



CEOS AC-VC Meeting #20

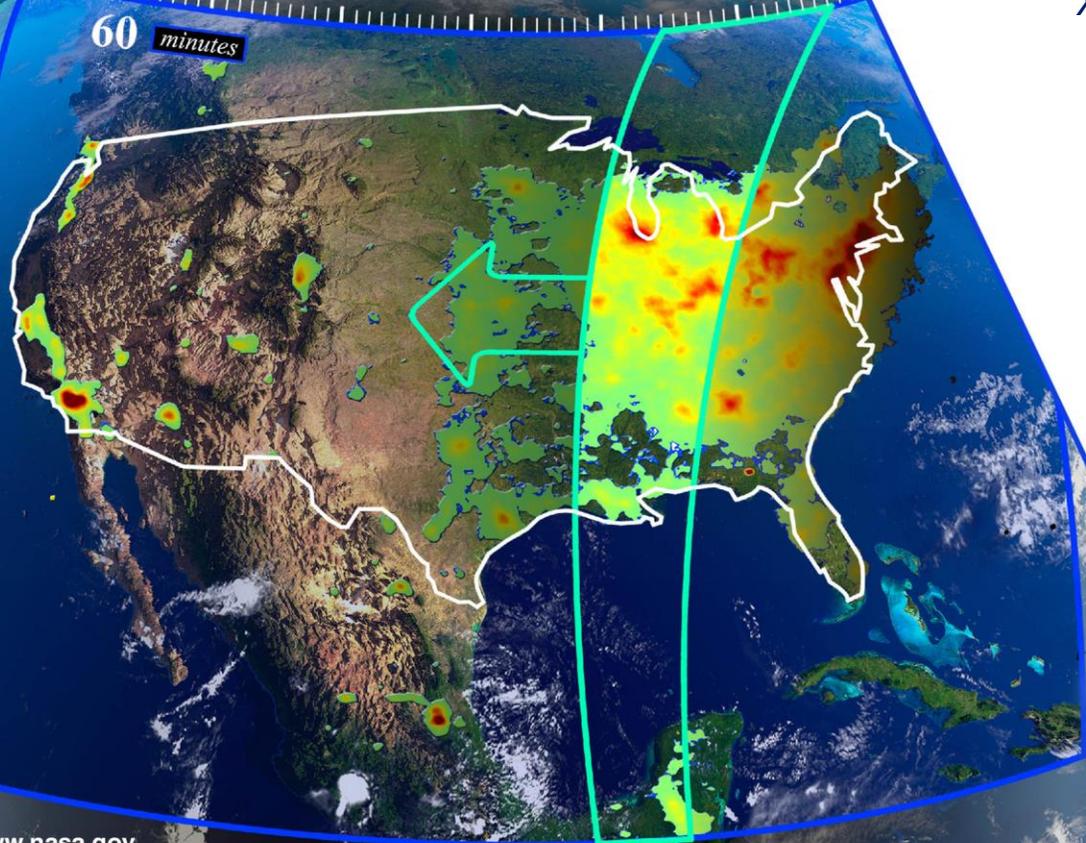
15-18 October 2024

# Validation of TEMPO NO<sub>2</sub> and HCHO

Nitrogen dioxide and Formaldehyde using Pandora and TropOMI

Hourly Measurement of Pollution

60 minutes



Barron Henderson, US EPA

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US EPA

Xiong Liu, Kelly Chance, Gonzalo Gonzalez Abad, Caroline Nowlan

SAO TEAM

Katherine Travis, Prajjwal Rawat

NASA LaRC

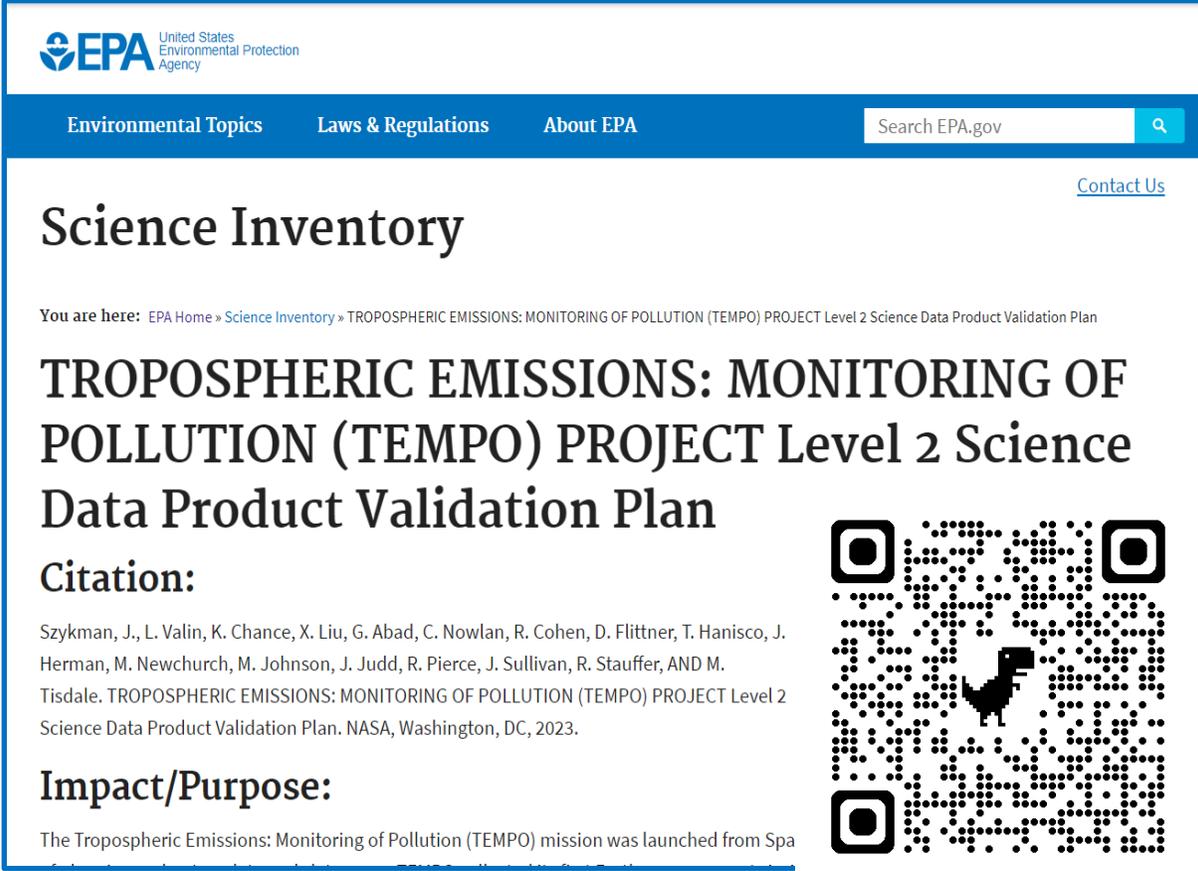
Thomas Hanisco, Nader Abuhassan, and Alexander Cede

NASA GSFC / SciGlob / Luftblick

Thanks to the rest of the TEMPO Validation Team!

*Disclaimer: The views expressed in this presentation are those of the authors and do not necessarily reflect the views or policies of the U.S. Environmental Protection Agency.*





**EPA** United States Environmental Protection Agency

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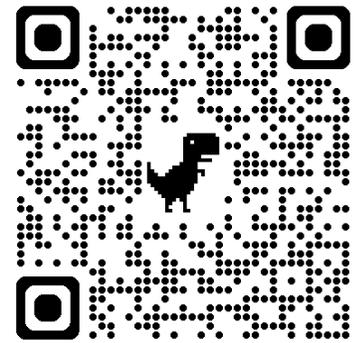
## Science Inventory

You are here: EPA Home > Science Inventory > TROPOSPHERIC EMISSIONS: MONITORING OF POLLUTION (TEMPO) PROJECT Level 2 Science Data Product Validation Plan

### TROPOSPHERIC EMISSIONS: MONITORING OF POLLUTION (TEMPO) PROJECT Level 2 Science Data Product Validation Plan

**Citation:**  
 Szykman, J., L. Valin, K. Chance, X. Liu, G. Abad, C. Nowlan, R. Cohen, D. Flittner, T. Hanisco, J. Herman, M. Newchurch, M. Johnson, J. Judd, R. Pierce, J. Sullivan, R. Stauffer, AND M. Tisdale. TROPOSPHERIC EMISSIONS: MONITORING OF POLLUTION (TEMPO) PROJECT Level 2 Science Data Product Validation Plan. NASA, Washington, DC, 2023.

**Impact/Purpose:**  
 The Tropospheric Emissions: Monitoring of Pollution (TEMPO) mission was launched from Spa



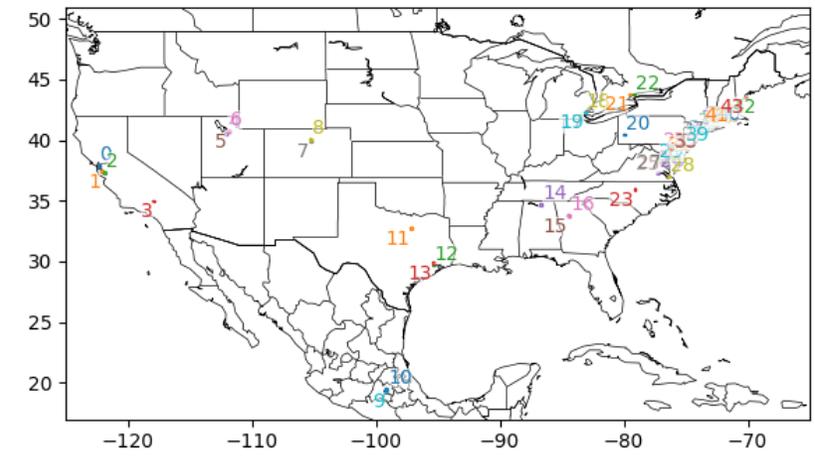
- Facilitated and led by EPA in collaboration with TEMPO Validation and Science Team, NASA, and NOAA.
  - Developed the validation plan
  - Expanded the Pandora Global Network of Pandoras
  - Validated baseline L2 data products: ozone, nitrogen dioxide, and formaldehyde.
  
