



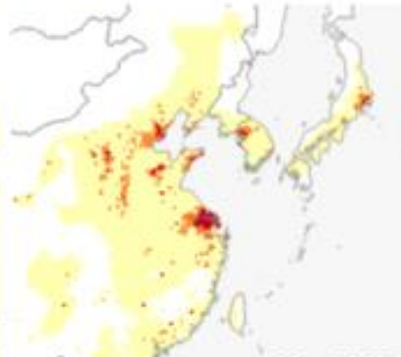
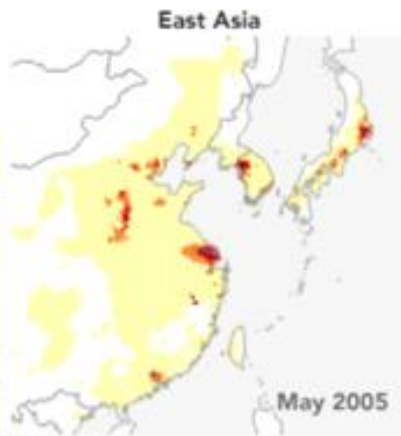
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Broadening Access to Satellite Data

The NASA Health and Air Quality Applied Sciences Team (HAQAST)
Tracey Holloway, HAQAST Team Lead, University of Wisconsin—Madison





earth
observatory



Satellite Tracks Ozone Pollution by Monitoring Its Key Ingredients

NO_x-limited

Transitional

NO_x-saturated

2005 - 2015

Some theoretical results concerning O₃-NO_x-VOC chemistry and NO_x-VOC indicators

Sanford Sillman and Dongyang He

Department of Atmospheric, Oceanic and Space Sciences, University of Michigan, Ann Arbor, Michigan, USA

Geophysical Research Letters / Volume 31, Issue 6

Atmospheric Science | [Free Access](#)

Space-based diagnosis of surface ozone sensitivity to anthropogenic emissions

Randall V. Martin , Arlene M. Fiore, Aaron Van Donkelaar

First published: 24 March 2004

Application of OMI observations to a space-based indicator of NO_x and VOC controls on surface ozone formation

[Bryan N. Duncan](#)^a  , [Yasuko Yoshida](#)^{a, b}, [Jennifer R. Olson](#)^c, [Sanford Sillman](#)^d, [Randall V. Martin](#)^{e, f}, [Lok Lamsal](#)^g, [Yongtao Hu](#)^g, [Kenneth E. Pickering](#)^g, [Christian Retscher](#)^{a, b}, [Dale J. Allen](#)^h, [James H. Crawford](#)^c

2002

2004

2010

Integrating Satellite Data into Air Quality Management: Experience from Colorado

by Sarah Witman and Tracey Holloway, University of Wisconsin-Madison; and Patrick J. Reddy, Colorado Department of Public Health and Environment

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2014

Spatial and temporal variability of ozone sensitivity over China observed from the Ozone Monitoring Instrument

Xiaomeng Jin¹ and Tracey Holloway¹

Evaluating a Space-Based Indicator of Surface Ozone-NO_x-VOC Sensitivity Over Midlatitude Source Regions and Application to Decadal Trends

Xiaomeng Jin¹ , Arlene M. Fiore¹ , Lee T. Murray² , Lukas C. Valin³ , Lok N. Lamsal^{4,5} , Bryan Duncan⁴, K. Folkert Boersma^{6,7}, Isabelle De Smedt⁸ , Gonzalo Gonzalez Abad⁹ , Kelly Chance⁹ , and Gail S. Tonnesen¹⁰

2015

2017

Inferring Changes in Summertime Surface Ozone–NO_x–VOC Chemistry over U.S. Urban Areas from Two Decades of Satellite and Ground-Based Observations

Xiaomeng Jin*, Arlene Fiore, K. Folkert Boersma, Isabelle De Smedt, and Lukas Valin

