO_x emissions in a wealthy neighborhood

Chicago, IL (NO_x Percentile)



NO₂ satellite percentile

Chicago, IL (TROPOMI NO₂ Percentile)



Inventory may be underestimating NO_x emissions in neighborhood with many warehouses Preliminary analysis, please do not cite

Conclusions



- Near-real-time daily TROPOMI NO₂ images are available (tropomino2.us)
- Tracking seasonal NO₂ in near-real-time (pre vs. post-COVID)
 - Urban NO₂ in East Coast cities dropped between 20 - 30% during Spring 2020
 - *Potential “super-recovery” of urban NO₂ in some cities*
- Under the right conditions, satellite NO₂ can be compared directly to NO_x emissions on annual timescales
 - NO_x emissions in most US cities (pre-COVID) when aggregated to the full metropolitan area are comparable to NO_x inventory estimates
 - Generally excellent *spatial* correlation between satellite and inventory
 - Some areas of improvement of the spatial allocation may be needed, especially if high-resolution is requested: EJ communities (near warehouses, ports, industrial areas, etc.)

Recently published papers using TROPOMI NO₂ and OMI NO₂ data



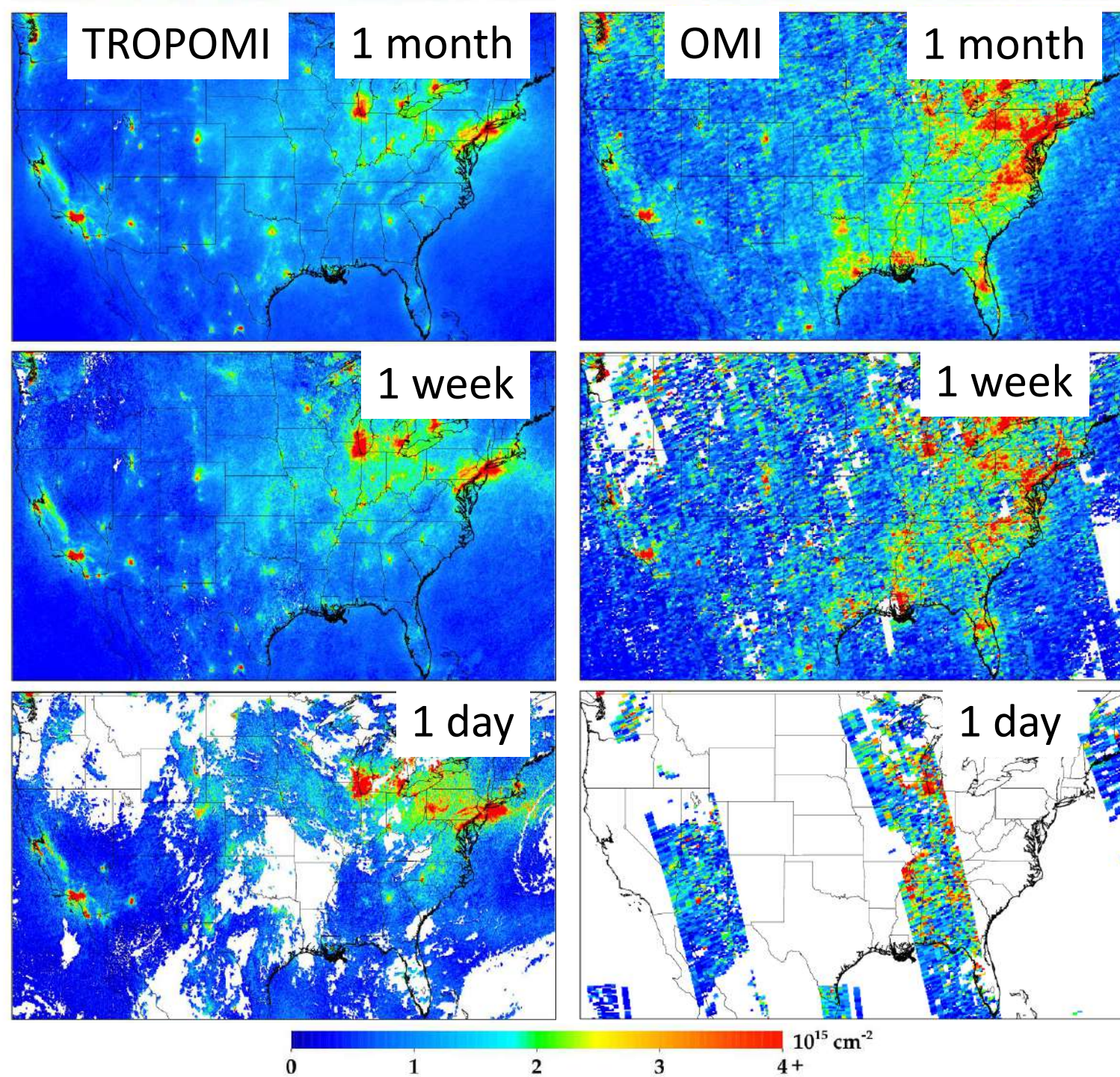
- **Goldberg, D. L.**, M. Harkey, L. Judd, B. de Foy, J. Johnson, G. Yarwood, T. A. Holloway (2022) [Evaluating NO_y emissions and their effect on O₃ production in Texas using TROPOMI NO₂ and HCHO](https://doi.org/10.5194/acp-22-10875-2022). *Atmos. Chem. Phys.*, 22, 10875–10900, <https://doi.org/10.5194/acp-22-10875-2022>
- **Kerr, G.H.**, D.L. **Goldberg**, K.E. Knowland, C.A. Keller, D. Oladini, I. Kheirbek, L. Mahoney, Z. Lu, S.C. **Anenberg** (2022) [Diesel passenger vehicle shares influenced COVID-19 changes in urban nitrogen dioxide air pollution](https://doi.org/10.1088/1748-9326/ac7659). *Environmental Research Letters*, doi: <https://doi.org/10.1088/1748-9326/ac7659>.
- Tzortziou, M., Kwong, C. F., **Goldberg, D. L.**, Schiferl, L., Commane, R., Abuhassan, N., et al. (2022). [Declines and peaks in NO₂ pollution during the multiple waves of the COVID-19 pandemic in the New York metropolitan area](https://doi.org/10.5194/acp-22-2399-2022). *Atmospheric Chemistry and Physics*, <https://doi.org/10.5194/acp-22-2399-2022>.
- Jing, P., & **Goldberg, D. L.** (2022). [Influence of conducive weather on ozone in the presence of reduced NO_x emissions: A case study in Chicago during the 2020 lockdowns](https://doi.org/10.1016/j.apr.2021.101313). *Atmospheric Pollution Research*, 13(2), 101313. <https://doi.org/10.1016/j.apr.2021.101313>.
- **Anenberg, S.C.**, A. **Mohegh**, D.L. **Goldberg**, G.H. **Kerr**, M. Brauer, K. Burkart, P. Hystad, A. Larkin, S. Wozniak, L. Lamsal (2022) [Long-term trends in urban NO₂ concentrations and associated pediatric asthma cases: estimates from global datasets](https://doi.org/10.1016/S2542-5196(21)00255-2). *Lancet Planetary Health*, [https://doi.org/10.1016/S2542-5196\(21\)00255-2](https://doi.org/10.1016/S2542-5196(21)00255-2). (Anenberg and Mohegh contributed equally)