- Providing real-time feedback to TEMPO algorithm developers and science team.
  - Early results identified a priori profile issues.
  - Early results identified unrealistic AMF spatial variation.
  - Development team updated algorithm to V2 and V3
  
- ***EPA's Automated Analysis System now V3***
  - V3 Nitrogen dioxide correlating well with Pandora and TropOMI.
  - V3 Formaldehyde correlating well with Pandora
  - Comparison to surface monitors useful for air quality managers
  
- Validation report anticipated soon...

EPA Science Inventory: 362165  
 or  
<https://tempo.si.edu> under documents

## ➤ Correlative measurements : TropOMI and Pandora

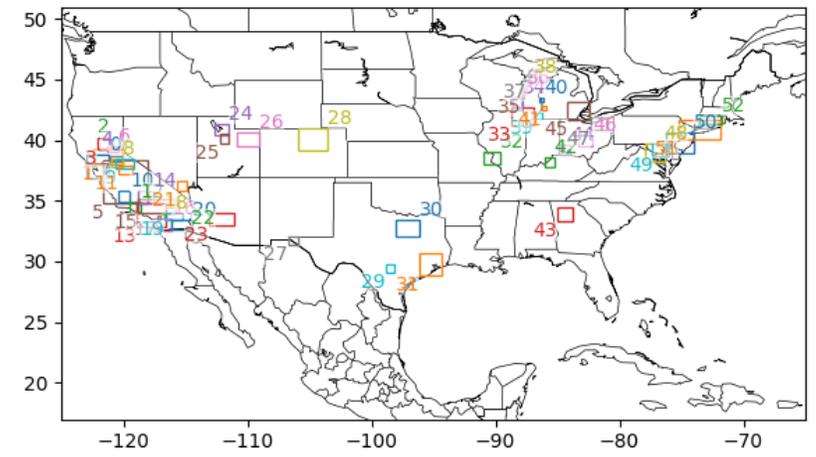
- Pandora stations: best ground-based validation dataset available for total vertical columns.
- TropOMI: state-of-the-art satellite retrievals at similar spatial resolution.

## ➤ Analysis Regions: Pandonia Global Network and Ozone Nonattainment Areas.



- |                        |                         |                      |
|------------------------|-------------------------|----------------------|
| 0: RichmondCA          | 15: AtlantaGA           | 30: BristolPA        |
| 1: MountainViewCA      | 16: Atl-S_DeKalb        | 31: NewBrunswickNJ   |
| 2: SanJoseCA           | 17: DearbornMI          | 32: BayonneNJ        |
| 3: EdwardsCA           | 18: SWDetroitMI         | 33: ManhattanNY-CCNY |
| 4: SouthJordanUT       | 19: Windsor-West        | 34: BronxNY          |
| 5: SLC-Hawthorne       | 20: PittsburghPA        | 35: QueensNY         |
| 6: SLC-UT              | 21: Downsview           | 36: WestportCT       |
| 7: BoulderCO           | 22: Toronto-Scarborough | 37: CornwallCT       |
| 8: BoulderCO-NCAR      | 23: ChapelHillNC        | 38: OldFieldNY       |
| 9: MexicoCity-UNAM     | 24: CharlesCityVA       | 39: NewHavenCT       |
| 10: MexicoCity-Vallejo | 25: WashingtonDC        | 40: MadisonCT        |
| 11: ArlingtonTX        | 26: BeltsvilleMD        | 41: LondonderryNH    |
| 12: HoustonTX          | 27: GreenbeltMD         | 42: EastProvidenceRI |
| 13: AldineTX           | 28: HamptonVA-HU        | 43: CapeElizabethME  |
| 14: HuntsvilleAL       | 29: PhiladelphiaPA      |                      |

• 44 Pandora stations  
 • Most stations in the east



- |                   |                   |                   |                  |
|-------------------|-------------------|-------------------|------------------|
| 0: S.Francisco    | 14: East_Kern     | 28: Denver        | 42: Louisville   |
| 1: Sacramento     | 15: LA-Desert     | 29: S.Antonio     | 43: Atlanta      |
| 2: Tuscan_Buttes  | 16: S.Diego       | 30: Dallas        | 44: Cincinnati   |
| 3: Chico          | 17: Pechanga      | 31: Houston       | 45: Detroit      |
| 4: Sutter_Buttes  | 18: Morongo       | 32: St.Louis      | 46: Columbus     |
| 5: S.Joaquin      | 19: Coachella_Val | 33: Chicago       | 47: Cleveland    |
| 6: Nevada_Co      | 20: Imperial_Co   | 34: Milwaukee     | 48: Washington   |
| 7: Amador_Co      | 21: Las_Vegas     | 35: Sheboygan     | 49: Baltimore    |
| 8: Calaveras_Co   | 22: Yuma          | 36: Manitowoc_Co  | 50: Philadelphia |
| 9: Tuolumne_Co    | 23: Phoenix       | 37: Door_Co_Rev   | 51: New_York     |
| 10: S.Luis_Obispo | 24: Salt_Lake     | 38: Door_Co       | 52: Connecticut  |
| 11: Mariposa_Co   | 25: Provo         | 39: Benton_Harbor |                  |
| 12: Ventura_Co    | 26: Uinta_Basin   | 40: Muskegon      |                  |
| 13: LA-S_Coast    | 27: El_Paso       | 41: Allegan_Co    |                  |

• 52 Nonattainment Areas  
 • Better spatial coverage  
 • Of special interest for emissions control

## ➤ Get level 2 data for TEMPO, TropOMI, and Pandora

- Python bindings for EPA's Remote Sensing Information Gateway (pysig)
- Trainings available – see QR code



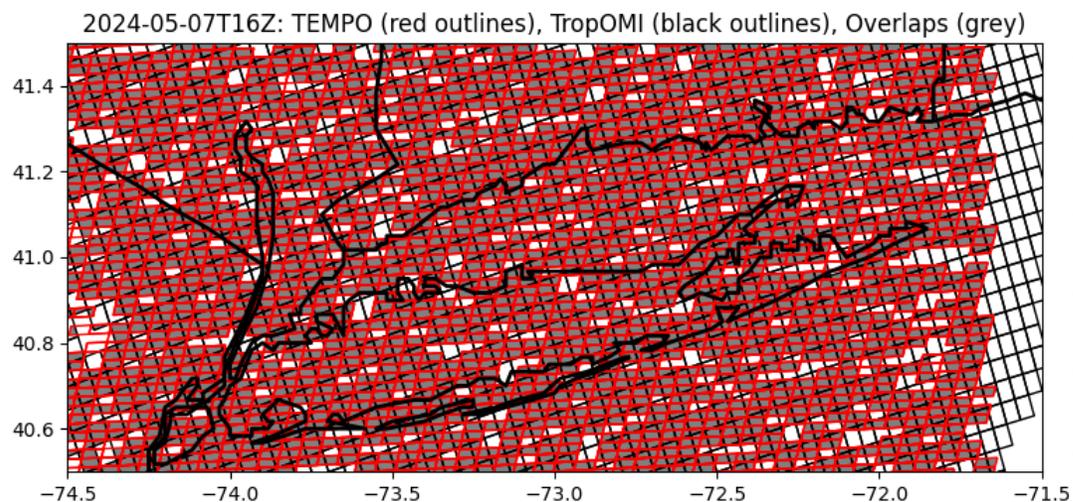
## ➤ Find time intersections

- TropOMI: same hour (e.g., 19:00:00Z to 19:59:59Z)
- Pandora: overpass within 15min of observation