Cite this: *Environ. Sci. Technol.* 2020, 54, 11, 6518–6529

Publication Date: April 29, 2020

<https://doi.org/10.1021/acs.est.9b07785>

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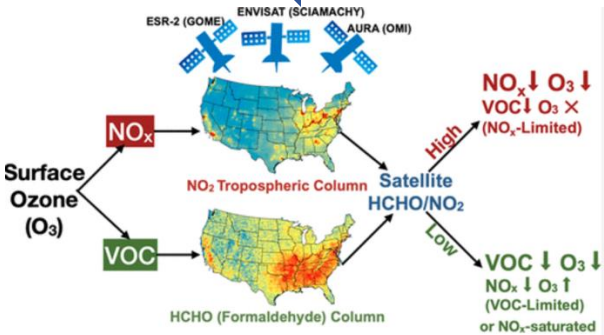
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Investigating Changes in Ozone Formation Chemistry during Summertime Pollution Events over the Northeastern United States

Madankui Tao*, Arlene M. Fiore, Xiaomeng Jin, Luke D. Schiferl, Róisín Commane, Laura M. Judd, Scott Janz, John T. Sullivan, Paul J. Miller, Alexandra Karambelas, Sharon Davis, Maria Tzortziou, Lukas Valin, Andrew Whitehill, Kevin Civerolo, and Yuhong Tian

Cite this: *Environ. Sci. Technol.* 2022, 56, 22, 15312–15327

Publication Date: October 11, 2022

<https://doi.org/10.1021/acs.est.2c02972>

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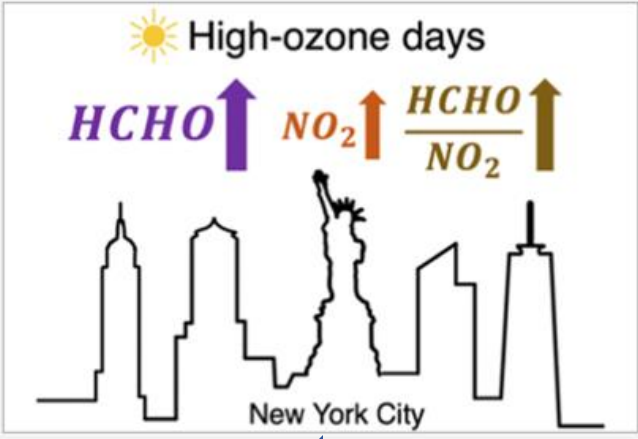


Table 1: Overview of ease of use (green/E: easy, yellow/M: medium, red/D: difficult; based on author judgement for users without programming experience), analysis capabilities and datasets available relevant to ozone sensitivity analysis including temporal averaging, division across variables, and inclusion of TROPOMI data (green/Y: yes, red/N: no) of five satellite data visualization tools: NASA Worldview, NASA Giovanni, NASA Panoply, Google Earth Engine, and flexible data analysis software including Python, IDL, R, Matlab, and other related environments.

	<i>Ease of Use</i>	<i>Allows time averaging (2+ days)</i>	<i>Allows division among variables</i>	<i>Includes TROPOMI</i>
<i>NASA Worldview</i>	E	N	N	N
<i>NASA Giovanni</i>	E	Y	N	N
<i>Panoply</i>	E	N	Y	Y
<i>Google Earth Engine</i>	M	Y	Y	Y
<i>Python, IDL, R, Matlab, etc.</i>	D	Y	Y	Y

Satellite Data to Inform Ozone Sensitivity: A Practical Methodology Using Google Earth Engine

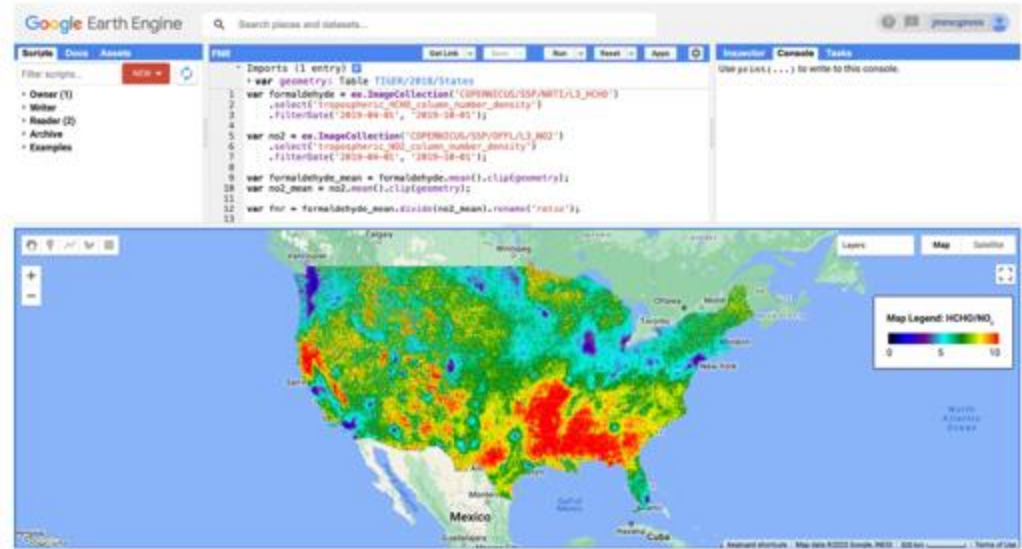
Authors: Jennifer McGinnis, Tracey Holloway, Jenny Bratburd, Madankui Tao, and Arlene Fiore