- **Goldberg, D.L.**, S.C. **Anenberg**, L.N. Lamsal, Z. Lu, E.E. McDuffie, S.J. Smith, D.G. Streets (2021) [Urban NO_x emissions around the world declined faster than anticipated between 2005 and 2019](https://doi.org/10.1088/1748-9326/ac2c34). *Environmental Research Letters*, <https://doi.org/10.1088/1748-9326/ac2c34>. [Supplementary](#)
- **Goldberg, D.G.**, C. **Anenberg**, G.H. **Kerr**, Z. Lu, D.G. Streets (2021) [TROPOMI: A revolutionary new satellite instrument measuring NO_x air pollution](#). *EM Magazine*, September 2021.
- **Kerr, G.H.**, D.L. **Goldberg**, S.C. **Anenberg** (2021) [COVID-19 lockdowns reveal persistent disparities in nitrogen dioxide pollution levels](https://doi.org/10.1073/pnas.2022409118). *Proceedings of the National Academy of Sciences*, <https://doi.org/10.1073/pnas.2022409118>.
- Kondragunta, S., Wei, Z., McDonald, B. C., **Goldberg, D. L.** and Tong, D. Q. (2021) [COVID-19 Induced Fingerprints of a New Normal Urban Air Quality in the United States](https://doi.org/10.1029/2021JD034797), *J. Geophys. Res. Atmos.*, e2021JD034797, doi:10.1029/2021JD034797.
- **Goldberg, D.**, S. **Anenberg**, G.H. **Kerr**, A. **Mohegh**, Z. Lu, D.G. Streets (2021) [TROPOMI NO₂ in the United States: A detailed look at the annual averages, weekly cycle, effects of temperature, and correlation with surface NO₂ concentrations](https://doi.org/10.1029/2020EF001665). *Earth's Future*, <https://doi.org/10.1029/2020EF001665>.
- **Mohegh, A.**, D. **Goldberg**, P. Achakulwisut, S.C. **Anenberg** (2020) [Sensitivity of estimated NO₂-attributable pediatric asthma incidence to grid resolution and urbanicity](https://doi.org/10.1088/1748-9326/abce25). *Environmental Research Letters*, doi: 10.1088/1748-9326/abce25.
- **Goldberg, D.L.**, S.C. **Anenberg**, D. Griffin, C.A. McLinden, Z. Lu, D.G. Streets (2020) [Disentangling the impact of the COVID-19 lockdowns on urban NO₂ from natural variability](https://doi.org/10.1029/2020GL089269). *Geophysical Research Letters*, <https://doi.org/10.1029/2020GL089269>.
- **Goldberg, D. L.**, Z. Lu, T. Oda, L. N. Lamsal, F. Liu, D. Griffin, C. A. McLinden, N. A. Krotkov, B. N., Duncan, D. G. Streets (2019), [Exploiting OMI NO₂ satellite observations to infer fossil-fuel CO₂ emissions from U.S. megacities](https://doi.org/10.1016/j.scitotenv.2019.133805), *Sci. Tot., Environ.*, 695, 133805, <https://doi.org/10.1016/j.scitotenv.2019.133805>.
- **Goldberg, D. L.**, Lu, Z., Streets, D. G., de Foy, B., Griffin, D., McLinden, C. A., Lamsal, L. N., Krotkov, N. A. and Eskes, H. (2019) [Enhanced Capabilities of TROPOMI NO₂: Estimating NO_x from North American Cities and Power Plants](https://doi.org/10.1021/acs.est.9b04488), *Sci. Technol.*, acs.est.9b04488, doi:10.1021/acs.est.9b04488.