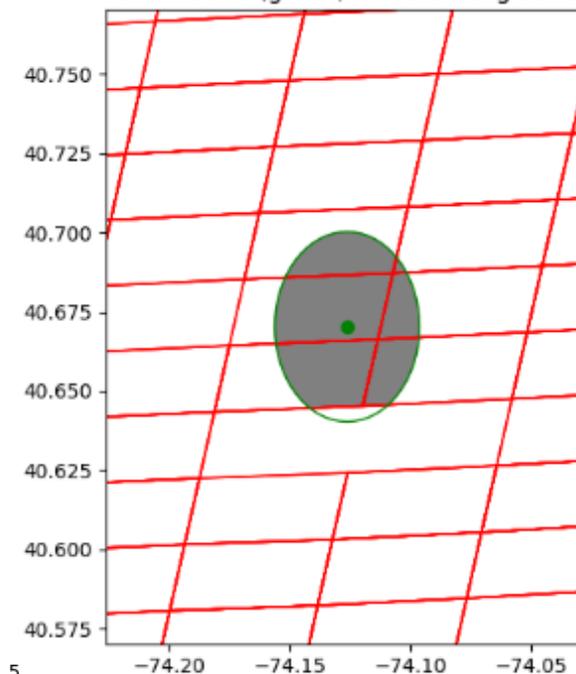
## ➤ Find spatial intersections

- TropOMI: pixels overlap
- Pandora: overlap a buffer

## ➤ Pool intersections for statistical analyses



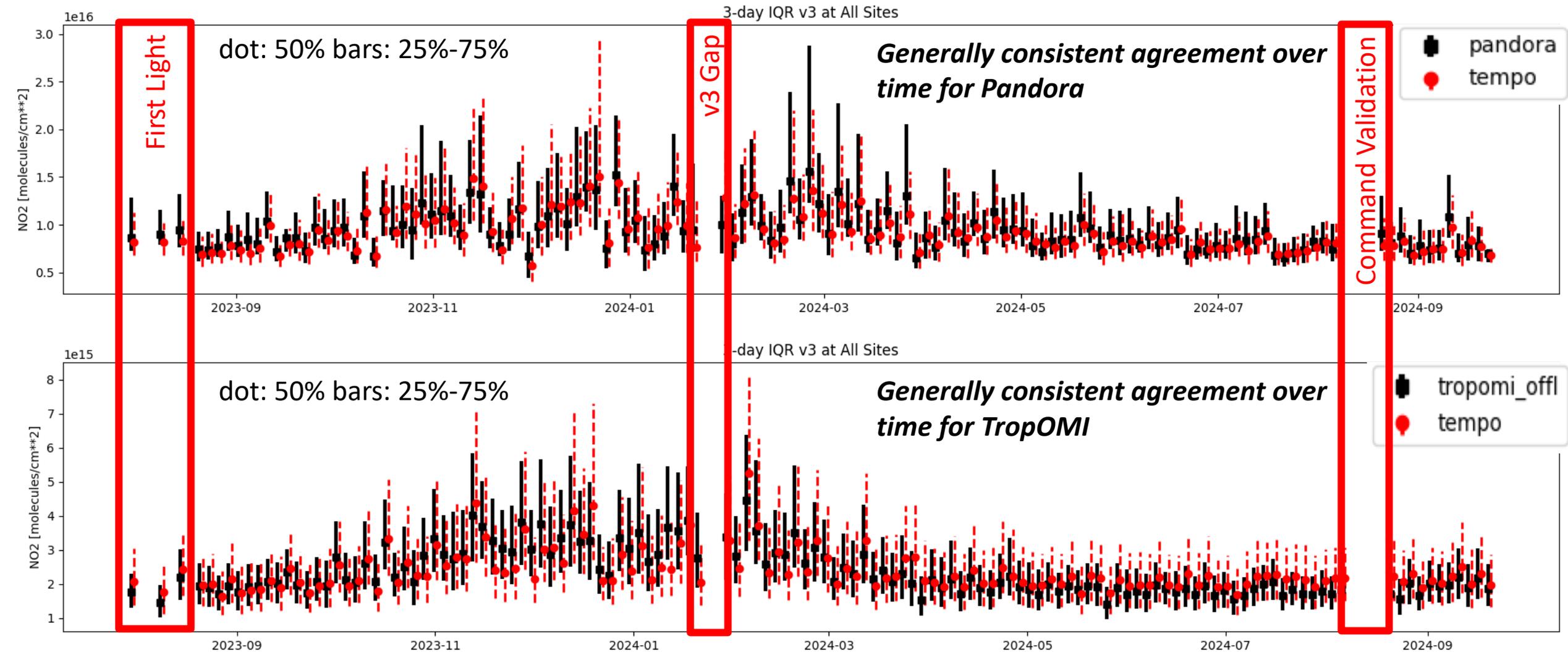
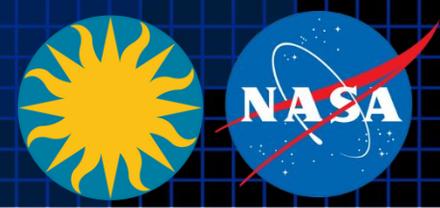
2024-05-07T16Z: TEMPO (red outline)  
Pandora site (green) and 0.03 deg buffer





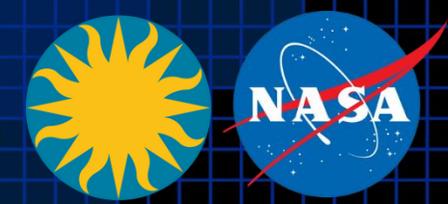
# NO2 Data Record Overview

## August 2023 to Sept 2024



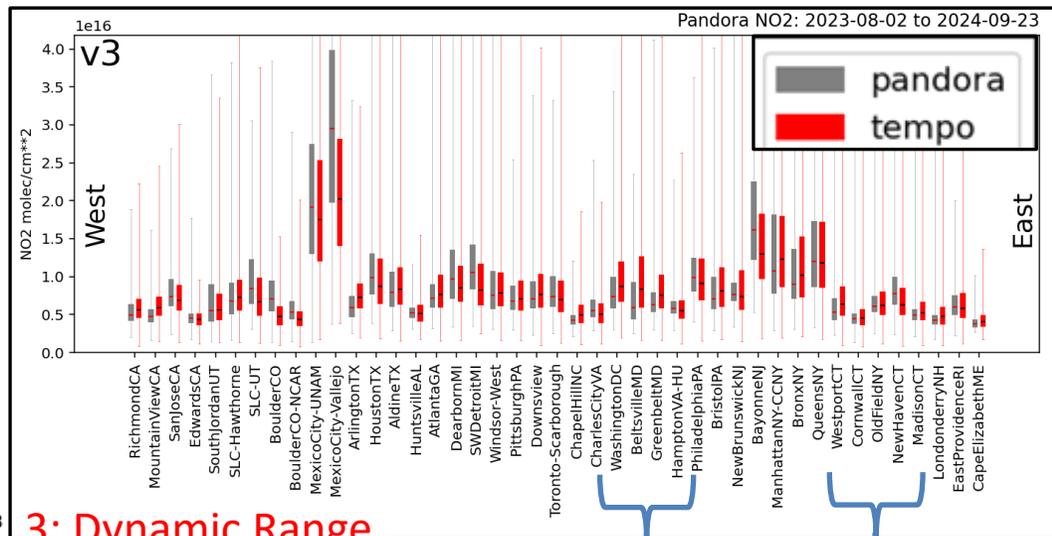
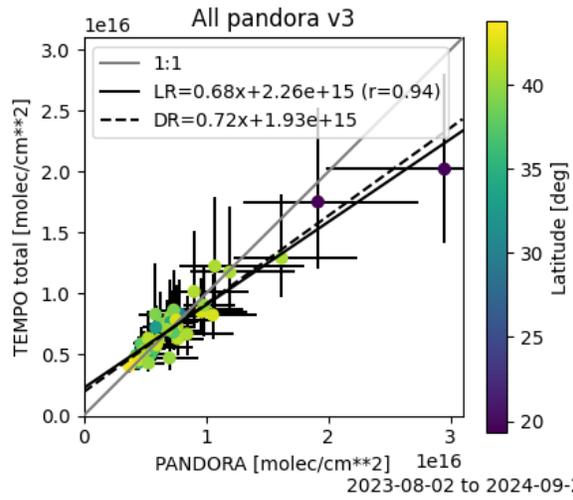


# TEMPO NO2 Agrees well with Pandora



## TEMPO L2 vs Pandora Total NO<sub>2</sub>

### 1: Spatial Variability

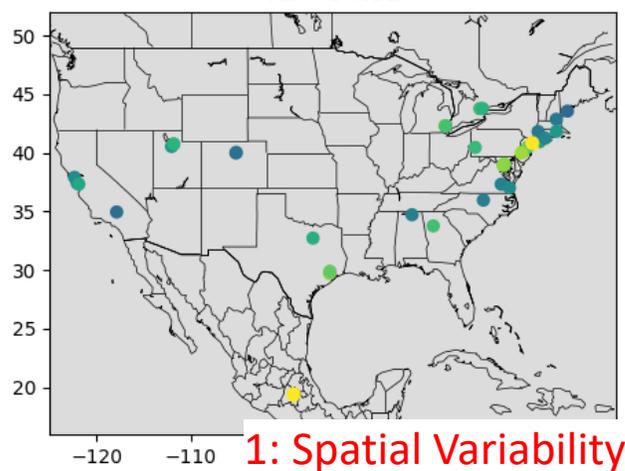


Compared to Pandora direct sun measurements, TEMPO:

1. Reproduces spatial variability
2. Low fractional biases by locations.
3. Reproduces dynamic range by site
4. Correlates well at most sites.
5. Even reproduces relatively small intra-regional urban/rural gradients quite well.

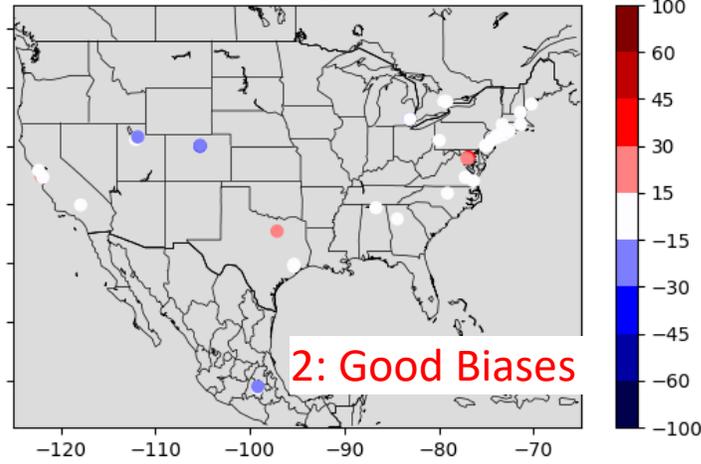
### 3: Dynamic Range

TEMPO NO2



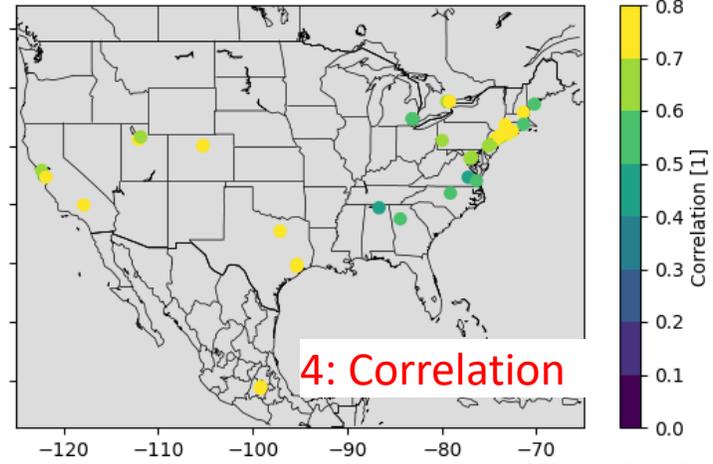
### 1: Spatial Variability

(TEMPO(50%) - Pandora(50%)) / Pandora(50%)



### 2: Good Biases

Correlation(TEMPO, Pandora)

