



# Satellite Data and Other NASA Resources for Air Quality Applications

#### **Carl Malings**

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### **Outline for the presentation**

#### NASA's role in providing air quality data

- Airborne Data
- Global Models
- Satellite Remote Sensing

#### **Strengths & Weaknesses of Satellite Data for Air Quality Applications**

#### **New & Upcoming Satellite Missions Relevant to Air Quality**

- TROPOMI
- TEMPO
- MAIA
- PACE

#### **Data Access, Visualization, and Training Resources**





### Partner

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#### **Sources of air quality information**



Source: Gupta, P.; Follette-Cook, M. (2018). Satellite Remote Sensing of Air Quality. NASA Applied Remote Sensing Training Program (ARSET). https://appliedsciences.nasa.gov/join-mission/training/english/arset-satellite-remote-sensing-air-quality



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#### **Satellite instruments and retrievals**



Source: NASA Earth Science https://science.nasa.gov/earth-science



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#### **Ground-based atmospheric column observations**



Source: https://aeronet.gsfc.nasa.gov/



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Source: https://pandora.gsfc.nasa.gov/



PANDORA atmospheric gases (NO<sub>2</sub>, Ozone)

TOLNET LIDAR measurements of Ozone profiles



Source: https://www-air.larc.nasa.gov/missions/TOLNet/index.html



#### **Airborne air quality campaigns**





Typically, these campaigns gather data to improve satellite retrieval algorithms and models.





Instruments aboard NASA DC-8 Aircraft (photo credit: Pedro Campuzano-Jost)

Source: https://espo.nasa.gov/firex-aq/content/FIREX-AQ



Source:

NASA LARC DISCOVER-AQ campaign webpage https://www-air.larc.nasa.gov/missions/discover-aq/discover-aq.html



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### GESTARII

The GMAO uses computer models and data assimilation to enhance NASA's program of Earth Observations.

**NASA Global Modeling & Assimilation Office (GMAO)** 





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#### **GEOS-CF: NASA global air quality forecast model**



Source: Keller, C., et al. (2021) "Description of the NASA GEOS Composition Forecast Modeling System GEOS-CF v1.0". *Journal of Advances in Modeling Earth Systems*, 13:4. https://agupubs.onlinelibrary.wiley.com/doi/10.1029/2020MS002413



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#### **Visualizing GEOS-CF forecasts in GMAO FLUID**





ANIMATE DOWNLOAD MOVIE

The GMAO FLUID website provides access to visualizations of GMAO data products, including

GEOS-CF replay and forecast surface concentration maps and animations are available globally and for regions.

Pre-generated "datagrams" for US and world cities depict the forecast time series and details.

Custom interfaces are often developed to support NASA airborne campaigns.

Source: GMAO FLUID for GEOS-CF https://fluid.nccs.nasa.gov/cf/



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#### **GEOS-CF** interactive map and forecast datagrams





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### **GEOS-CF derived AQI forecasts in CDC Tracker**



CDC tracker derives county-level daily US AQI values from gridded hourly GEOS-CF replay and forecasts over the USA.

Can complement other information, such as EPA AirNow and AirData, for health impact studies and early warning of potentially hazardous air quality.

Source: https://ephtracking.cdc.gov/DataExplorer/

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# Satellites Data for Air Quality Benefits & Limitations



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#### What satellite data CAN do for air quality



- Examine a large area: where are the hotspots? how is long-range transport happening?
- Track changes over time: how much has the average concentration over an area changed over time?
- A picture is worth a million datapoints: Anyone can understand a satellite photo of a smoke plume.

Sources: George Washington University "TROPOMI NO2 USA" website <u>https://tropomino2.us/</u> NASA GSFC Nitrogen Dioxide Trends for World Cities <u>https://airguality.gsfc.nasa.gov/no2/world</u>



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- · See at night: satellites measure the properties of reflected sunlight passing through the atmosphere.
- See through clouds: most satellite measurements are blocked by cloud cover.
- See what is happening at "nose level": satellites measure quantities in the whole atmosphere.
- See at different times of day: polar-orbiting satellites will observe a location once per day.