New technology vs. Older technology

Left column – **TROPOMI**:
Launched Fall 2017; 5.5 x 3.5
km² spatial resolution

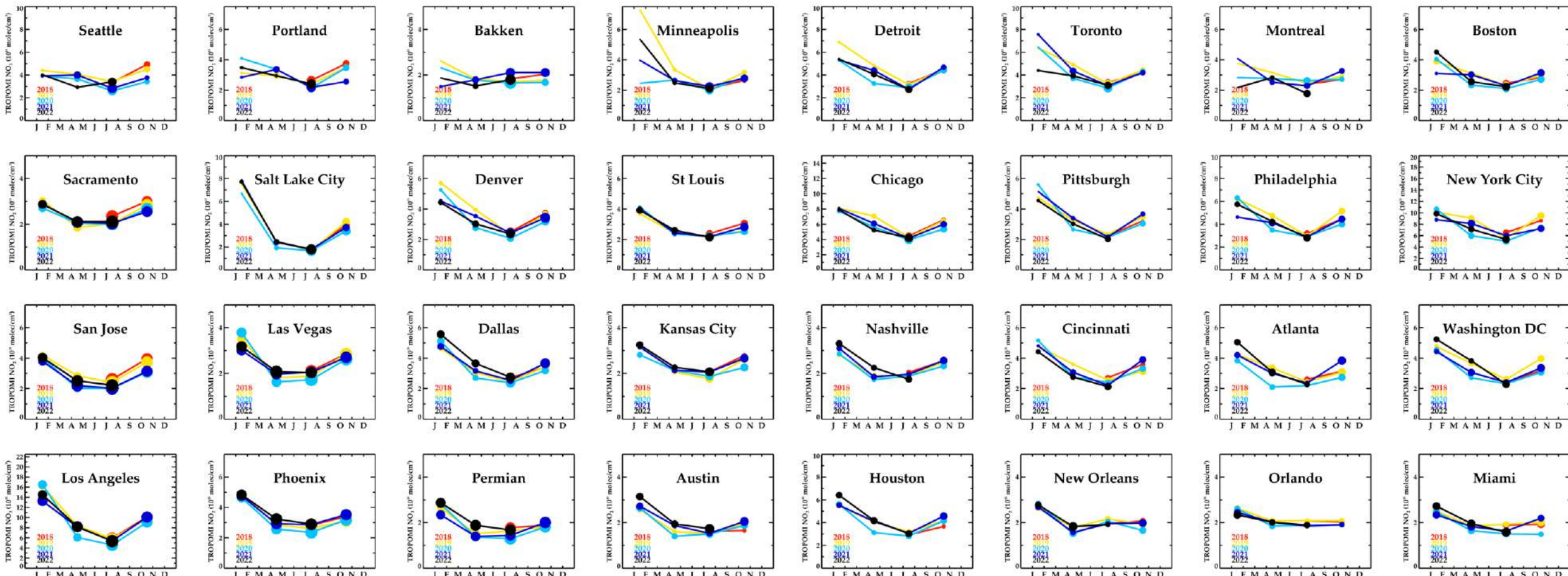
Right column: **OMI**: Launched
Summer 2004; 24 x 13 km²
spatial resolution