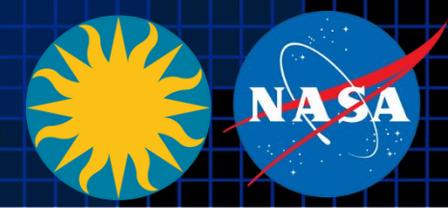


### 4: Correlation

2023-08-02 to 2024-09-23

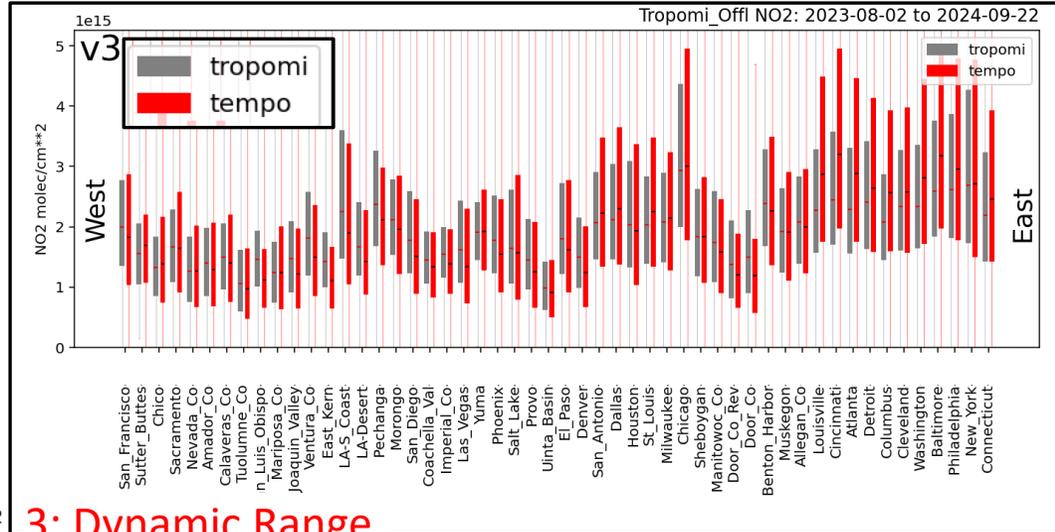
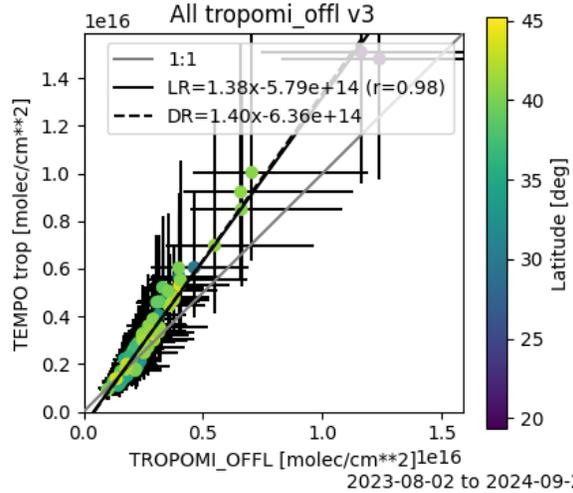


# TEMPO Agrees well with TropOMI



## TEMPO L2 vs TropOMI Tropospheric NO<sub>2</sub>

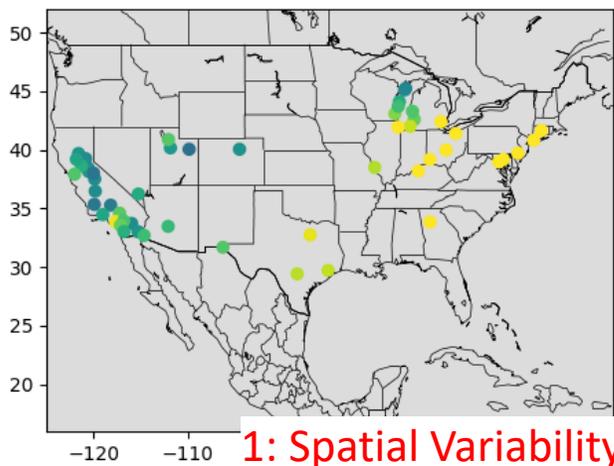
### 1: Spatial Variability



- TropOMI correlation is useful because we don't have Pandora everywhere.
- Here we explore comparisons at Ozone Nonattainment Areas
- Similar story to Pandora/TEMPO, captures spatial variability, dynamic range with a mix of site-specific correlations.
- Higher slope than Pandora, but this is tropospheric column.

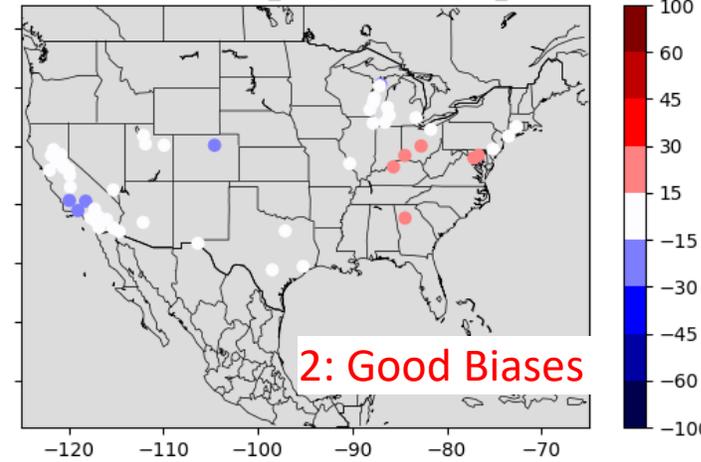
### 3: Dynamic Range

TEMPO NO<sub>2</sub>



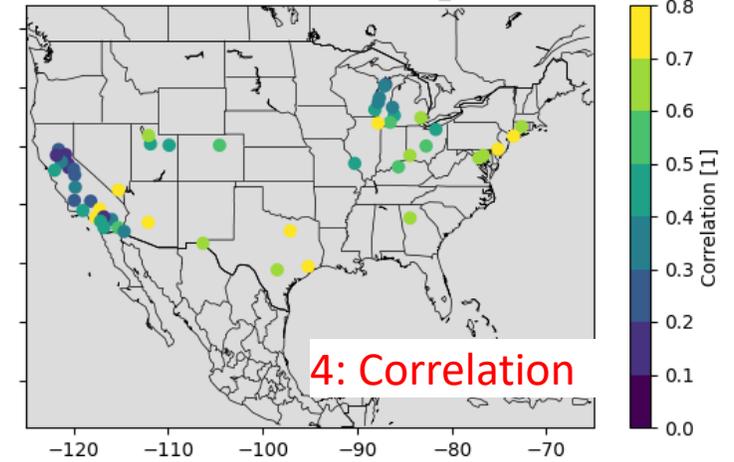
1: Spatial Variability

(TEMPO<sub>(50%)</sub> - Tropomi\_Off<sub>(50%)</sub>) / Tropomi\_Off<sub>(50%)</sub>



2: Good Biases

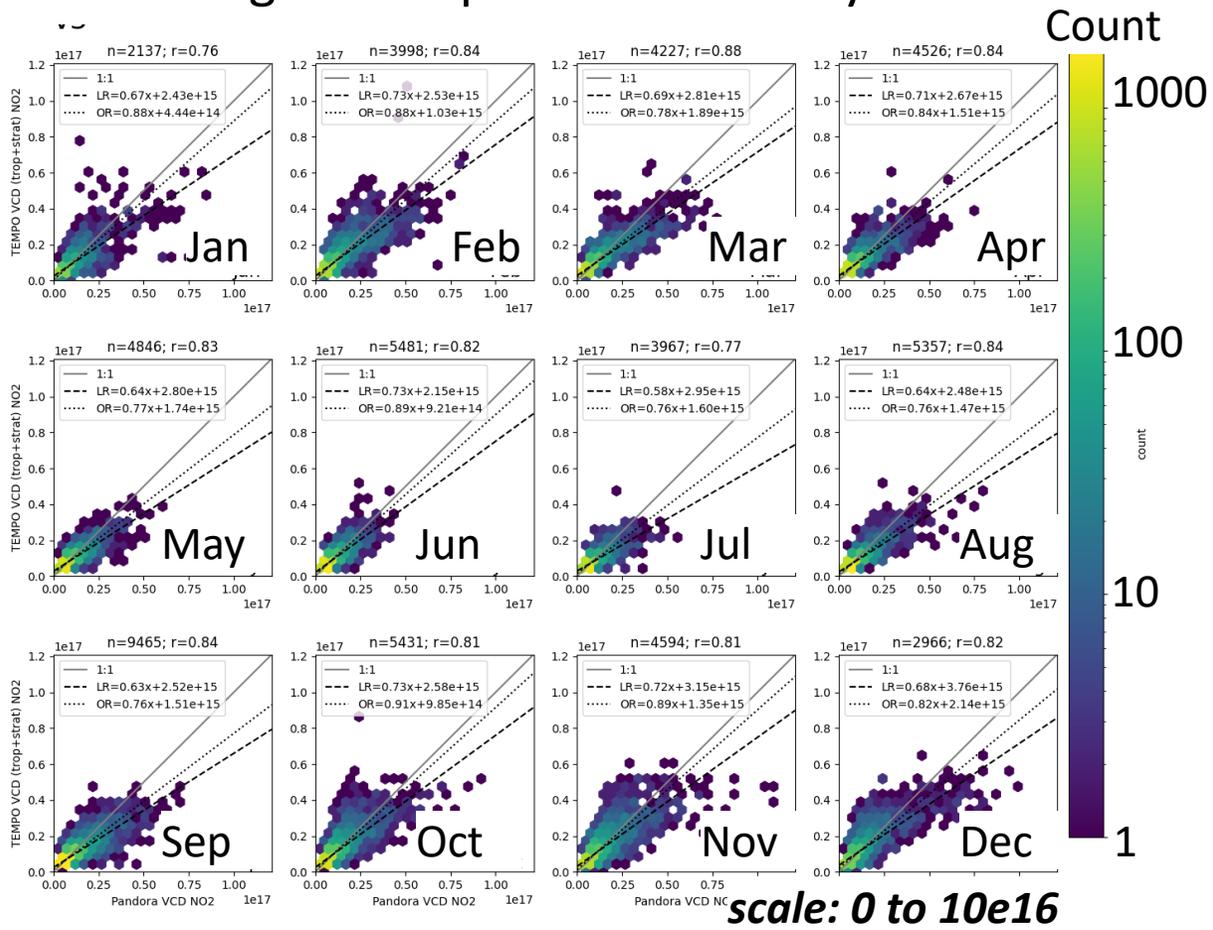
Correlation(TEMPO, Tropomi\_Off)