*Accepted - EM for
Special Issue on Ozone*



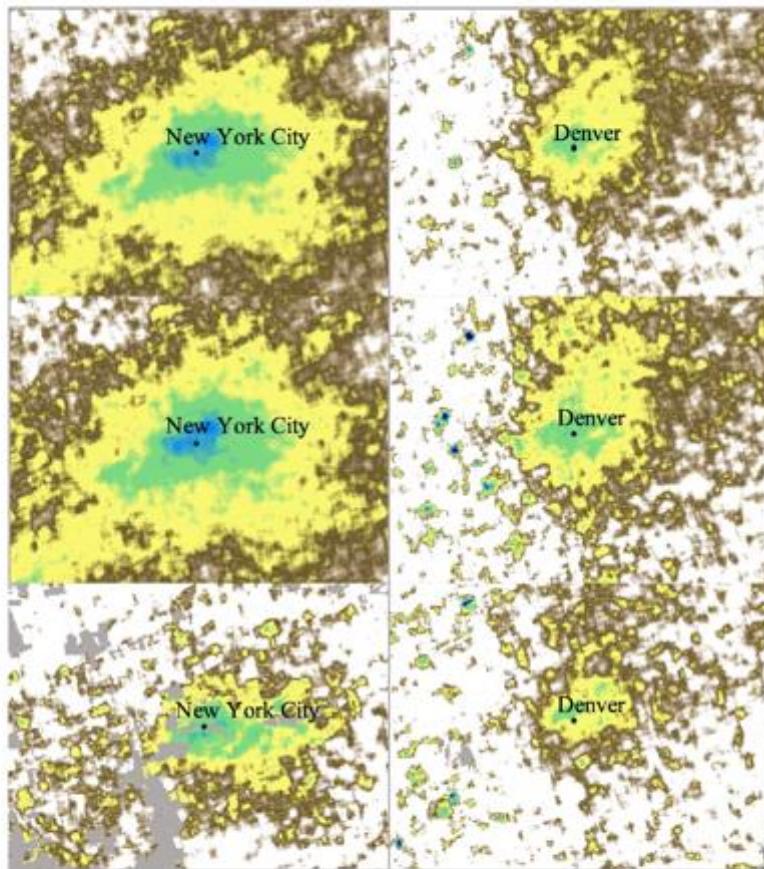
Using Google Earth Engine to Evaluate Ozone Sensitivity

- Google Earth Engine offers the most user-friendly approach for analyzing the best-available global satellite data for HCHO and NO₂ from TROPOMI
- Range of analyses useful in analyzing ozone sensitivities, including:
 - Plotting averages of consecutive or nonconsecutive dates
 - Calculating the product or ratio of variables