Higher spatial resolution and
less instrument noise with
TROPOMI, which comes at
expense of having a shorter
data record (only since 2018)



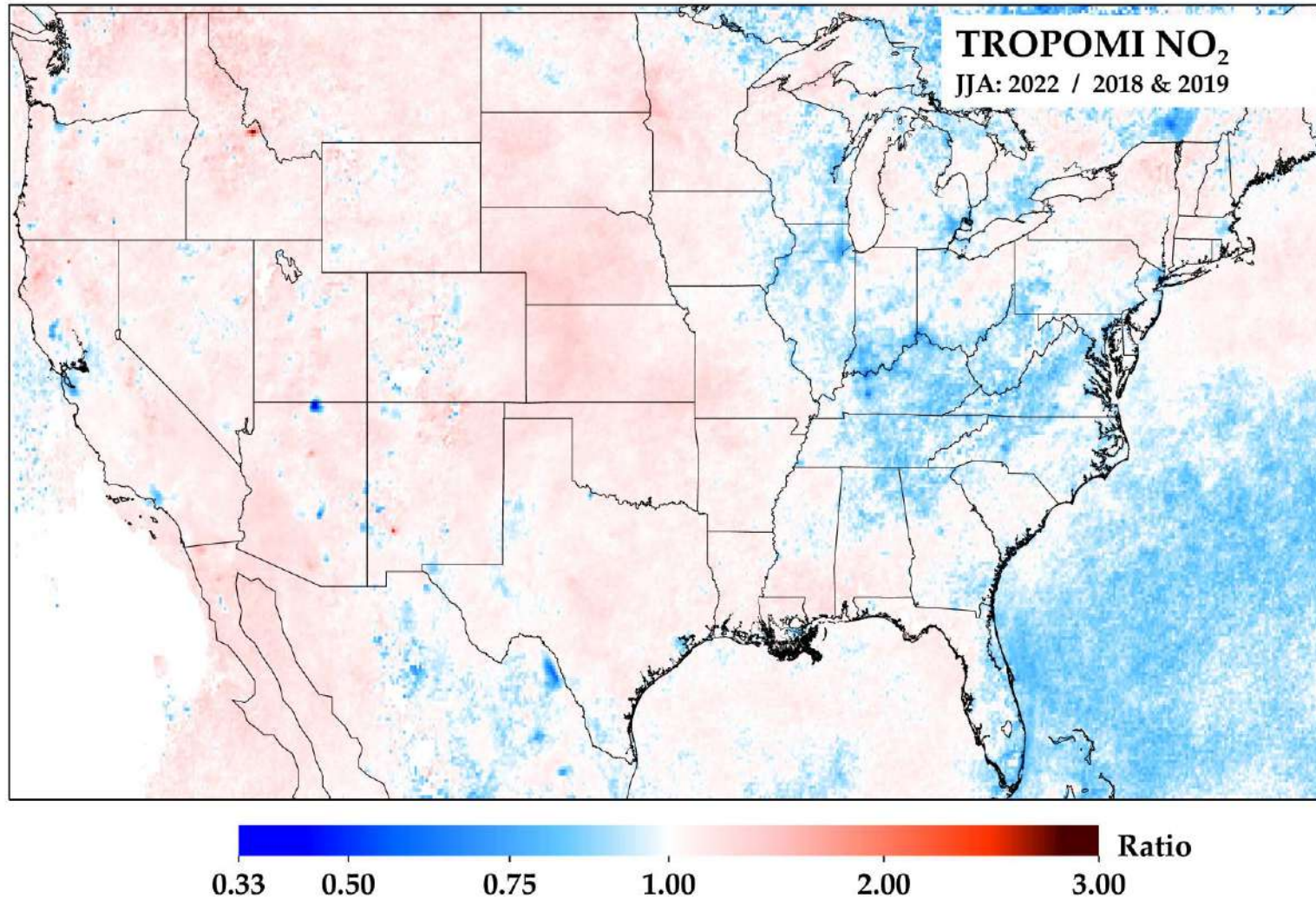
TROPOMI NO₂: Rapidly assessing changes after COVID-19