4: Correlation

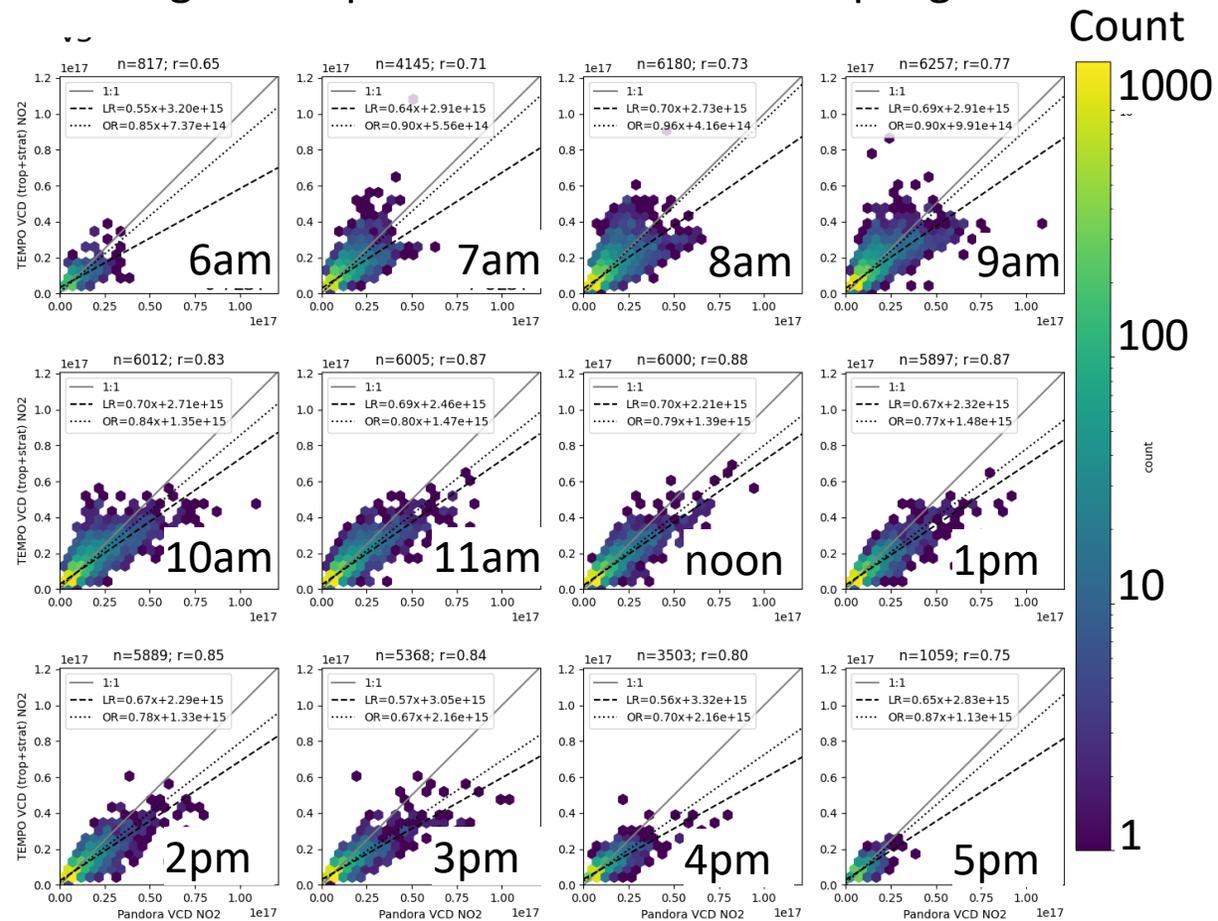
## Consistent monthly performance

- Dynamic range varies by month as expected
- Orthogonal slopes consistent by month



## Consistent diurnal performance

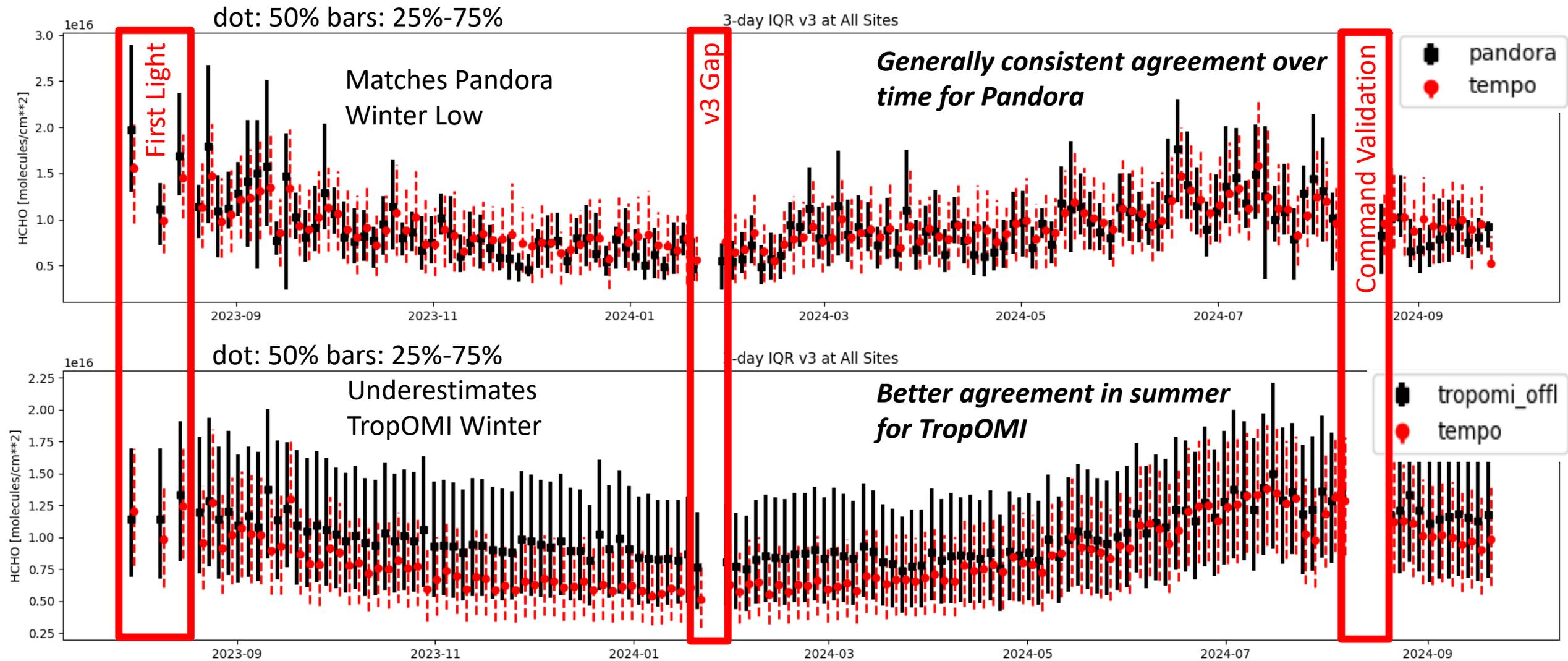
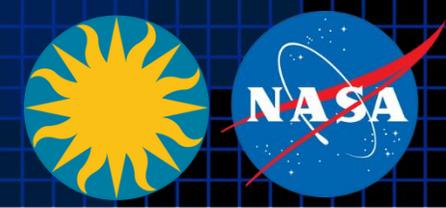
- Dynamic range varies by time of day as expected
- Orthogonal important due airmass sampling.





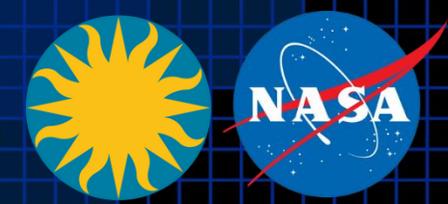
# HCHO Data Record Overview

## August 2023 to Sept 2024



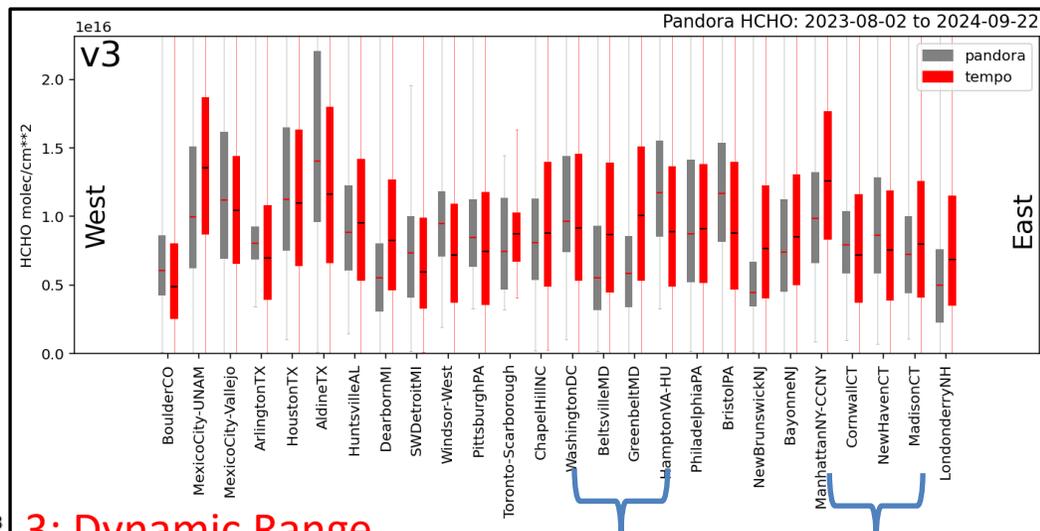
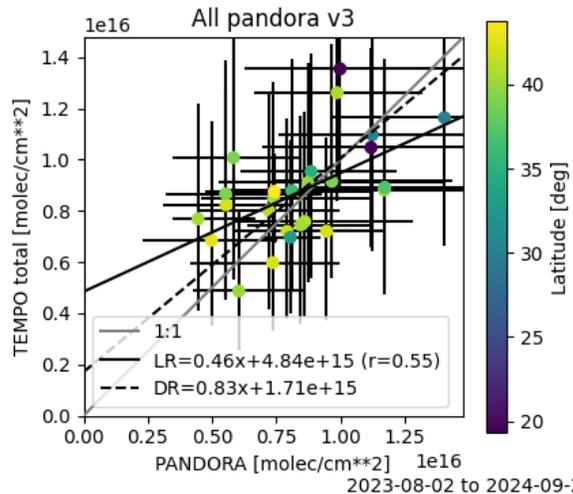