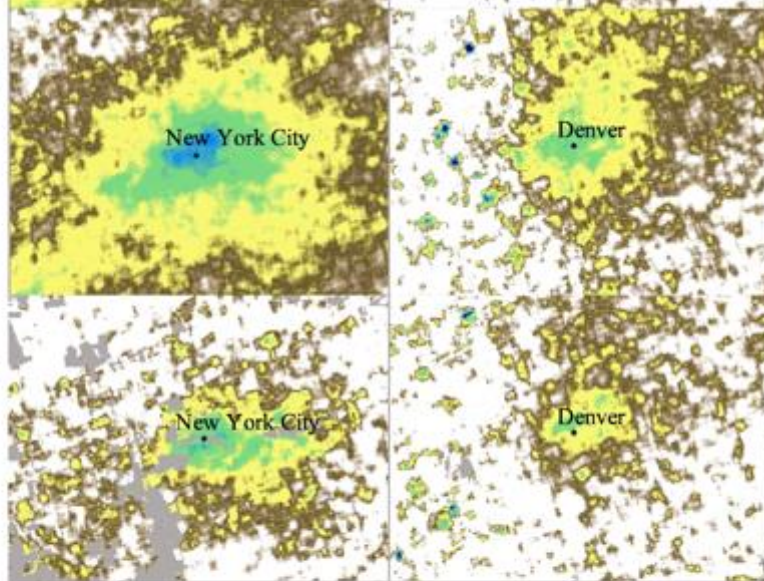


Screenshot of the doe editor available in Google Earth Engine with example code and imagery

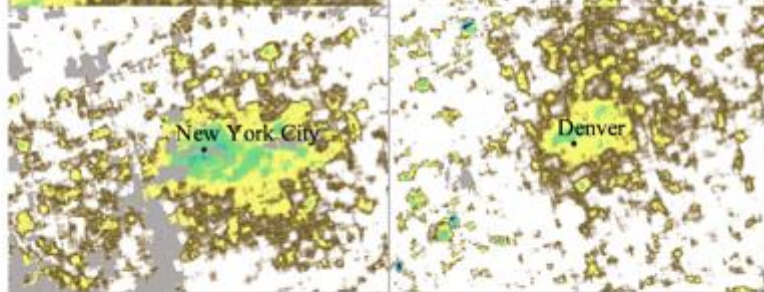
a) FNR on All Days in Ozone Season



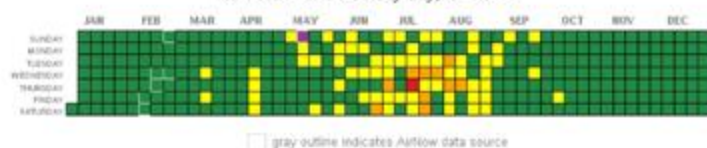
b) FNR on Lower-Ozone Days



c) FNR on Higher-Ozone Days



Ozone Daily AQI Values in 2022
New York-Newark-Jersey City, NY-NJ-PA



Ozone Daily AQI Values in 2022
Denver-Aurora-Lakewood, CO

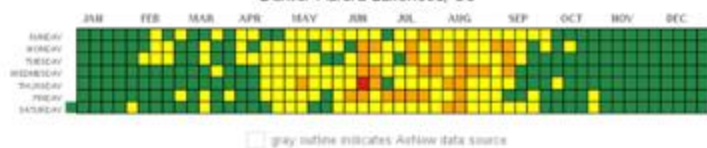


Figure 3: Daily ozone AQI values for 2022 from EPA Outdoor Air Quality Data Viz Tools, Single Year Tile Plot, for the New York City MSA (New York, NY; Newark, NJ; and Jersey City, PA; top) and the Denver MSA (Denver, Aurora, and Lakewood, CO; bottom). For this analysis, green/Good and yellow/Moderate are considered lower-ozone days; all day orange/Unhealthy for Sensitive Groups or higher (0.071 ppm or higher) are considered higher-ozone days.

Source: <https://www.epa.gov/outdoor-air-quality-data/air-data-tile-plot>

Figure 4: Because the quality assurance of NO₂ is more selective than that of HCHO, in some areas there are a different number of available days of NO₂ in comparison to HCHO. However, a mask was applied to ensure at least 10 pixels of NO₂ data and HCHO data were temporally averaged before calculating the ratio. (a) FNR average of all days during the ozone season. Over New York City (left), 153 days were plotted (mean of 112 days of NO₂ and 127 days of HCHO available per pixel). Over Denver (right), 153 days were plotted (mean of 105 days of NO₂ and 109 days of HCHO available per pixel). (b) FNR on days categorized as lower-ozone days during the ozone season. Over New York City, 141 days were plotted (mean of 100 days of NO₂ and 114 days of HCHO available per pixel). Over Denver, 118 days were plotted (mean of 72 days of NO₂ and 76 days of HCHO available per pixel). (c) FNR on days categorized as higher-ozone days during the ozone season. Over New York City, 12 days were plotted (mean of 12 days of NO₂ and 12 days of HCHO available per pixel). Over Denver, 35 days were plotted (mean of 32 days of NO₂ and 32 days of HCHO available per pixel).