Difference between 2018 vs. 2019 vs. 2020 vs. 2021 vs. 2022

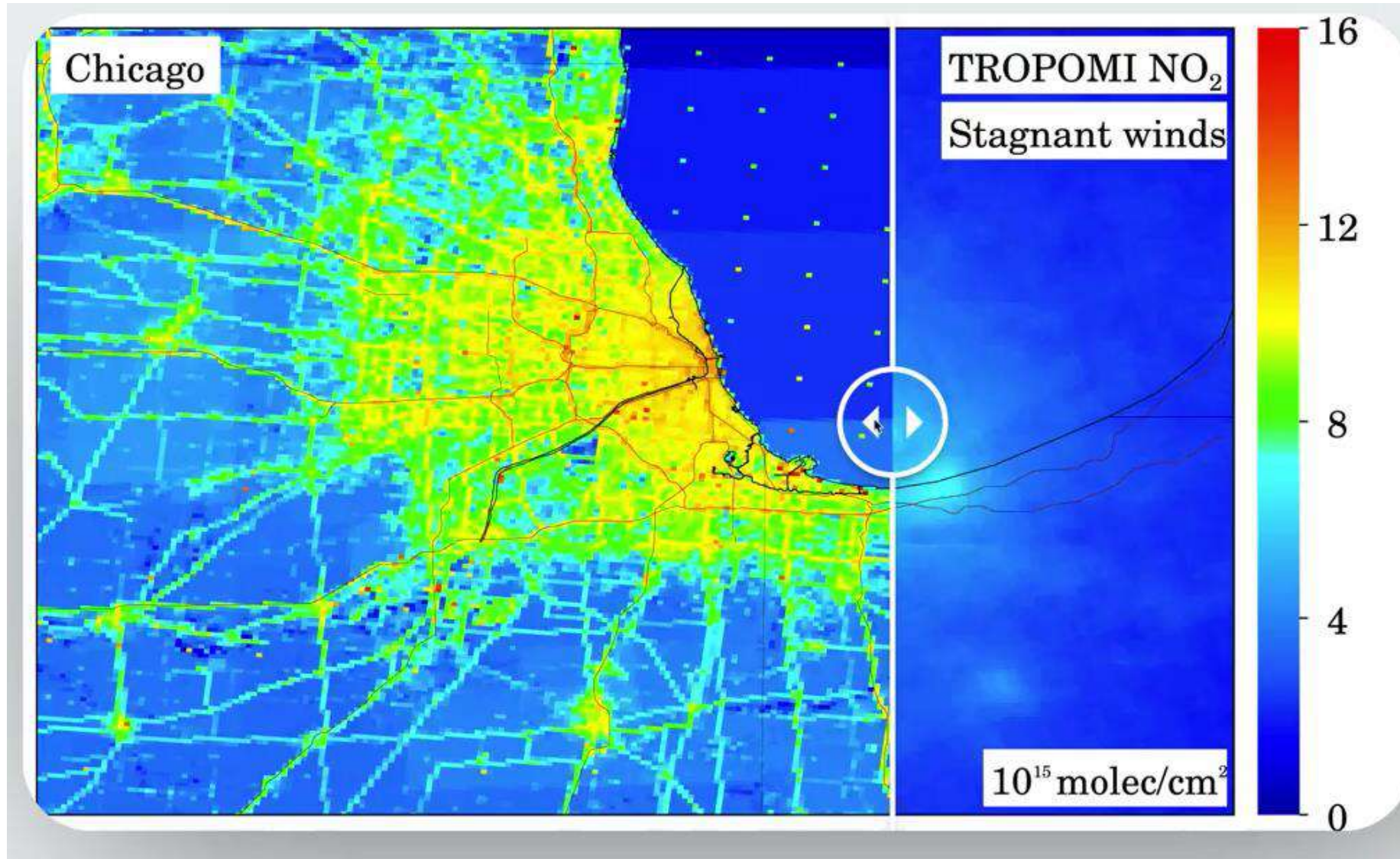


TROPOMI NO₂: Rapidly assessing changes after COVID-19