# TEMPO HCHO Agrees well with Pandora



## TEMPO L2 vs Pandora Total HCHO

### 1: Spatial Variability



### 3: Dynamic Range

Using direct sun with pixel averaging

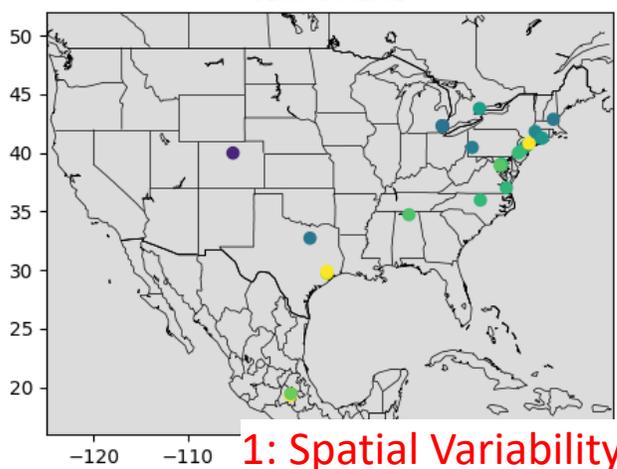
- Site selection: direct sun vs sky scan
- See Prajjwal Rawat for more details

Compared to Pandora, TEMPO:

1. Correlates at the site-level
2. Has reasonable bias with some individual sites needing investigation.
3. Captures regional-specific dynamic range.
4. Site-specific time correlation.

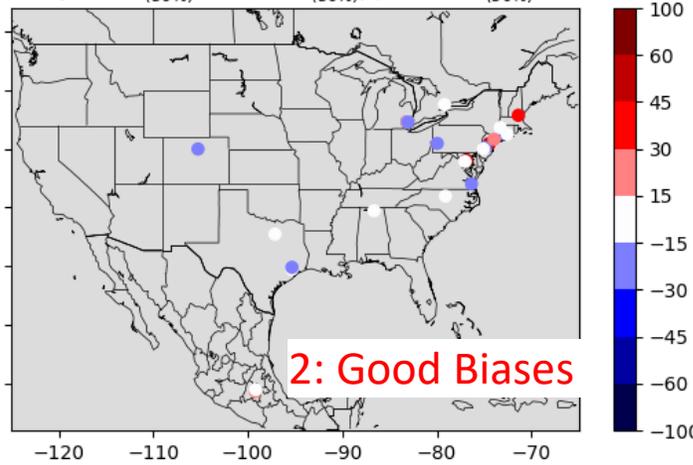
5. Intra-regional site-level gradients are challenging, perhaps due to pixel averaging

TEMPO HCHO



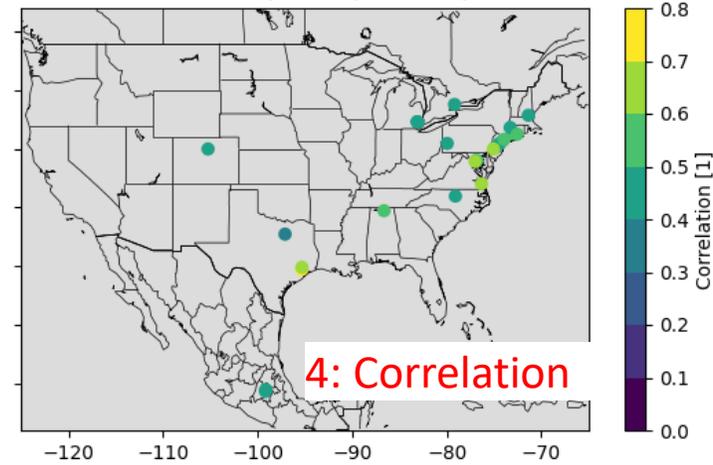
### 1: Spatial Variability

(TEMPO<sub>(50%)</sub> - Pandora<sub>(50%)</sub>) / Pandora<sub>(50%)</sub>



### 2: Good Biases

Correlation(TEMPO, Pandora)

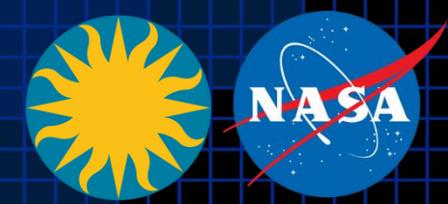


### 4: Correlation

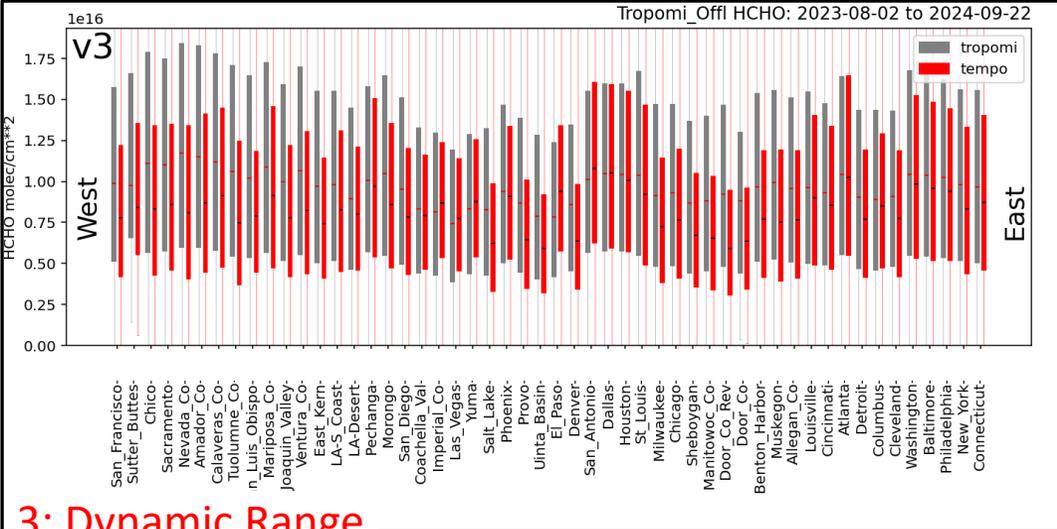
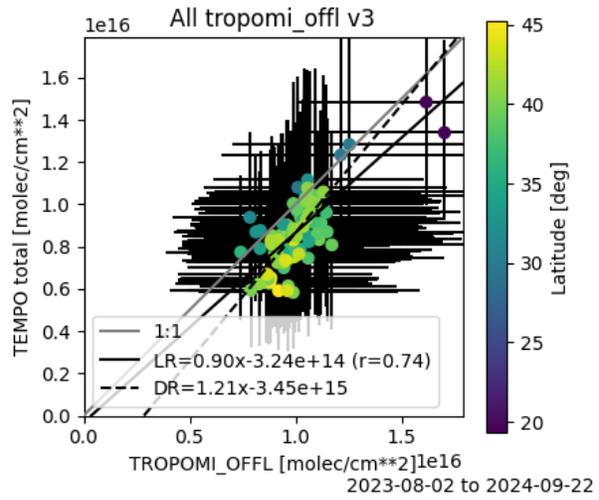


# Example Routine Evaluation Analysis

## TEMPO L2 vs TropOMI Tropospheric HCHO



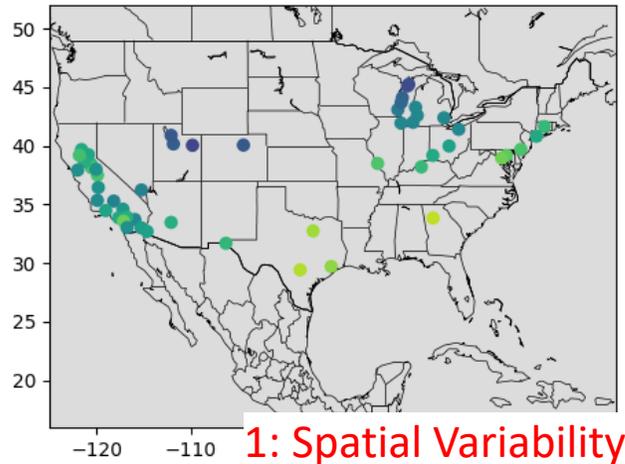
### 1: Spatial Variability



- TropOMI correlation is useful because we don't have Pandora everywhere.
- Here we explore comparisons at Ozone Nonattainment Areas
- Unlike NO2, the diurnal cycle of HCHO is not strong many places which implicitly makes temporal correlation more challenging.