1. New York City, New York

Higher ozone days are
more NO_x-limited
(all TROPOMI years)

Map Legend: FNR

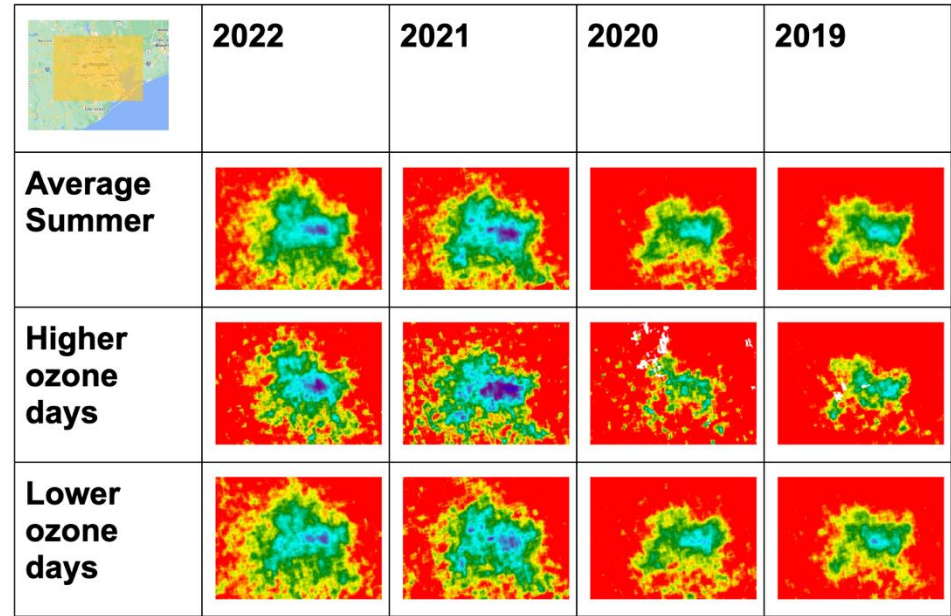


	2022	2021	2020	2019
Average Summer				
+ Higher ozone days				
Lower ozone days				

< 3.2 = VOC-limited
 3.2 - 4.1 = Transitional
 > 4.1 are NO_x-limited
Thresholds from Jin et al. (2020)

DRAFT from Raghad Bajouda via Google Earth

4. Houston, Texas



Higher ozone days can
be more NO_x-limited or
more VOC-limited

Map Legend: FNR



< 3.2 = VOC-limited

3.2 - 4.1 = Transitional

> 4.1 are NO_x-limited

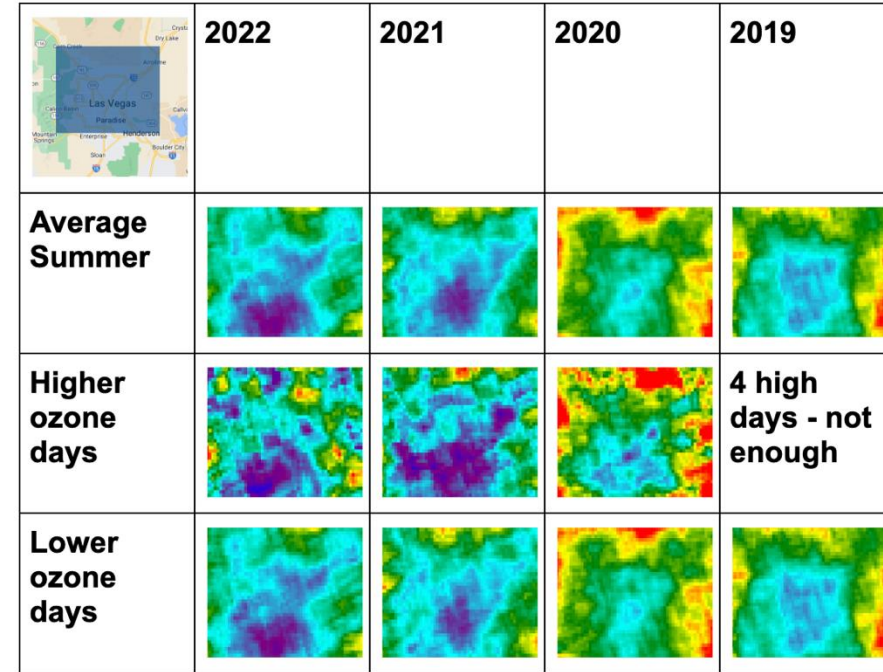
Thresholds from Jin et al. (2020)

DRAFT from Raghad Bajouda via Google Earth

24. Las Vegas, Nevada

Higher ozone days are
be more VOC-limited

Map Legend: FNR



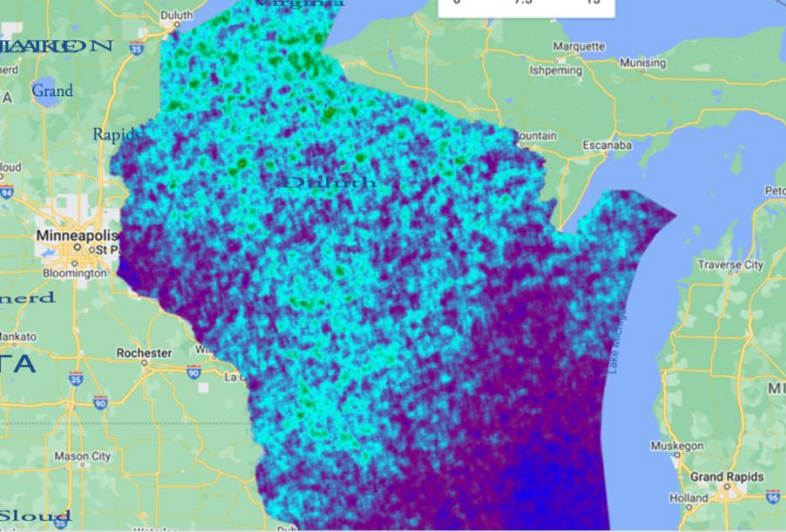
< 3.2 = VOC-limited

3.2 - 4.1 = Transitional

> 4.1 are NOx-limited

Thresholds from Jin et al. (2020)

DRAFT from Raghad Bajouda via Google Earth



Plotting the Ratio of TROPOMI Formaldehyde and Nitrogen Dioxide Satellite Data: An Indicator of Ozone Sensitivity

User friendly tutorials using Google Earth Engine to plot the ratio of formaldehyde to nitrogen dioxide that can be used to assess ozone sensitivity.

Apr 20, 2023

Tutorial: Google Earth to calculate ozone indicator ratios in your city, state or region

<https://hollowaygroup.org/tutorials>

Jennifer McGinnis

	<i>Ease of Use</i>	<i>Allows time averaging (2+ days)</i>	<i>Allows division among variables</i>	<i>Includes TROPOMI</i>
<i>NASA Worldview</i>	E	N	N	N
<i>NASA Giovanni</i>	E	Y	N	N
<i>Panoply</i>	E	N	Y	Y
<i>Google Earth Engine</i>	M	Y	Y	Y
<i>Python, IDL, R, Matlab, etc.</i>	Can this be M too??	Y	Y	Y

Satellite Data to Inform Ozone Sensitivity: A Practical Methodology Using Google Earth Engine

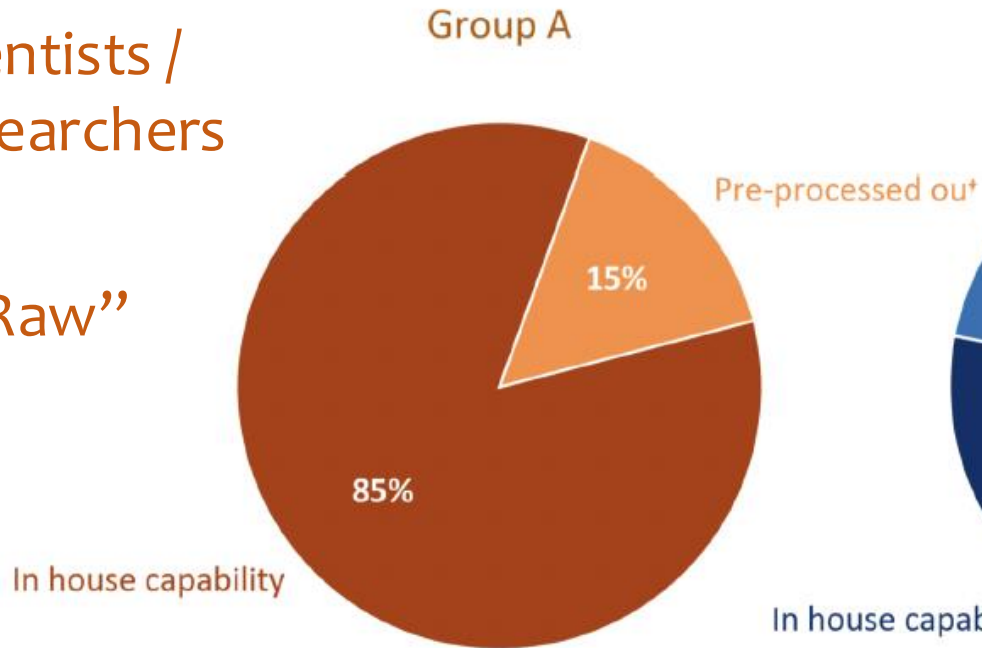
*Accepted - EM for
Special Issue on Ozone*