Source: Gupta, P.; Follette-Cook, M. (2018). Satellite Remote Sensing of Air Quality. NASA Applied Remote Sensing Training Program (ARSET). https://appliedsciences.nasa.gov/join-mission/training/english/arset-satellite-remote-sensing-air-quality







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### **Common types of orbits for air quality satellites**



Observes a location about once a day (weather permitting)

Observes at about the same time of day (sun-synchronous)

source: NOAA https://scijinks.gov/orbit/

15

Geostationary Orbit ~

Observes the same area all the time

Observes throughout the day (weather and light permitting)





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### Spectral resolution & what satellites can remotely measure



Source: Gupta, Follette-Cook, Strode, Malings (2023). ARSET - NASA Air Quality-Focused Remote Sensing for EPA Applications NASA ARSET.



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#### Spatial resolution has been improving over time



Source: Gupta, Follette-Cook, Strode, Malings (2023). ARSET - NASA Air Quality-Focused Remote Sensing for EPA Applications. NASA ARSET.



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# Filling Air Quality Data Gaps with Satellites

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![](_page_17_Picture_6.jpeg)

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#### Surface air quality data gaps in the US and globally

![](_page_18_Figure_2.jpeg)

Most regions have fewer than 10 regulatory air quality monitors per million people for PM<sub>2.5</sub> (and generally fewer for other pollutants).

Only about a third of US counties have regulatory air quality monitors.

Only 60% of census urban areas have regulatory air quality monitors.

Low-cost sensors increase monitor density by up to ten times in some regions.

19

Sources: Do you have outdoor air monitoring data for all counties in the U.S.? US Environmental Protection Agency. Malings et al. (2022) Forecasting with the GEOS-CF System and Other NASA Resources to Support Air Quality Management. Proceedings of the International Conference on Air Quality in Africa.

![](_page_18_Picture_8.jpeg)

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![](_page_18_Picture_12.jpeg)

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#### **Surface concentrations from satellite data**

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Combine satellite data with other information (models, surface monitors) to derive high spatial resolution maps of surface concentrations (especially PM<sub>2.5</sub>) globally and regionally.

Many datasets available through <u>NASA Socioeconomic</u> <u>Data and Applications Center</u> (SEDAC).

Datasets may lag significantly behind real-time.

![](_page_19_Figure_7.jpeg)

Di et al. (2019) <u>An ensemble-based model of PM<sub>2.5</sub> concentration across the contiguous US ...</u>. *Environmental International*. van Donkelaar et al. (2021) <u>Monthly Global Estimates of Fine Particulate Matter and Their Uncertainty</u>. *Env. Sci. & Tech*.

![](_page_19_Picture_9.jpeg)

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Sources:

![](_page_19_Picture_13.jpeg)

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#### **Surface PM<sub>2.5</sub> estimation with geostationary AOD**

![](_page_20_Figure_2.jpeg)

Sources: NOAA Aerosol Watch Website <u>https://www.star.nesdis.noaa.gov/smcd/spb/aq/AerosolWatch/</u> Zhang & Kondragunta (2021) <u>Daily and Hourly Surface PM<sub>2.5</sub> Estimation from Satellite AOD</u>. Earth and Space Science.

![](_page_20_Picture_4.jpeg)

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![](_page_20_Picture_8.jpeg)

![](_page_21_Picture_1.jpeg)

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### Hyper-local variability is still beyond current capabilities

![](_page_21_Figure_3.jpeg)

Source:

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22

Apte et al. (2017) High-Resolution Air Pollution Mapping with Google Street View Cars: Exploiting Big Data. Env. Sci. & Tech.

![](_page_21_Picture_9.jpeg)

![](_page_22_Picture_1.jpeg)

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#### Hyper-local variability is still beyond current capabilities

![](_page_22_Figure_3.jpeg)

Source: Apte et al. (2017) <u>High-Resolution Air Pollution Mapping with Google Street View Cars: Exploiting Big Data</u>. Env. Sci. & Tech.

![](_page_22_Picture_5.jpeg)

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![](_page_22_Picture_9.jpeg)

![](_page_23_Picture_1.jpeg)

GESTAR

#### Hyper-local variability is still beyond current capabilities

![](_page_23_Figure_3.jpeg)

Source: Apte et al. (2017) High-Resolution Air Pollution Mapping with Google Street View Cars. Exploiting Big Data. Env. Sci. & Tech.

![](_page_23_Picture_5.jpeg)

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# **New & Upcoming Missions**

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![](_page_24_Picture_6.jpeg)

#### **TROPOspheric Monitoring Instrument (TROPOMI)**

![](_page_25_Picture_2.jpeg)

NASA

#### **TROPOMI Tropospheric NO<sub>2</sub> (Launched 2017)**

![](_page_25_Figure_4.jpeg)

Source: Goldberg, Anenberg, Kerr, Mohegh, Lu, Streets (2021) <u>TROPOMI NO<sub>2</sub> in the United States...</u>. Earth's Future.

![](_page_25_Picture_6.jpeg)

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26

OMI Tropospheric NO<sub>2</sub> (Launched 2004)

![](_page_25_Picture_10.jpeg)

![](_page_26_Picture_1.jpeg)

### **Tropospheric Emissions: Monitoring of POllution (TEMPO)**

![](_page_26_Picture_3.jpeg)

Launched April 2023, first light images August 2023.

First geostationary hyperspectral instrument for North America.

Part of a constellation of similar instruments with GEMS (launched 2020) and Sentinel-4 (anticipated 2024).

Hourly temporal resolution. 2 x 4.75 km spatial resolution.

Anticipated primary data products:

- NO<sub>2</sub>
- HCHO
- NEW 0-2 km O<sub>3</sub> product!

![](_page_26_Picture_12.jpeg)

Sources:

NASA & Smithsonian TEMPO Website <u>https://tempo.si.edu/index.html</u> TEMPO Early Adopters Program <u>https://weather.msfc.nasa.gov/tempo/</u>

![](_page_26_Picture_15.jpeg)

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#### 02 Aug 2023 11:11 EDT

Nitrogen Dioxide Tropospheric Column Density

![](_page_27_Figure_2.jpeg)

Source: NASA GSFC Scientific Visualization Studio https://svs.gsfc.nasa.gov/5142/

#### **Multi-Angle Imager for Aerosols (MAIA)**

![](_page_28_Picture_2.jpeg)

NASA

![](_page_28_Figure_3.jpeg)

Sources:

NASA JPL MAIA Website <u>https://maia.jpl.nasa.gov/</u>
 MAIA Early Adopters Program https://maia.jpl.nasa.gov/resources/data-and-applications/

![](_page_28_Picture_6.jpeg)

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![](_page_28_Picture_10.jpeg)

![](_page_29_Picture_1.jpeg)

### Plankton, Aerosol, Cloud, and ocean Ecosystem (PACE)

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Anticipated launch January 2024.

Polar-orbiting hyperspectral imager and 2 multi-angle polarimeters.

Supports applications in ocean biogeochemistry, aerosols and air quality, and clouds.

2 day global coverage.

1 km<sup>2</sup> spatial resolution for most data.

Anticipated air quality data products:

- Many Aerosol parameters, i.e., optical depth, size distribution, layer height, type, absorption
- NO<sub>2</sub>
- O<sub>3</sub> (column)

![](_page_29_Figure_13.jpeg)

Sources:

NASA GSFC PACE Website <u>https://pace.gsfc.nasa.gov/</u> PACE Early Adopters Program <u>https://pace.oceansciences.org/app\_adopters.htm</u>

![](_page_29_Picture_16.jpeg)

![](_page_29_Picture_20.jpeg)

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# **Satellite Data Resources**

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![](_page_30_Picture_6.jpeg)

![](_page_31_Picture_1.jpeg)

GESTAR I

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#### https://worldview.earthdata.nasa.gov

![](_page_31_Figure_4.jpeg)

![](_page_31_Picture_5.jpeg)

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![](_page_31_Picture_9.jpeg)

![](_page_32_Picture_1.jpeg)

### **NASA Giovanni**

#### https://giovanni.gsfc.nasa.gov/giovanni

- Work online with many gridded NASA data products (satellite & model)
- Perform simple analysis
  - spatial & temporal averaging
  - recurring/periodic averages
  - differences
- Plot results
  - area colormaps
  - time series
  - scatterplots
  - correlation plots
  - histograms
- Download data subsets
  - NetCDF
  - GeoTIFF
  - KMZ

![](_page_32_Figure_19.jpeg)

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![](_page_32_Picture_23.jpeg)

![](_page_32_Figure_24.jpeg)

![](_page_33_Picture_1.jpeg)

![](_page_33_Picture_2.jpeg)

#### **NOAA AerosolWatch**

![](_page_33_Figure_4.jpeg)

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![](_page_33_Picture_6.jpeg)

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![](_page_34_Picture_1.jpeg)

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### **NASA Applied Remote Sensing Training (ARSET)**

https://appliedsciences.nasa.gov/arset

ARSET provides accessible, relevant, and cost-free training on remote sensing satellites, sensors, methods, and tools.

Our trainings are:

- Online and in-person
- Open to everyone
- Live, instructor-led, or self-guided
- Provided at no cost, with materials and recordings available from our website
- Often multi-lingual
- Tailored to those with a range of experience in remote sensing, from introductory to advanced

![](_page_34_Picture_12.jpeg)

#### ARSET offers trainings for:

- <u>Disasters</u>
- <u>Health & Air Quality</u>
- Land Management
- <u>Water Resources</u>
- <u>Climate</u>

![](_page_34_Picture_19.jpeg)

![](_page_34_Picture_20.jpeg)

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# EARTHDATA Offers The Air Quality Data Pathfinder for Your Research & Applications

Air pollution is one of the largest global environmental and health threats. NASA provides data resources to better understand the movement of pollutants and the impact of events leading to poor air quality. This Pathfinder helps you access, and leverage data acquired from NASA's satellite, airborne, and ground-based missions and campaigns.

• GPM

• OMI

• MODIS

#### Available Data Types:

- Aerosols
- Trace Gases (e.g., Nitrogen Dioxide, Sulfur Dioxide, Carbon Monoxide, etc.)
- Weather (e.g., Air Temperature, Clouds, Precipitation, etc.)
- Land Surface (e.g., Soil Moisture, Surface Reflectance, Topography, etc.)
- Human Dimensions

Data are from satellites, airborne and ground-based platforms, and models, including:

- AIRS OMPS
- AMSR2 SMAP
  - TROPOMI
  - VIIRS
- OLI/TIRS GEOS
  - MERRA-2

![](_page_35_Picture_16.jpeg)

#### Visit the EARTHDATA Air Quality Data Pathfinder

- for more information:
- Commonly Used Datasets for Air Quality Research and Applications

- Tools for Using Data
- Resources for Applying and Connecting NASA Data
- GIS Resources
- Tips for Getting Help and Connecting with NASA experts
- Tutorials and more!

![](_page_35_Picture_25.jpeg)

![](_page_36_Picture_1.jpeg)

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### Health and Air Quality Applied Science Team (HAQAST)

#### https://haqast.org/

"Our goal is to use NASA's data and satellites to pursue cutting edge applied research in order to keep you healthy and safe."

- Use NASA satellite & other data to help solve real-world public health and air quality problems.
- Work around the world on diverse issues related to health and air quality.
- Collaborate with public stakeholders to help guide long-term research.
- "Tiger Teams" pursue short-term, highimpact projects in small groups.

![](_page_36_Picture_9.jpeg)

Getting started with NASA satellite data for health and air quality: <u>https://haqast.org/getting-started/</u>

![](_page_36_Picture_11.jpeg)

![](_page_36_Picture_15.jpeg)

![](_page_37_Picture_1.jpeg)

GESTAR

### **Satellite Data for Environmental Justice & Equity**

- Minoritized and marginalized populations often experience disproportionate exposure to a range of environmental hazards
- Satellite remote sensing data can supplement on-the-ground efforts to investigate such disparities in risk exposure from global to local scales
- Satellite Data for Environmental Justice (SD4EJ) is a NASA HAQAST Tiger Team whose goal is to integrate satellite data EJ screening and mapping tools.
- NASA ARSET recently delivered a training focusing on this topic with support from the SD4EJ team

![](_page_37_Figure_7.jpeg)

Sources: NASA Earth Observatory Image of the Day, November 9, 2021. NASA ARSET - Satellite Data for Air Quality Environmental Justice and Equity Applications (2023).

![](_page_37_Picture_9.jpeg)

![](_page_37_Picture_10.jpeg)

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![](_page_37_Picture_14.jpeg)

![](_page_38_Picture_1.jpeg)

#### Viewing satellite-derived surface NO<sub>2</sub> in EPA EJScreen

![](_page_38_Picture_3.jpeg)

![](_page_38_Figure_4.jpeg)

Source: NASA HAQAST Satellite Data for Environmental Justice Tiger Team website, <u>https://haqast.org/ej/</u>.

![](_page_38_Picture_6.jpeg)

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## **Thank You!**

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![](_page_39_Picture_6.jpeg)