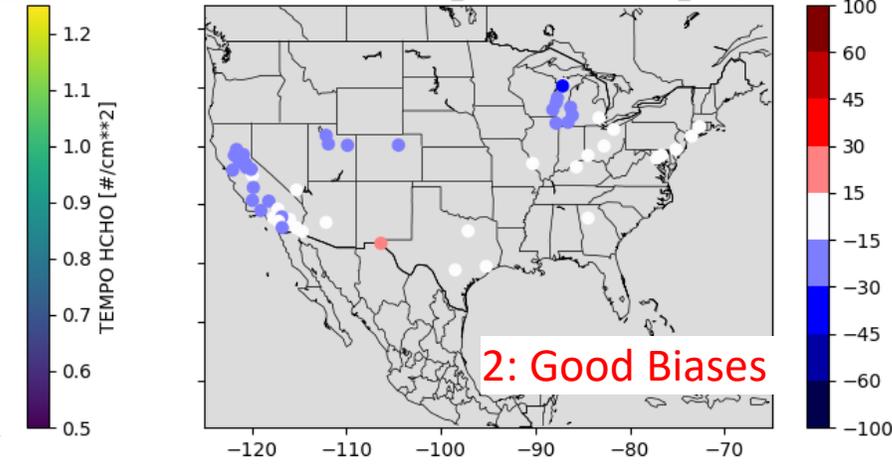
### 3: Dynamic Range

TEMPO HCHO



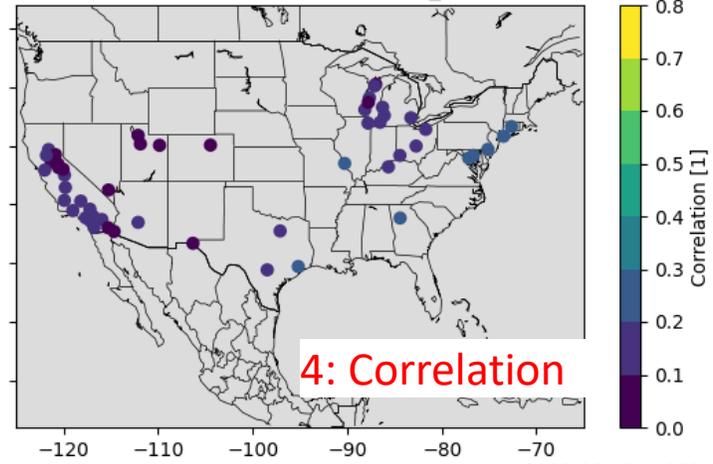
1: Spatial Variability

(TEMPO<sub>(50%)</sub> - Tropomi\_Off1<sub>(50%)</sub>) / Tropomi\_Off1<sub>(50%)</sub>



2: Good Biases

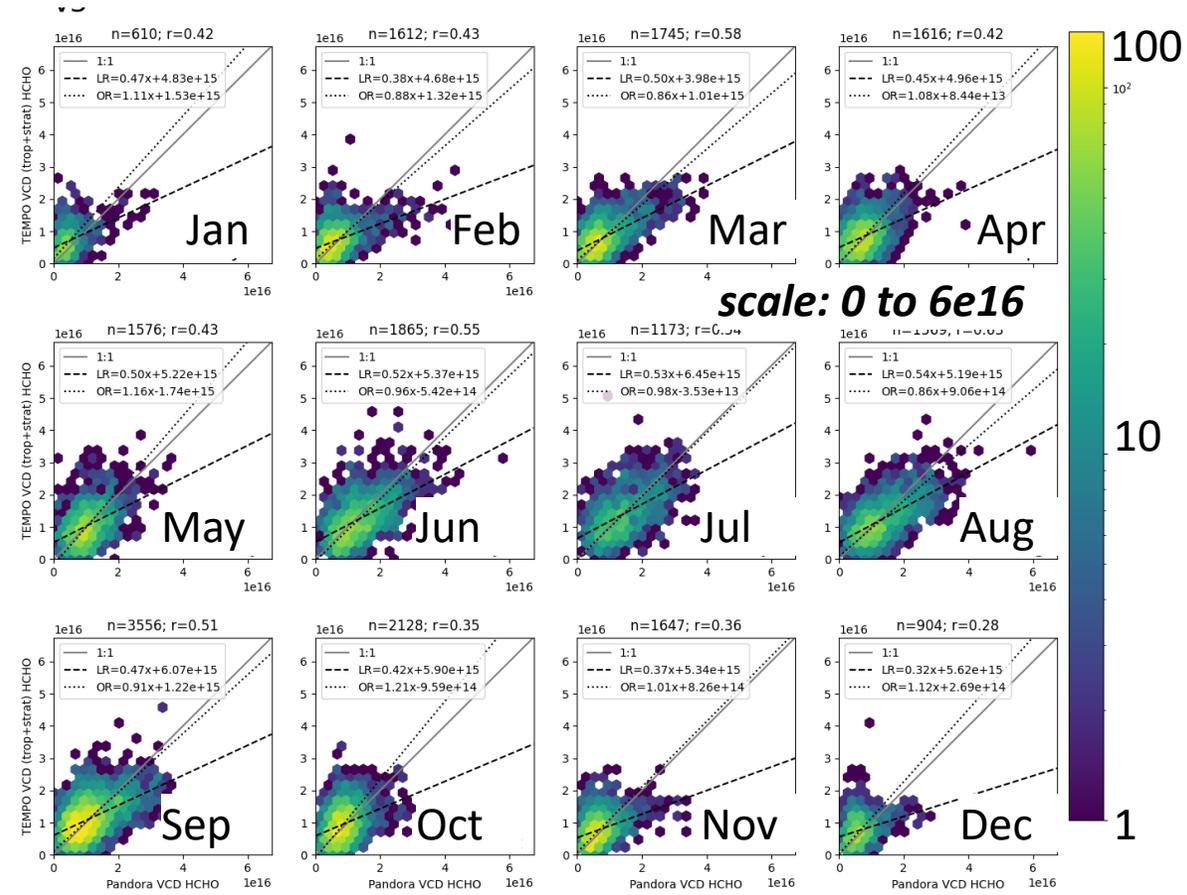
Correlation(TEMPO, Tropomi\_Off1)



4: Correlation

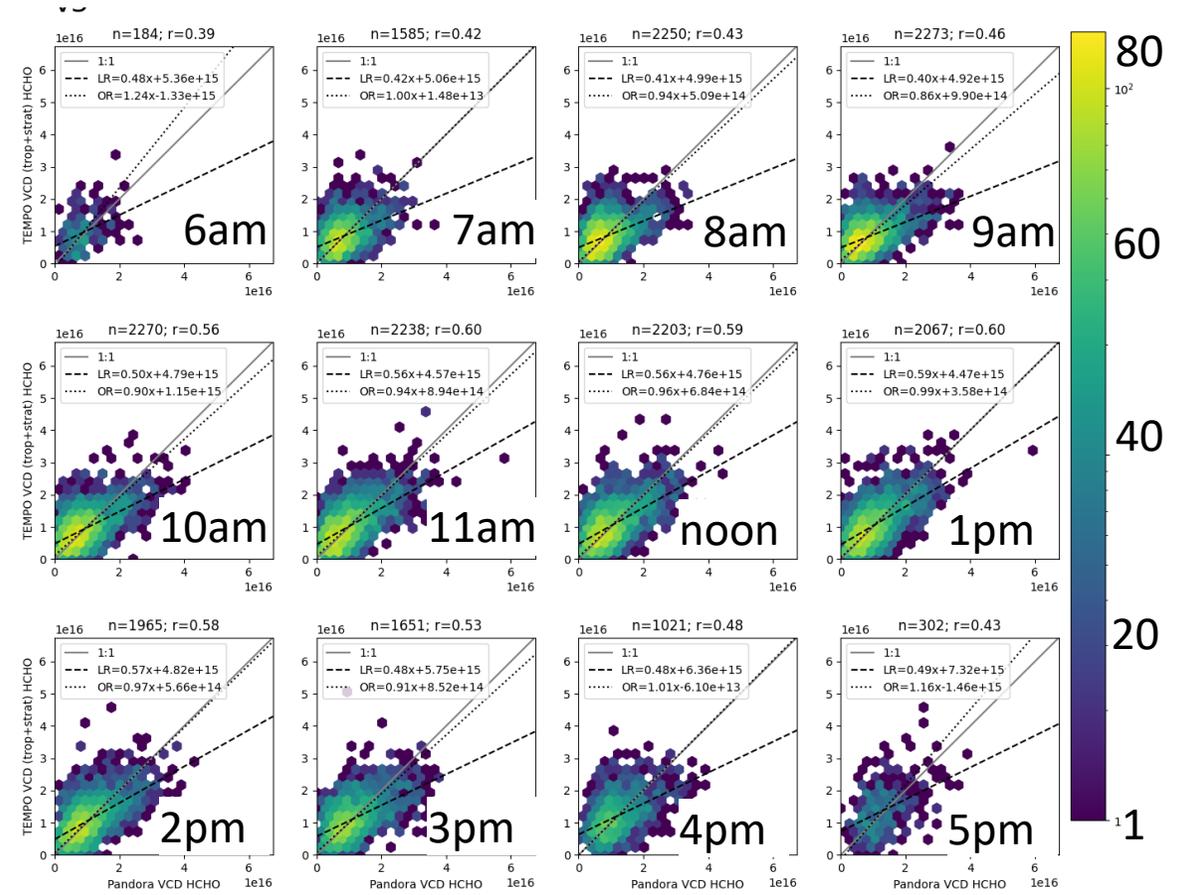
### Consistent monthly performance

- Dynamic range varies by month as expected
- Orthogonal slopes consistent



### Consistent diurnal performance

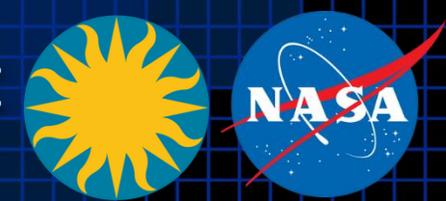
- Dynamic varies less by time of day
- Orthogonal important due air mass sampling.