Authors: Jennifer McGinnis, Tracey Holloway, Jenny Bratburd, Madankui Tao, and Arlene Fiore

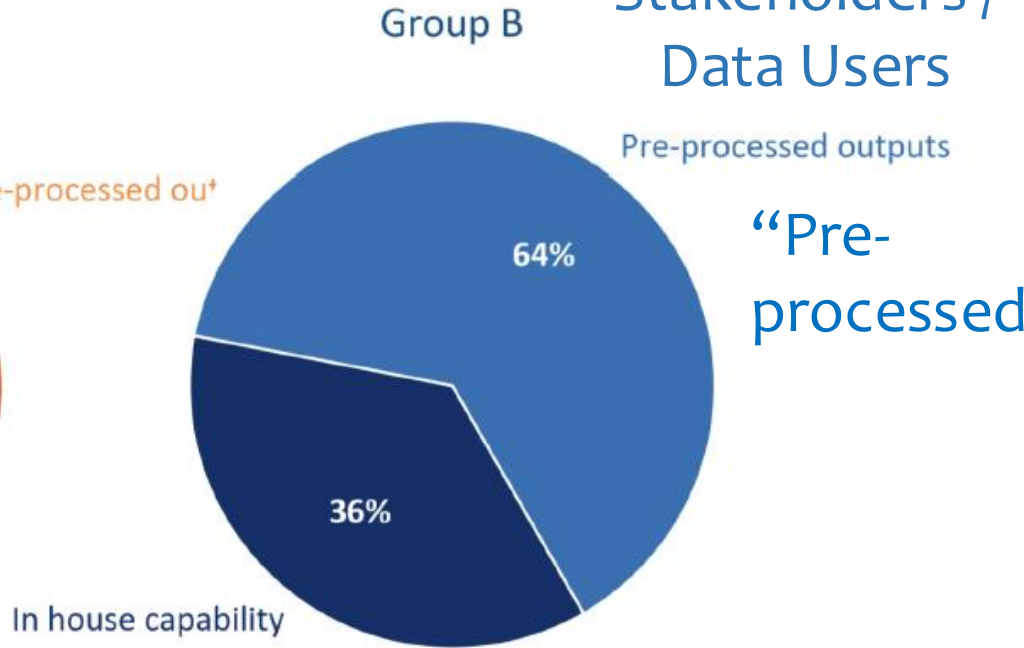
Would a of service, (a) where you can download pre-processed, uniform datasets, be valuable to you, or is it preferred to (b) handle the original data and gain the full expertise and understanding in house?

Scientists /
Researchers

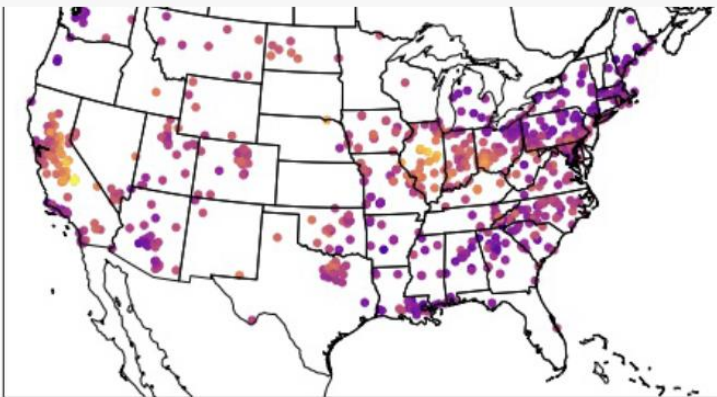
“Raw”



Stakeholders /
Data Users

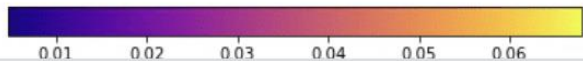


“Pre-processed”



Tutorial: Learn to use Python in 8 user-friendly tutorials

<https://hollowaygroup.org/tutorials>



Python Tutorials for Atmospheric and Geophysical Sciences

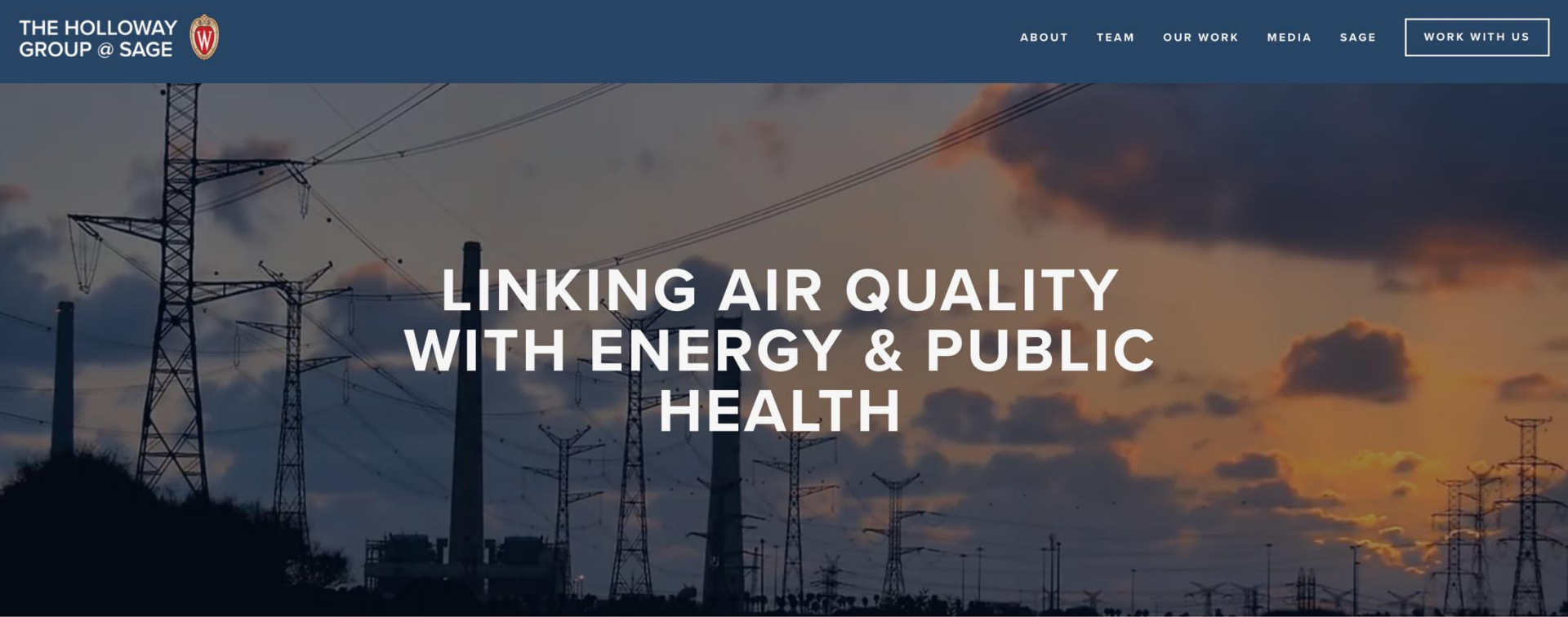
Designed for undergraduate and graduate students with no or minimal prior coding experience, these atmospheric and geophysical science Python tutorials are targeted toward students with an interest in air quality and the atmospheric sciences.

May 3, 2023

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Tutorial 8 (remote data):	40

Alicia Hoffman and Gesangyangji





LINKING AIR QUALITY WITH ENERGY & PUBLIC HEALTH

**The Holloway Group Advances Air Quality Research To Inform
Science And Policy. We Partner With Organizations To Ensure The
Relevance Of Our Work To Real-World Needs.**

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