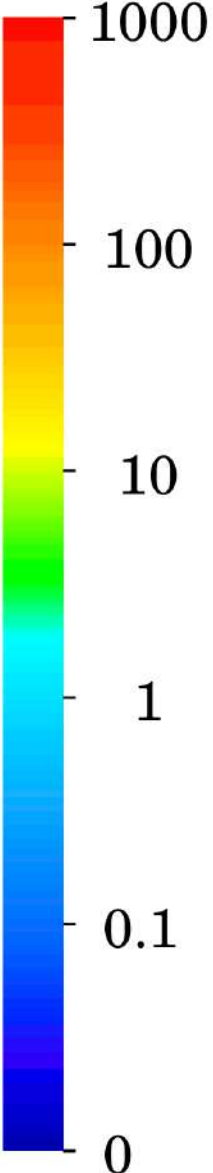
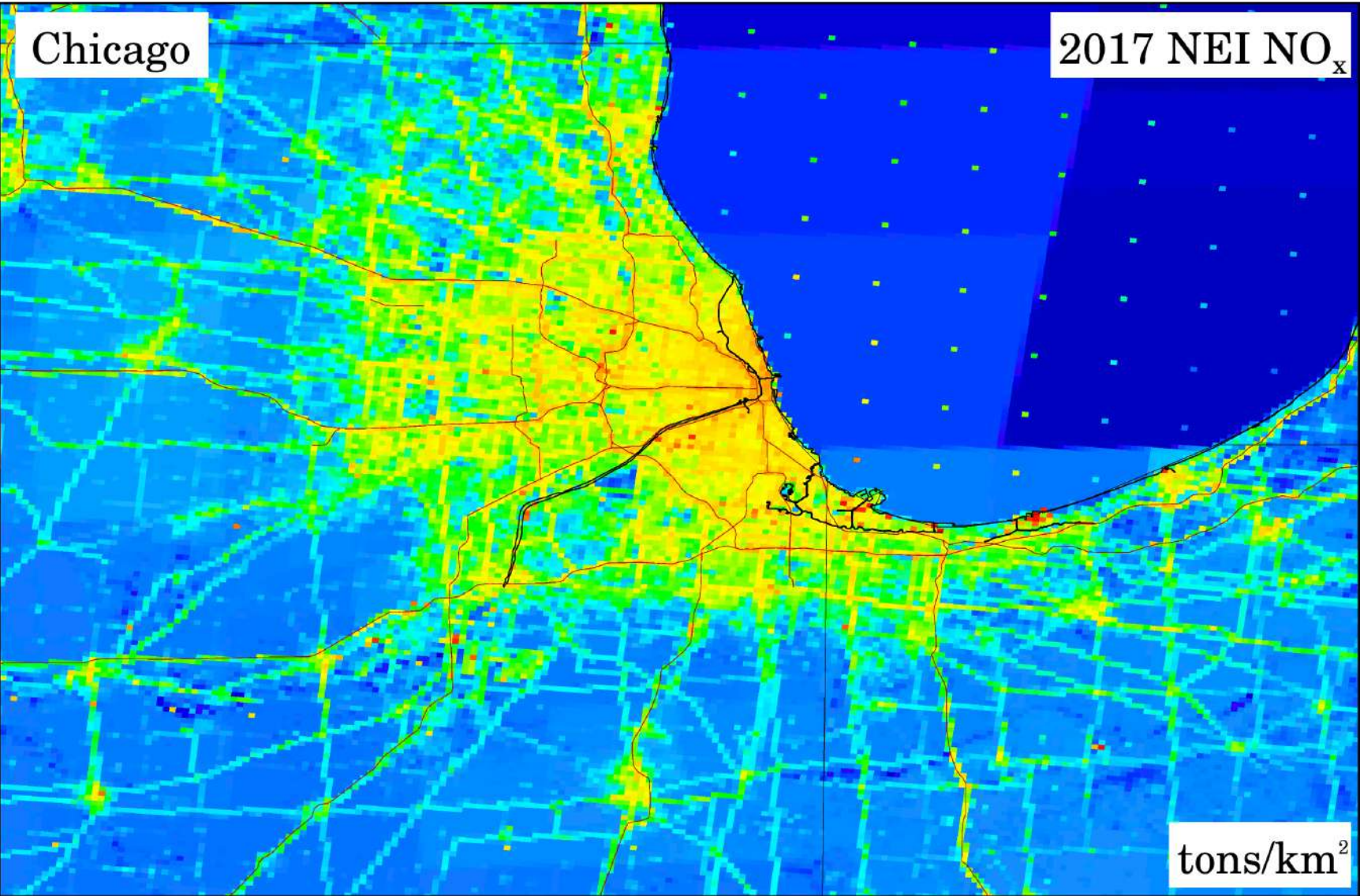
Difference between 2018 vs. 2019 vs. 2020 vs. 2021 vs. 2022

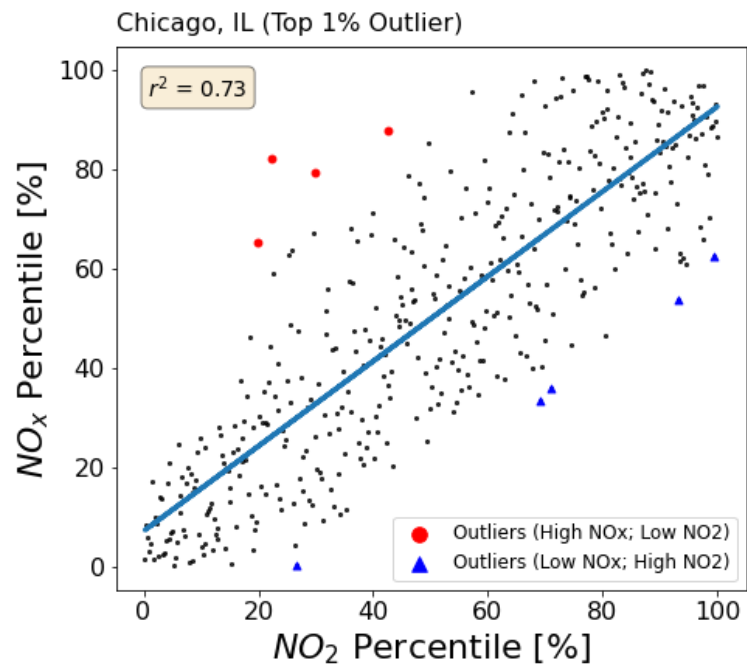
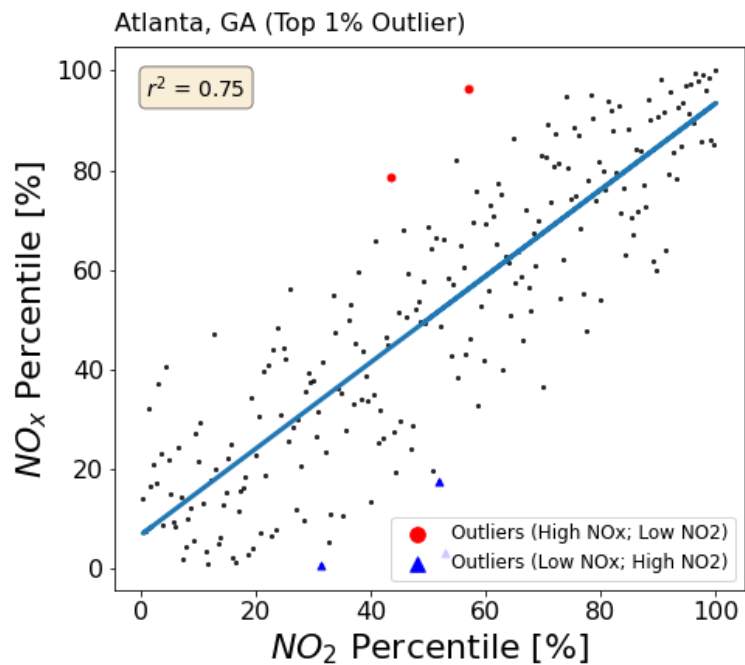
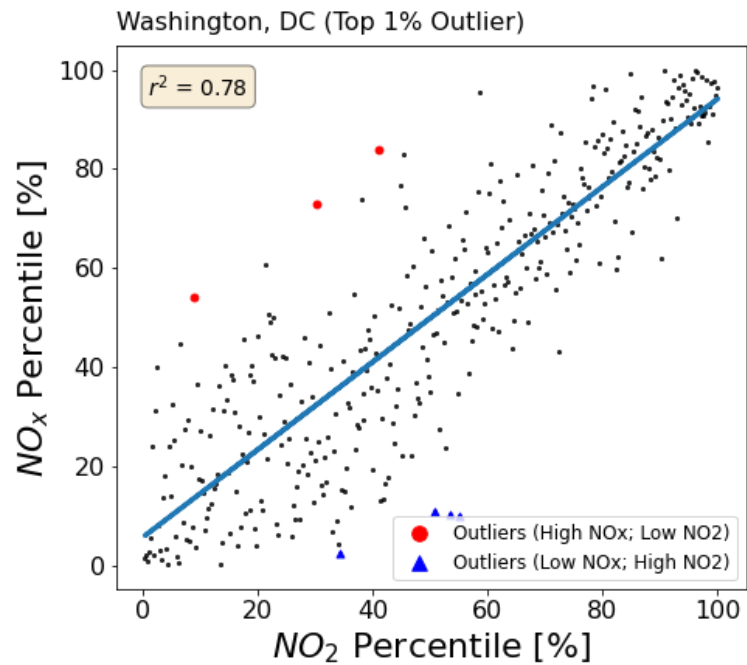
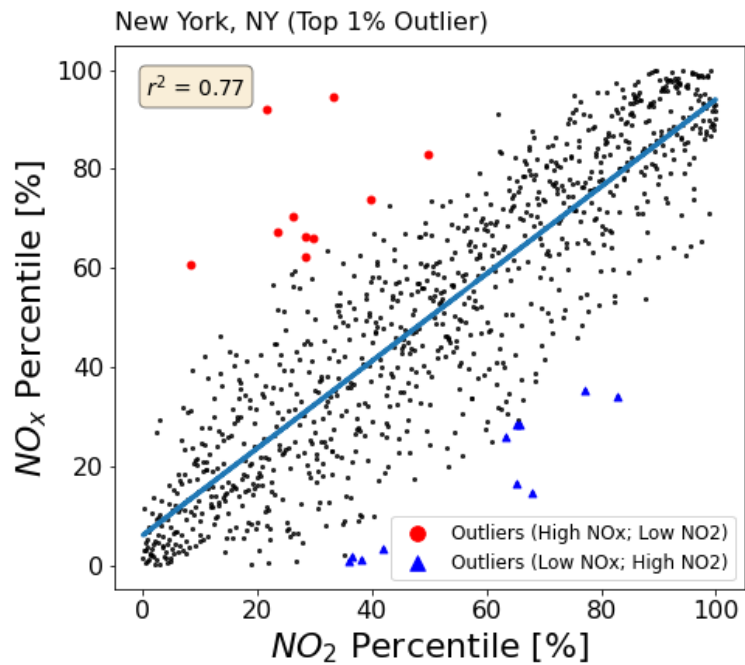


Urban NOx comparison



Urban NOx comparison (Back-up)





Great agreement between TROPOMI NO₂ and the spatial allocation of the NEI NO_x emissions inventory ($r^2 > 0.7$)

Red = potential NO_x inventory overestimate
OR satellite has difficulty observing source

Blue = potential NO_x inventory underestimate
OR NO₂ outflow from nearby source

Many of the "red" points are locations of point sources, and some of the "blue" points are locations with no/little emissions, but nearby very large emission sources (e.g., Central Park in NYC)

Sector-inventory of NOx emissions

**2017 NOx EMISSIONS: EPA NATIONAL EMISSIONS INVENTORY
11.8 MILLION TONS PER YEAR**