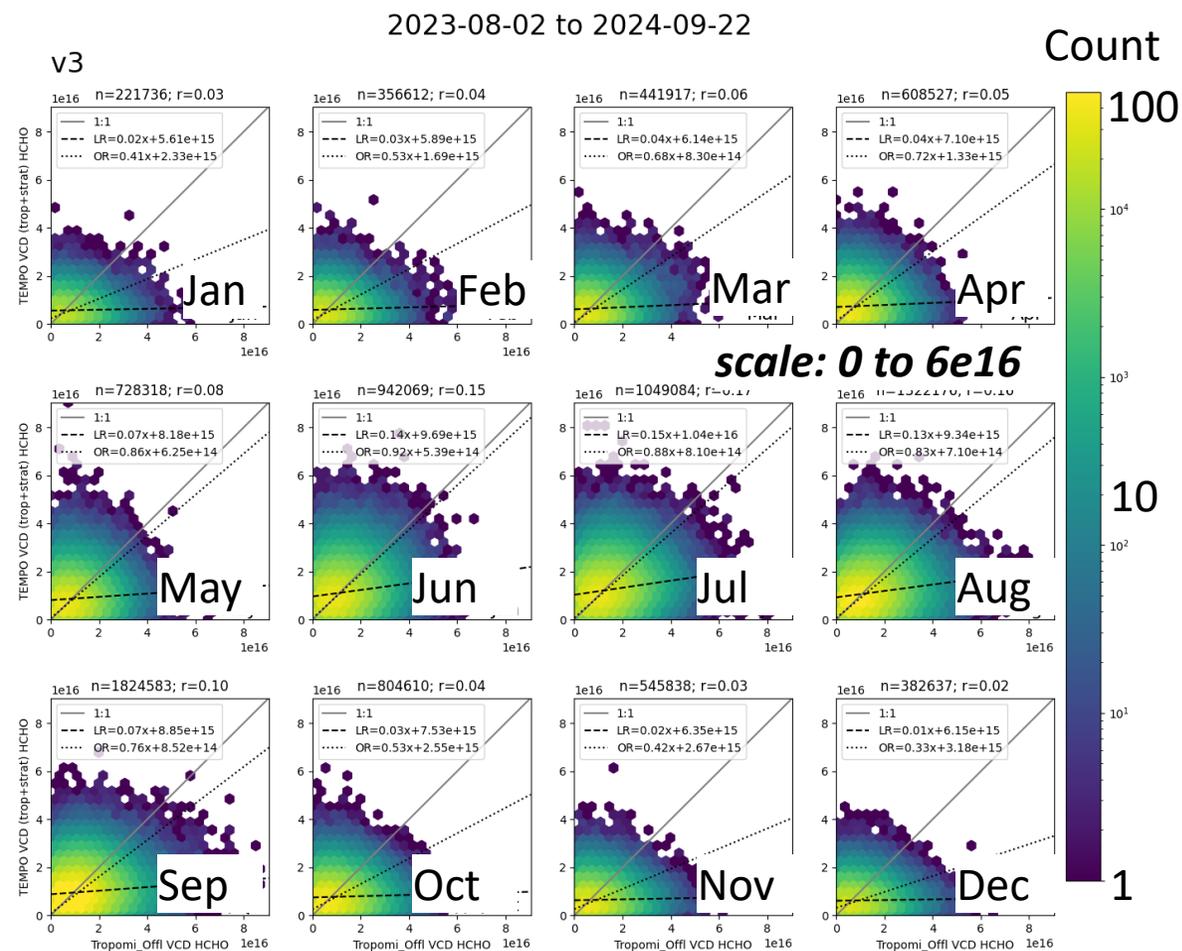
# Seasonal and Diurnal Performance is Consistent

## TEMPO L2 vs TropOMI Total HCHO

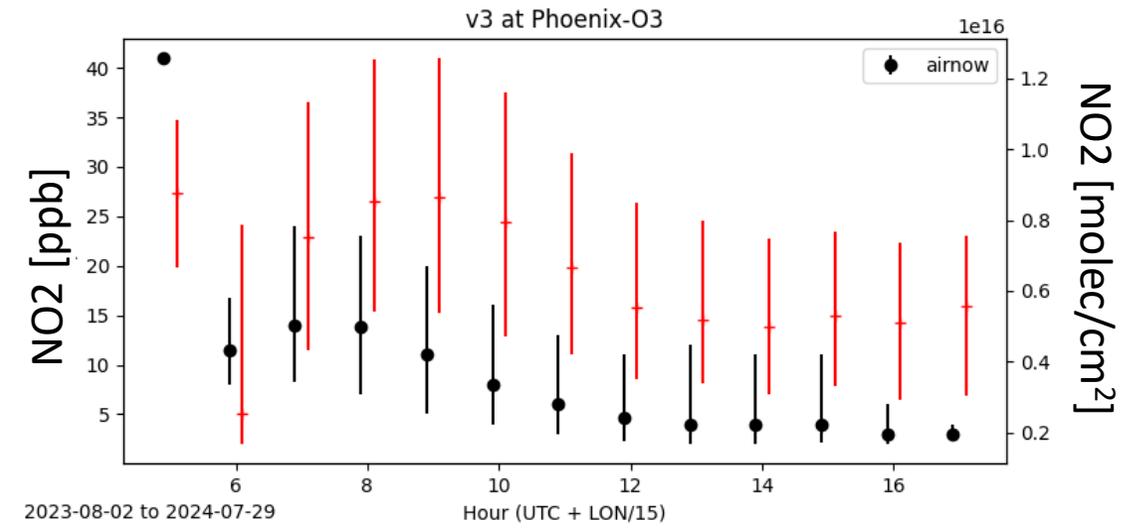
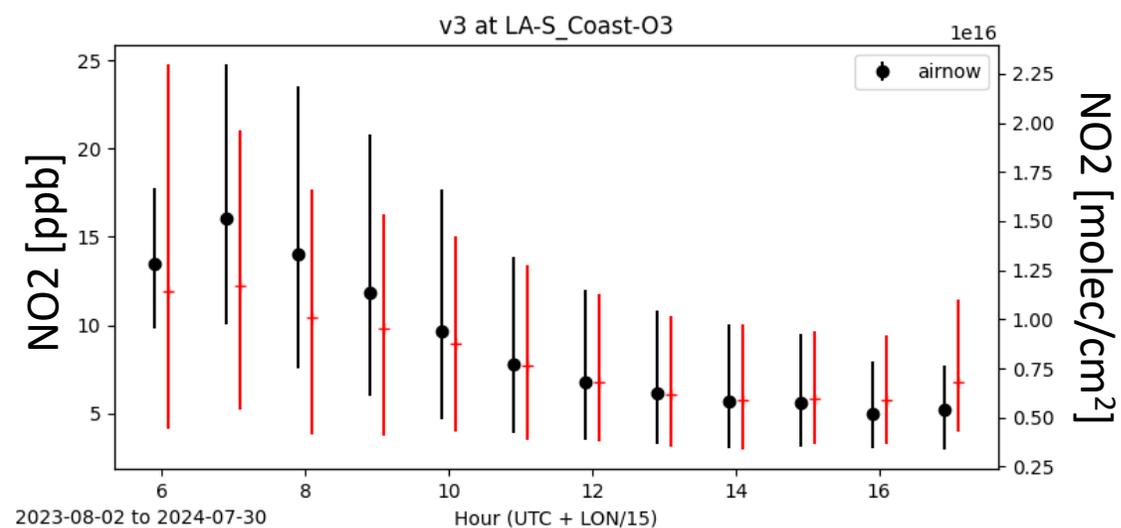
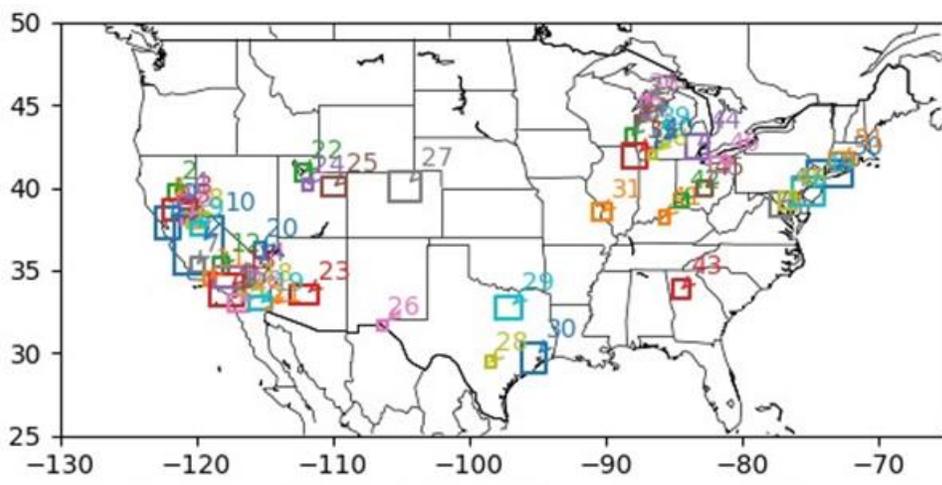


### Better Agreement in Summer

- Dynamic range varies by month as expected
- Larger seasonal changes in TEMPO than TropOMI.
- Orthogonal slopes lowest in winter
  - Steadily increasing from January to May
  - Decreasing after August
- By comparison, Pandora slopes were quite consistent.
- Suggest looking into potential TropOMI high-bias in Winter/Spring

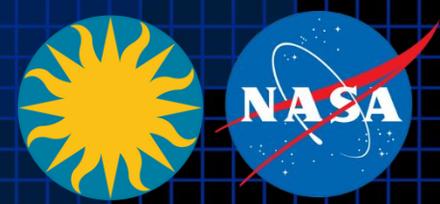


- Looking towards future applications.
  - We know that columns and surface concentrations shouldn't always correlate well.
  - Where do they correlate well enough and why?
- How can we transform columns to better correlate with surface?
- How can this be useful for nonattainment or near-realtime mapping? What about annual mean surfaces for exposure?





# Summary of Validation



- Thanks to: Henderson.Barron@epa.gov
  - Kelly, SAO Team, and NASA TEMPO Project Team for delivering on the promises of TEMPO!
  - NASA LaRC ASDC for assistance to connect TEMPO to RSIG APIs and increase accessibility!
  - Pandonia Global Network and State and Local agencies for working with EPA to expand Pandora measurements!
  - Research groups and researchers who have contributed their time and analysis in support of TEMPO validation!
- Given the short timeline for TEMPO baseline mission, early data access to support a community led validation effort was critical.
- Nitrogen dioxide and formaldehyde results contribute to both the beta and provisional maturity levels outlined in the validation plan.
  - Assessing bias, precision and uncertainty (NO<sub>2</sub>-02, NO<sub>2</sub>-04, HCHO-02 and HCHO-04)
  - Inter-site gradients contributes to urban/rural gradient assessments (NO<sub>2</sub>-01 and HCHO-01)
- EPA's automated validation software will continue to assess TEMPO L2 products!

Slides at:

