

# Validation of tropospheric NO<sub>2</sub> columns measurements from GOME-2, OMI and TROPOMI using MAX-DOAS and direct-sun network observations with focus on dilution effects

Gaia Pinardi, Michel Van Roozendael, François Hendrick, Nicolas Theys, Steven Compernelle, Jean-Christopher Lambert, Pieter Valks, Song Liu, Folkert Boersma, Henk Eskes and NIDFORVAL NO<sub>2</sub> team

# 1. SATELLITE DATA

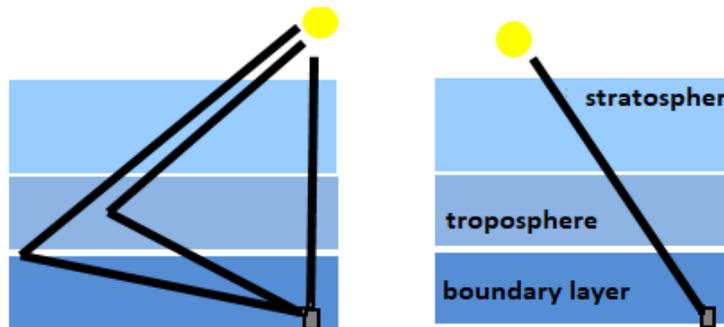
OMI and GOME-2 NO<sub>2</sub> data

$$VCD_{tropo} = \frac{(SCD - AMF_{strato} * VCD_{strato})}{AMF_{tropo}}$$

DOMINO v2.0: Boersma et al. 2011  
 QA4ECV v1.1: Boersma et al. 2018  
 GOME-2 GDP 4.8: Valks et al. 2011

Similar approach but different stratospheric correction, a-priori profile choices, cloud algorithms, ...

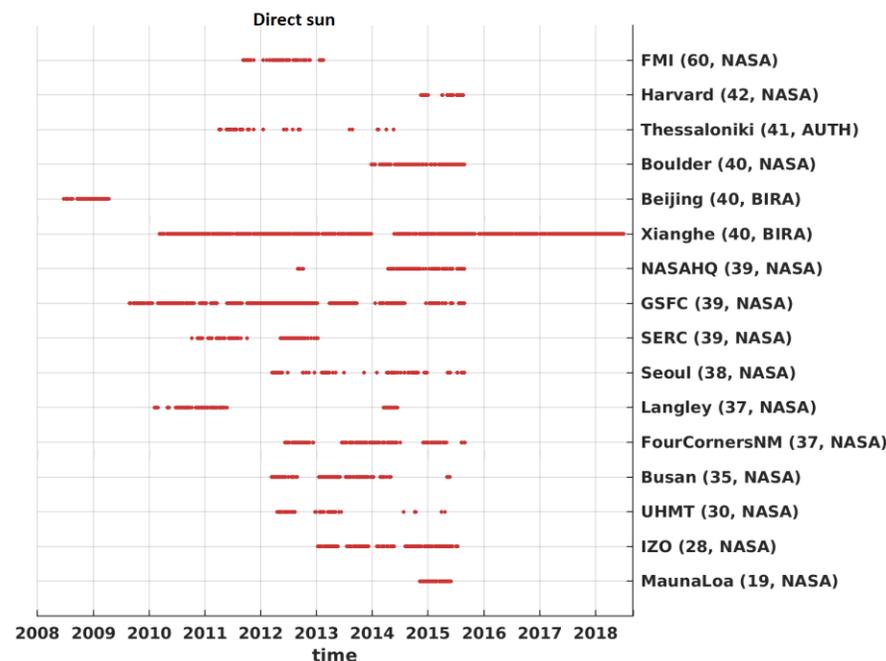
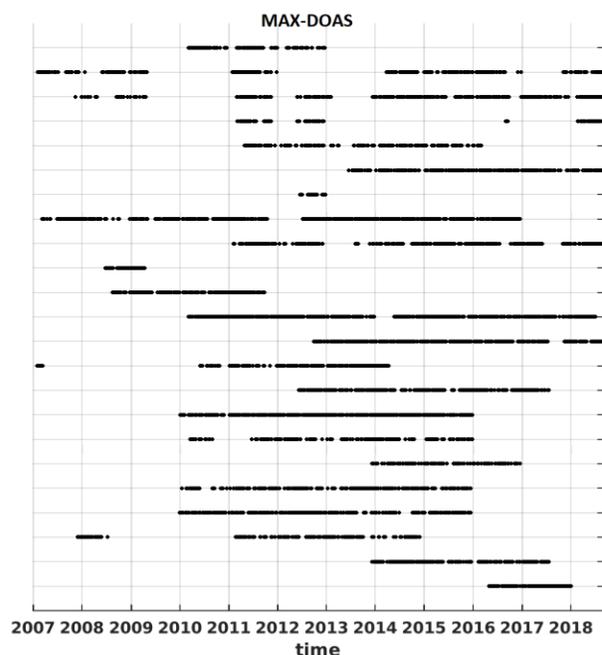
# 2. GROUND-BASED DATA



Estimate tropospheric content from direct sun measurements:

$$VCD_{tropo}(DS) = VCD_{tot}(DS) - VCD_{strato}(SAT)$$

23 MAX-DOAS and 16 direct sun stations



Several retrieval methods exist: geometrical approximation, Optimal Estimation and parametrized profiling – focus on VCD<sub>tropo</sub>

Mostly Pandora instruments

# 1. SATELLITE DATA

OMI and GOME-2 NO<sub>2</sub> data

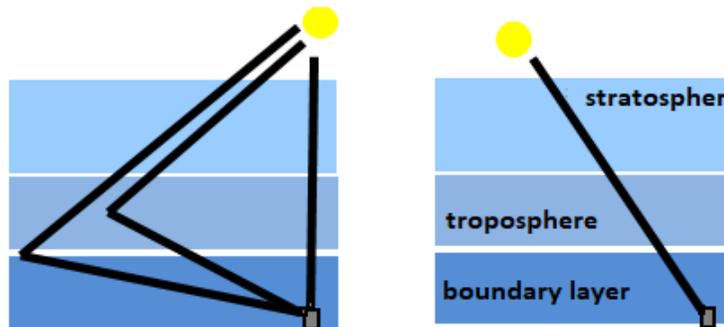
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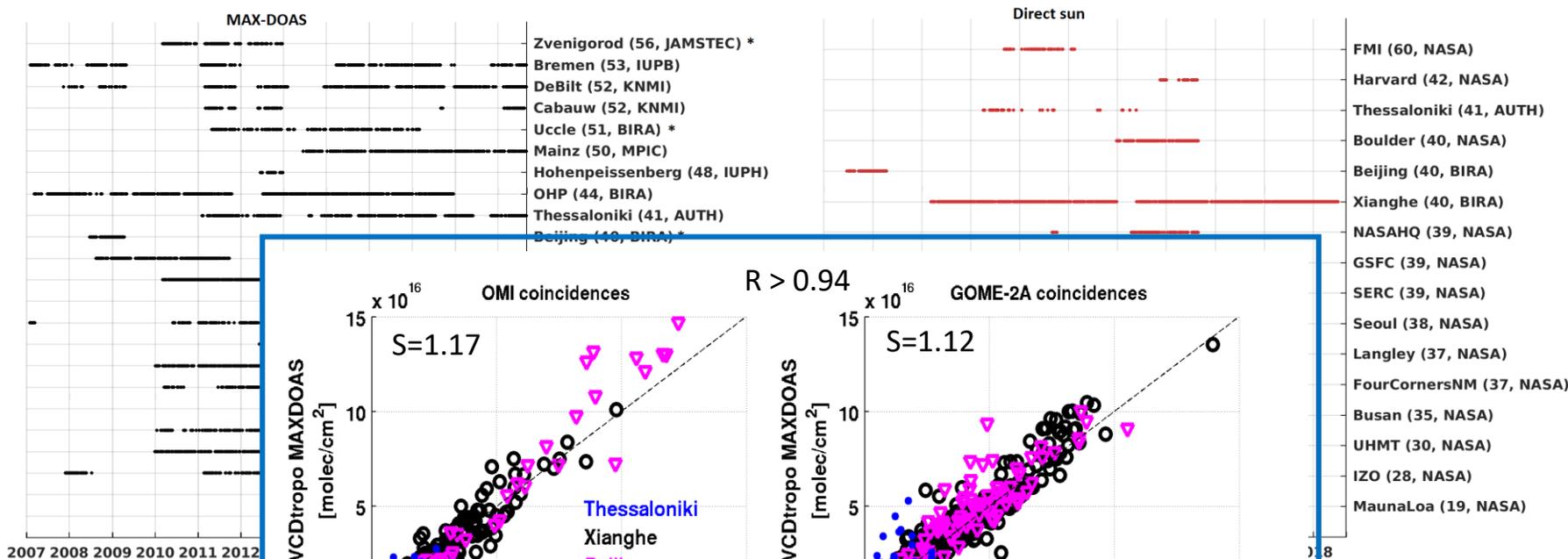
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MAX-DOAS and direct sun coherence at 3 common stations: small bias 10-15%

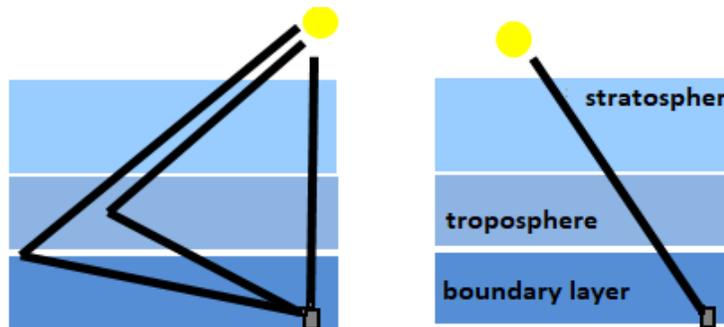
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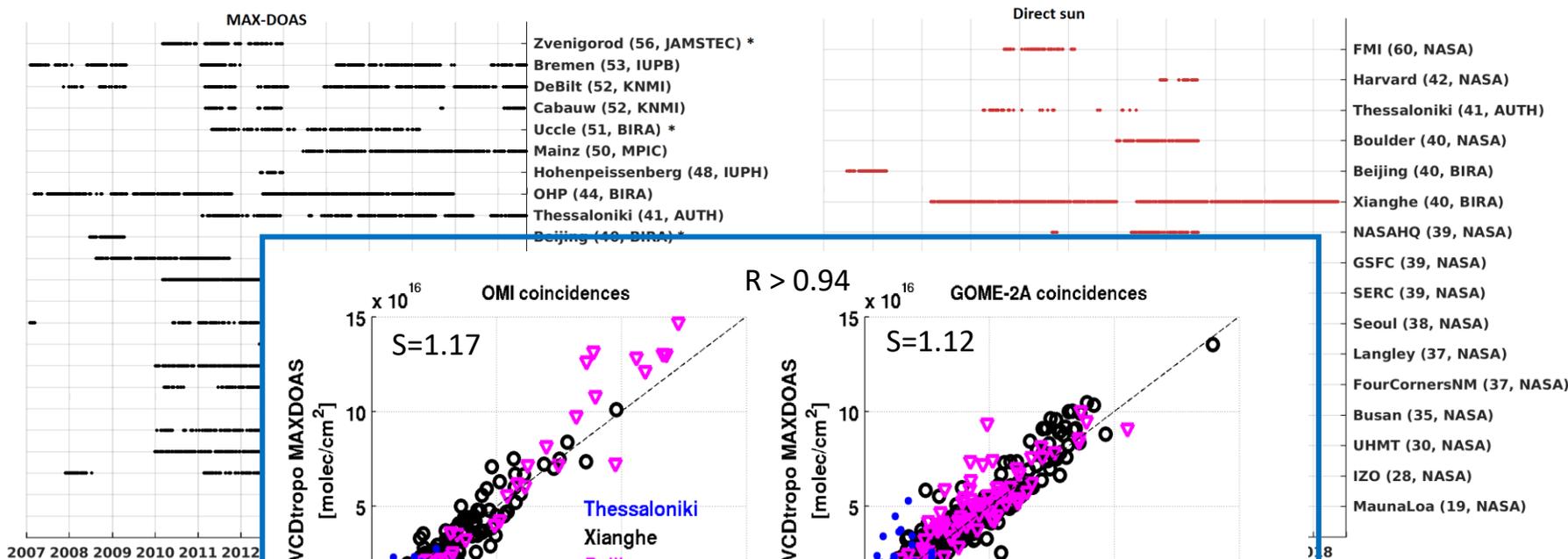
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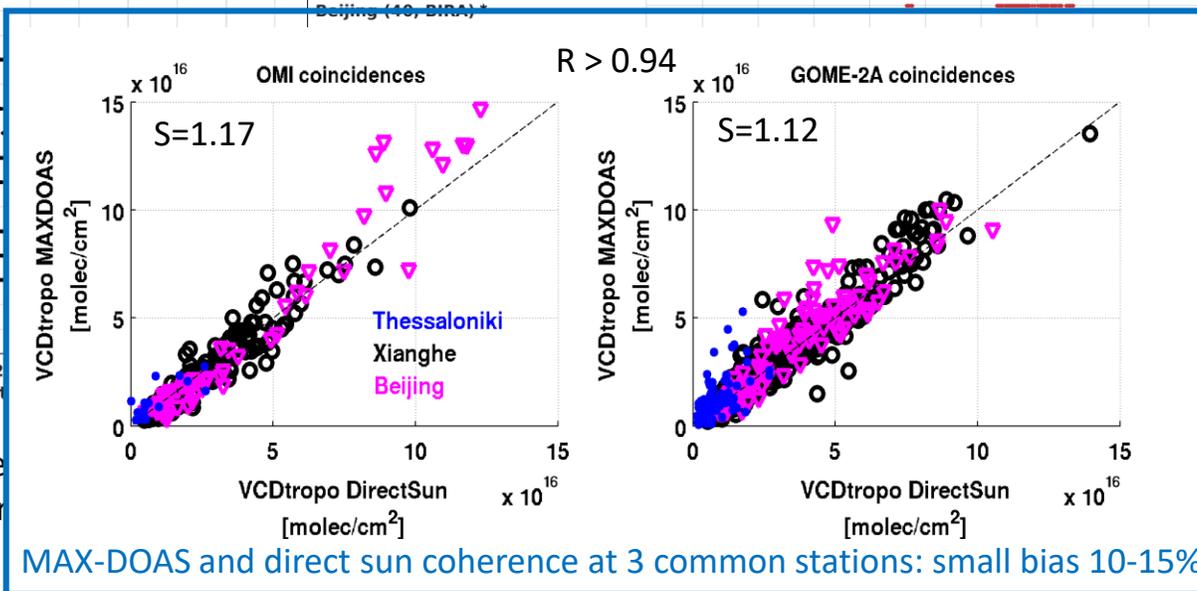
23 MAX-DOAS and 16 direct sun stations



# 3. COMPARISON METHOD

- Extraction of satellite data 50 km around the 36 stations for CRF < 50%, smaller pixels and AMF<sub>tropo</sub>/AMF<sub>geom</sub> > 0.2
- Closest and mean of pixels per day
- Test with pixels over station
- Interpolate GB at SAT overpass time or average around 1h

Several retrieval methods e  
Optimal Estimation and par

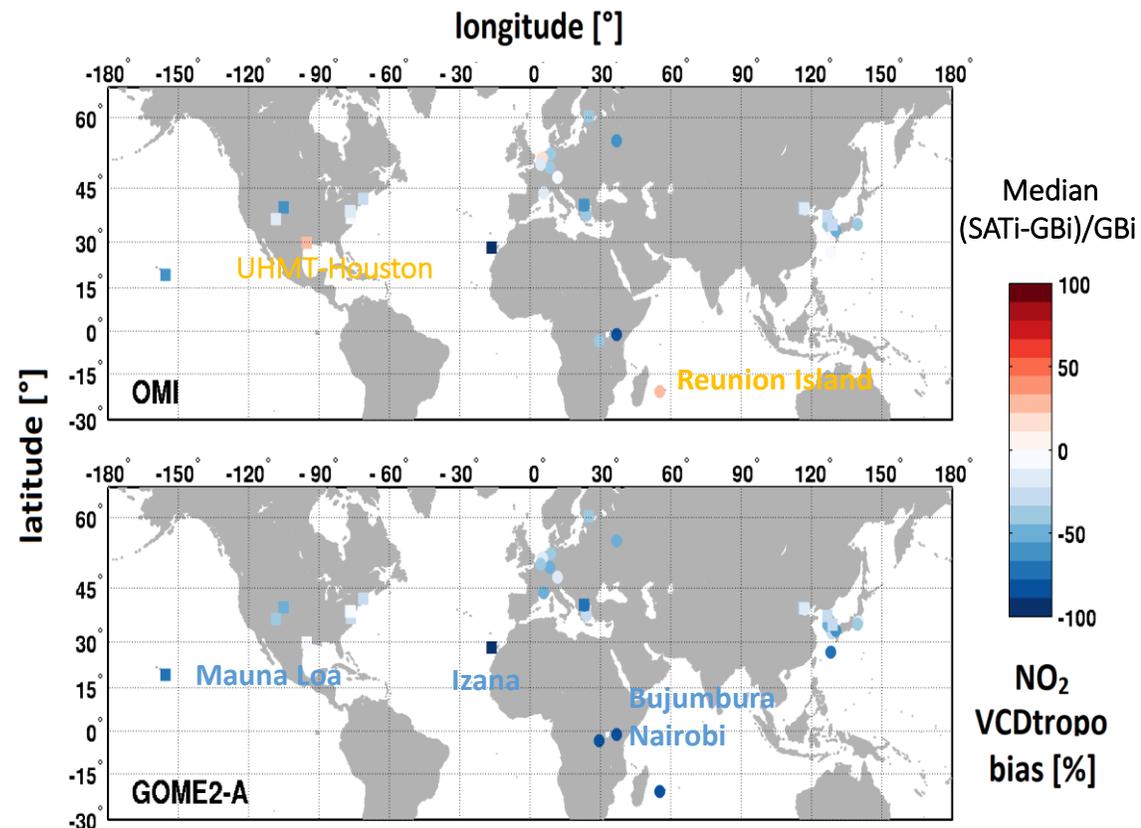
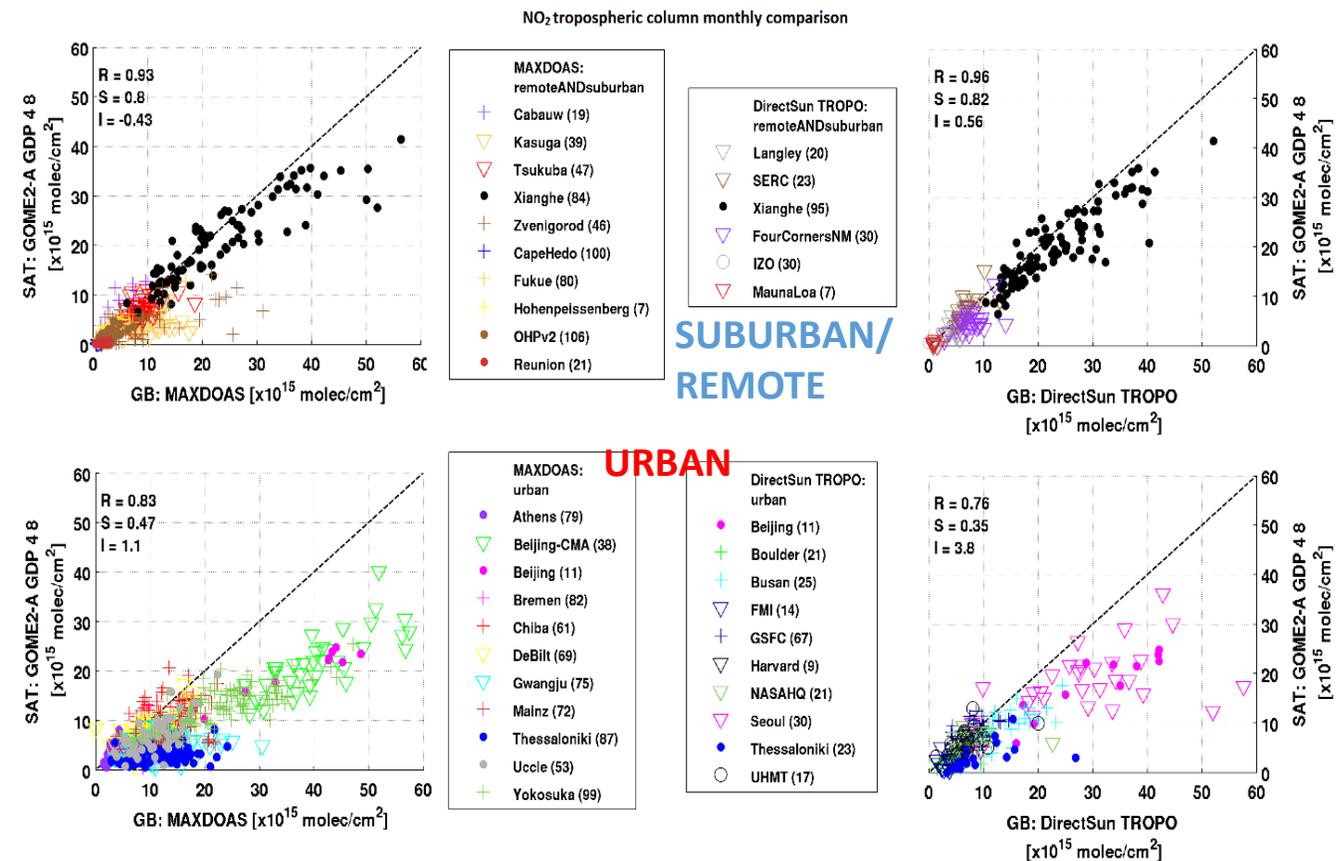


MAX-DOAS and direct sun coherence at 3 common stations: small bias 10-15%

# RESULTS

## GOME-2A GDP 4.8

Similar negative results for OMI DOMINO and GOME-2A GDP, only few exceptions:



smaller slopes and larger biases are found at urban locations compared to background/sub-urban ones

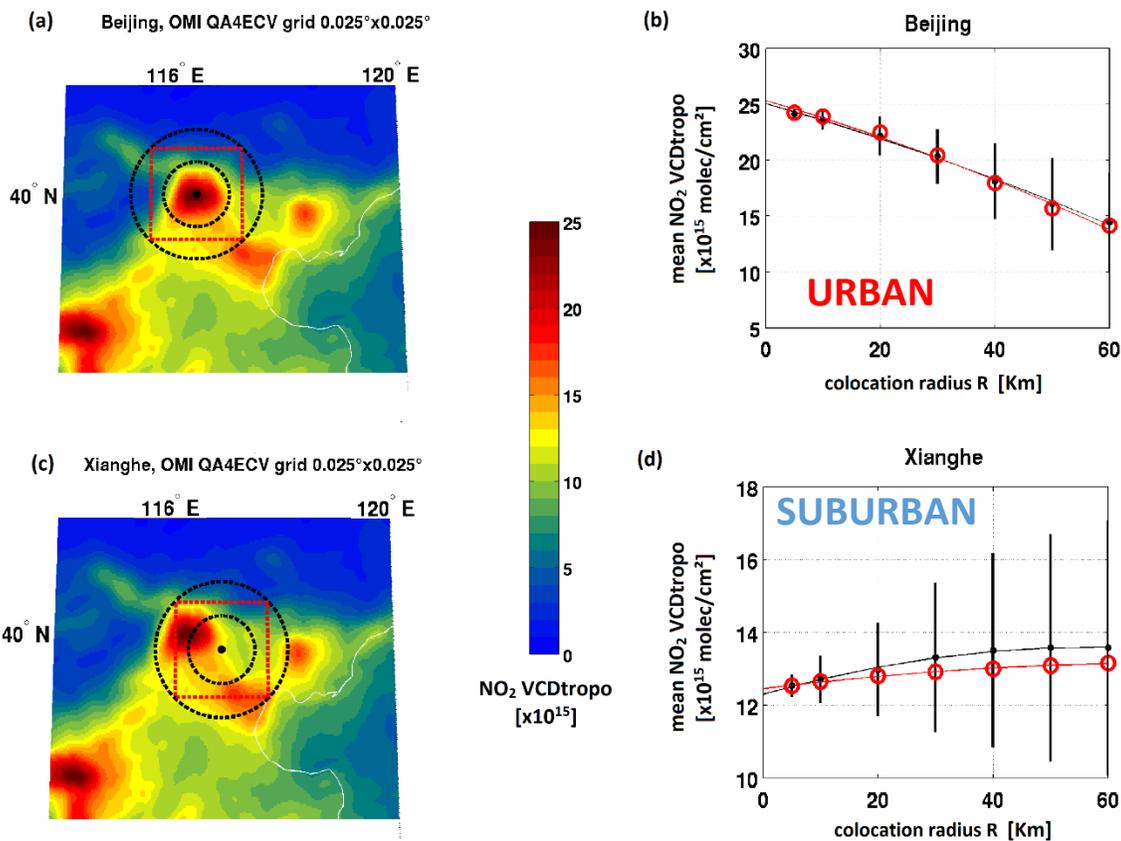
Similar picture for OMI and GOME2 (10 out of 16 direct sun and 10 out of 23 MAX-DOAS sites have differences in validation bias < 15%)

# UNDERSTANDING THE RESULTS

## exploration of the horizontal smoothing effect due to the pixels selection: dilution effect

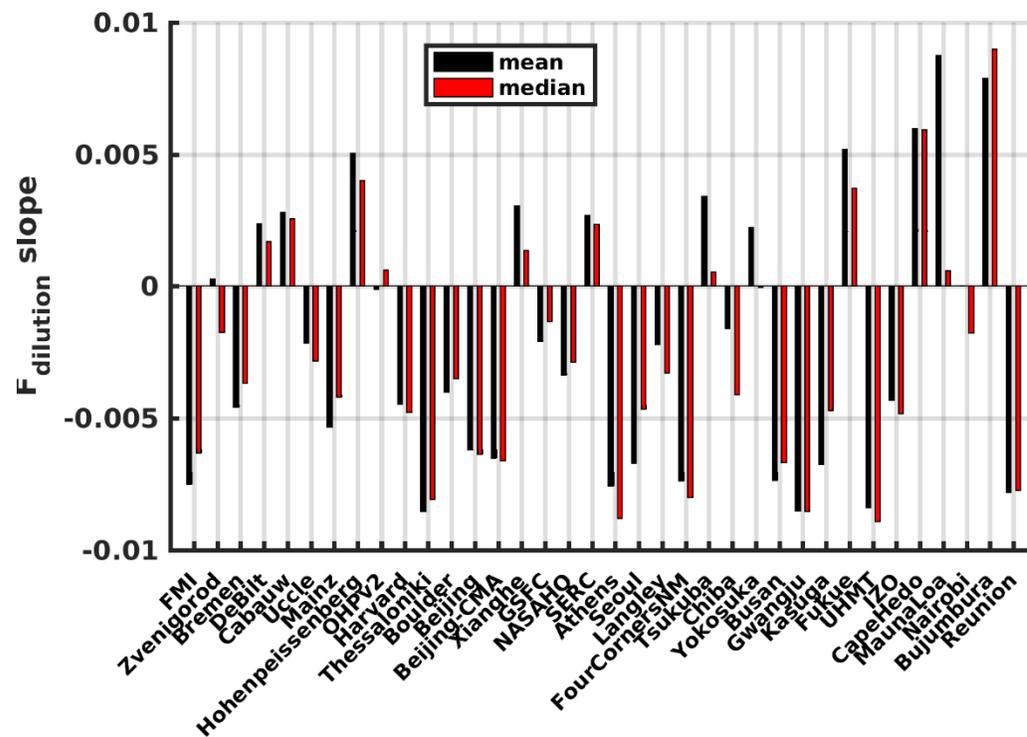
investigate the horizontal variability of the NO<sub>2</sub> field at the 36 different stations: using one full year (2005) of OMI NO<sub>2</sub> QA4ECV dataset v1.1 (Boersma et al., 2018), to map the average NO<sub>2</sub> column distribution at a grid of 0.025°x0.025° (only using the smallest OMI pixels, rows 11 to 49)

variation of the tropospheric NO<sub>2</sub> VCD sampled in concentric circles of different radii around each of the stations:



Estimate the dilution factor:

$$F_{dil}(R) = NO2\_VCD(R)/NO2\_VCD(0)$$

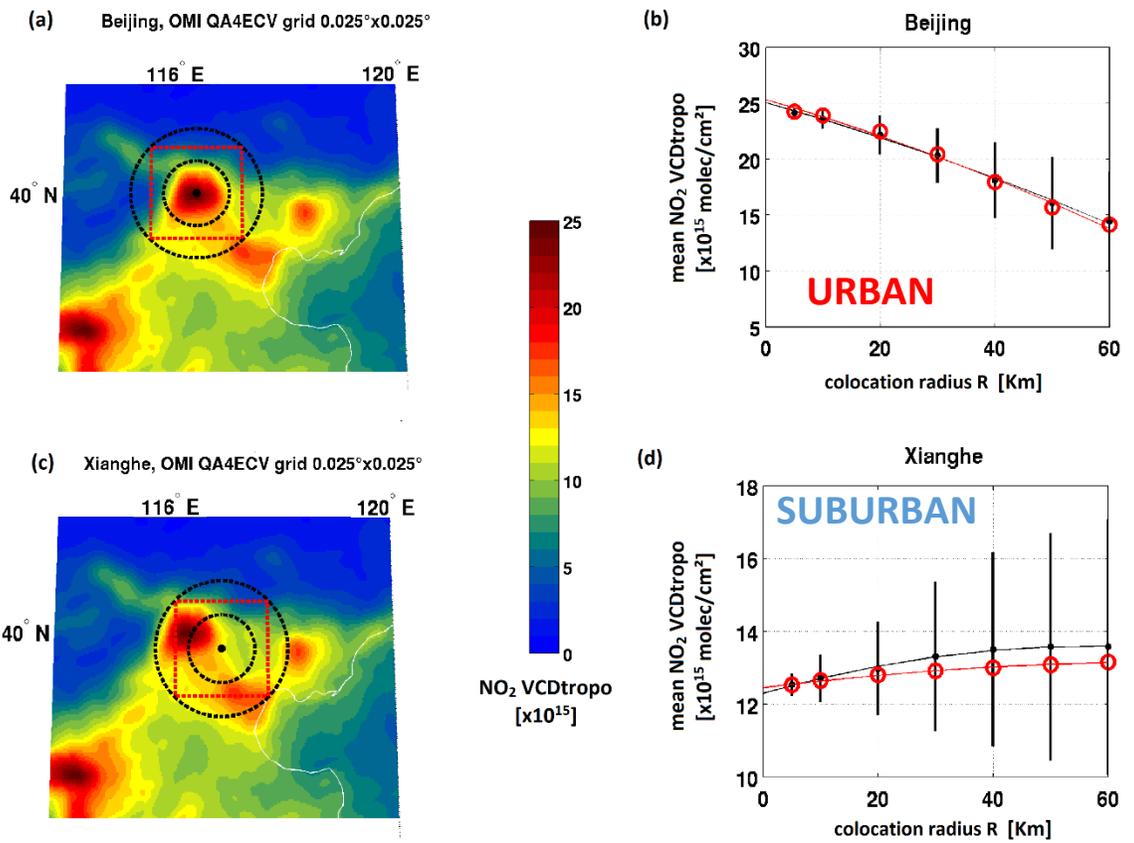


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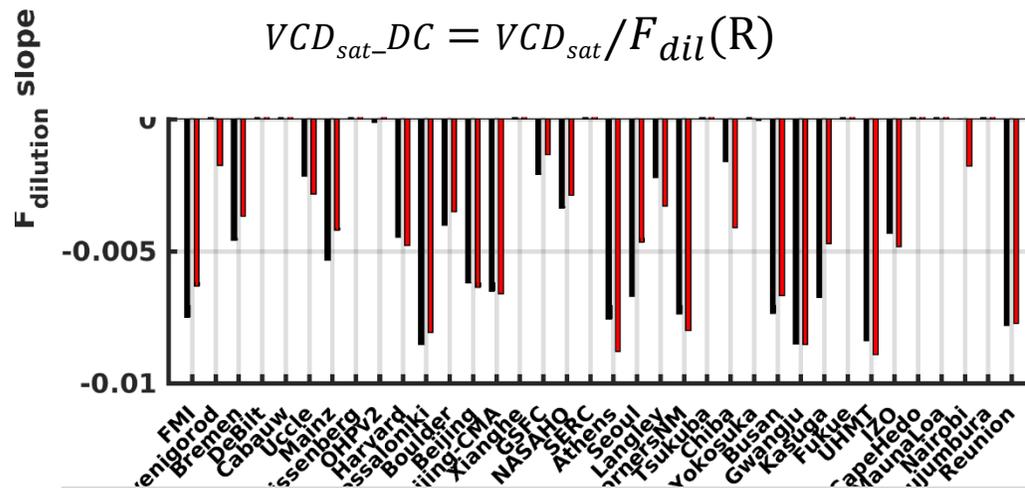


Estimate the dilution factor:

$$F_{dil}(R) = NO2\_VCD(R)/NO2\_VCD(0)$$

Use it to correct the satellite data, for site where this factor is negative:

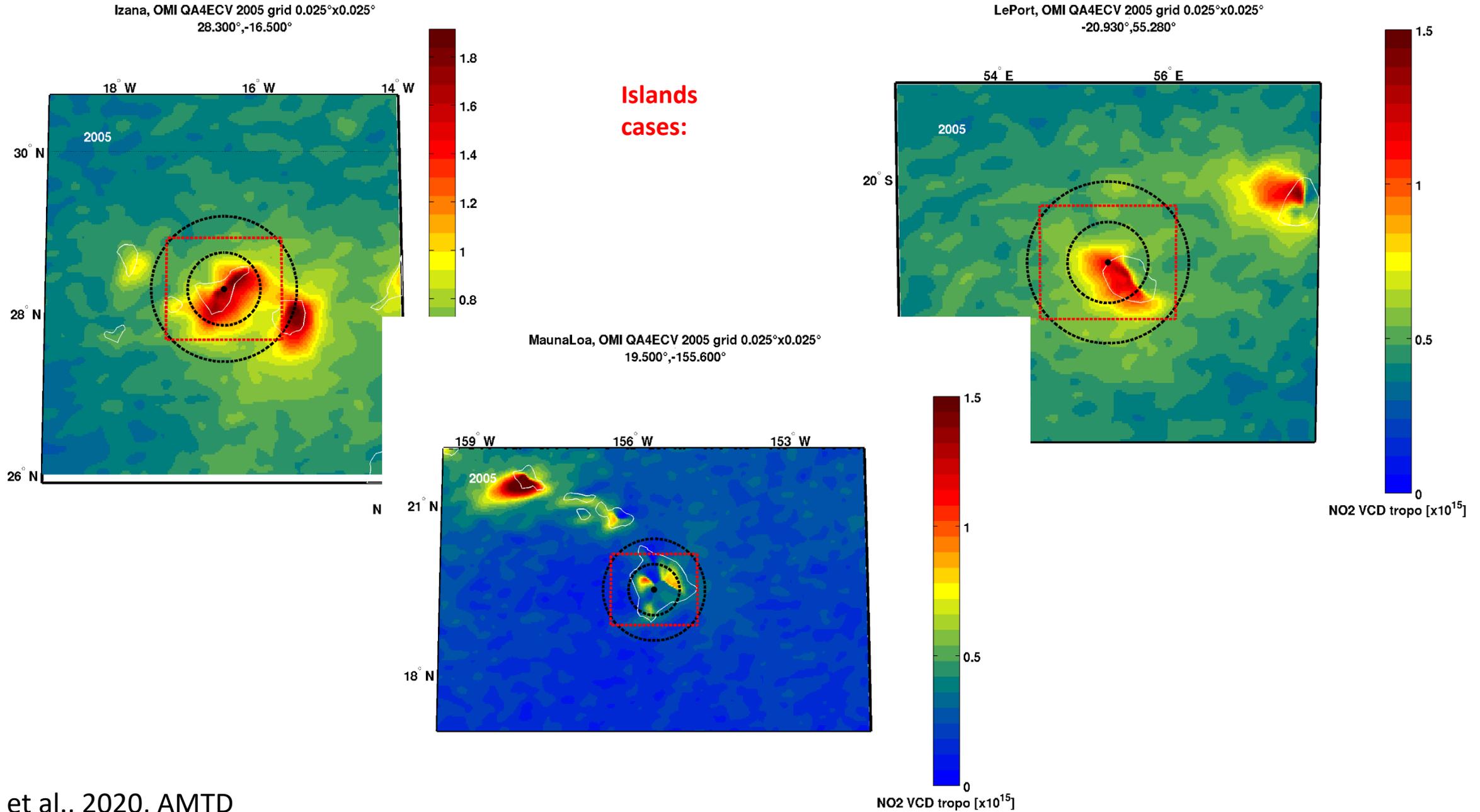
$$VCD_{sat-DC} = VCD_{sat}/F_{dil}(R)$$



Typically, applied to large urban sites, stations isolated on small islands or stations close to a large power plant (→ UIPP) - sites characterized by a NO<sub>2</sub> hotspot surrounded by a clean area

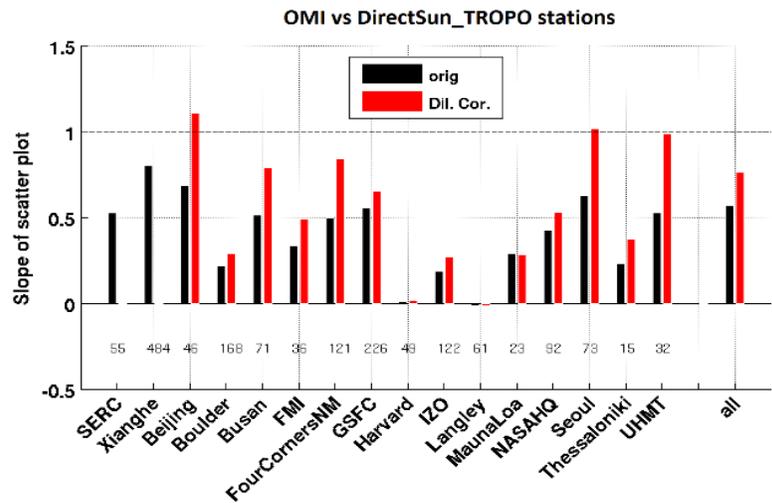
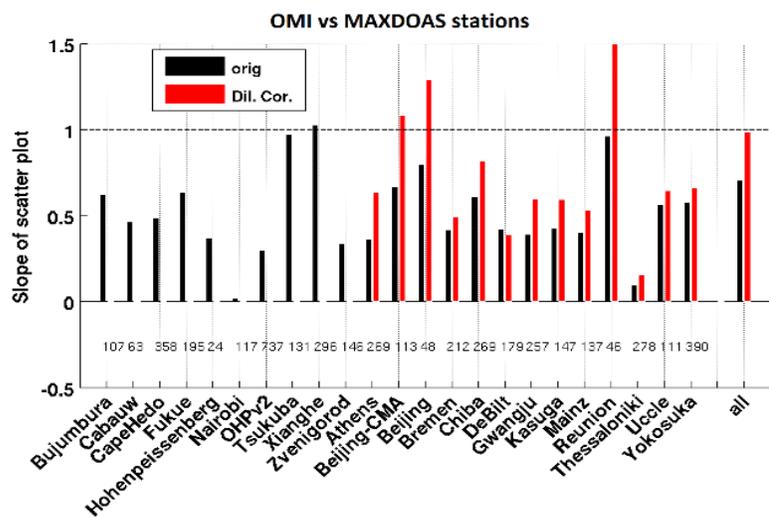
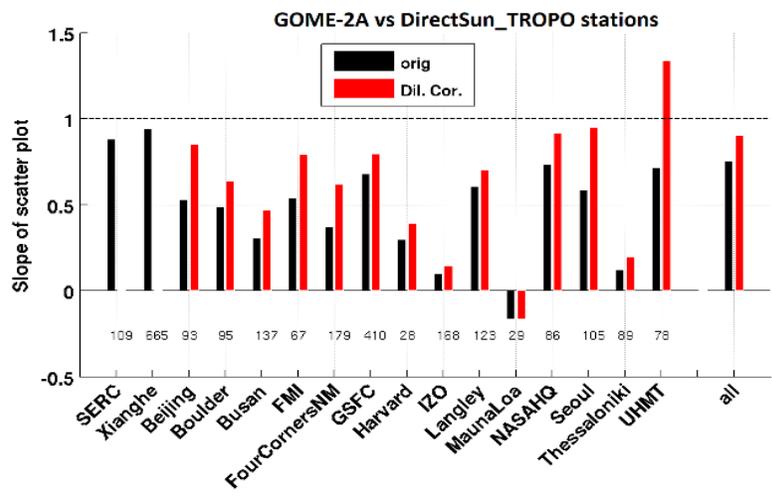
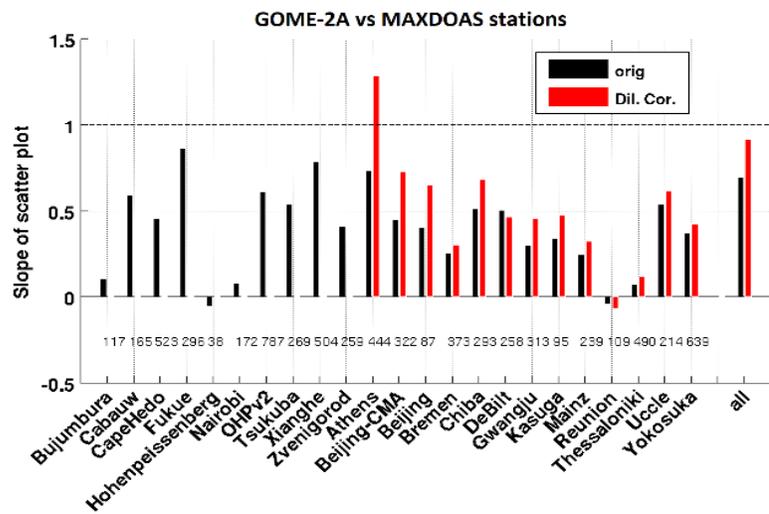
# UNDERSTANDING THE RESULTS

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# RESULTS USING THE DILUTION CORRECTION

Impact on daily per-station scatter plots: slopes of the linear regressions:



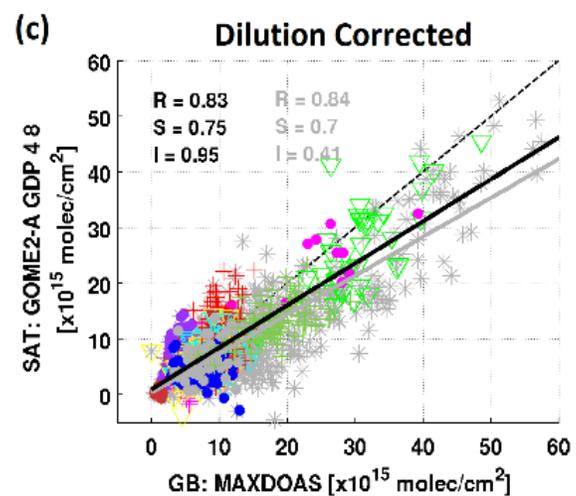
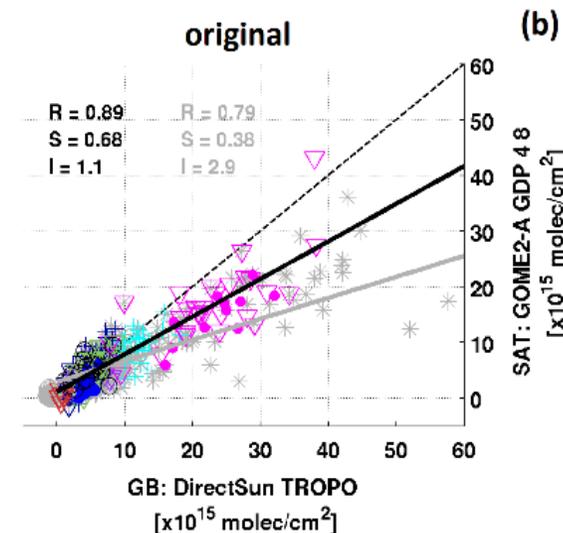
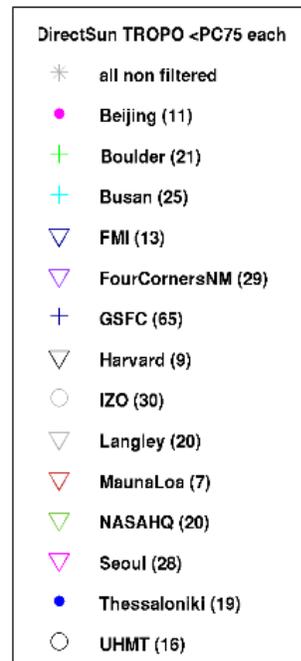
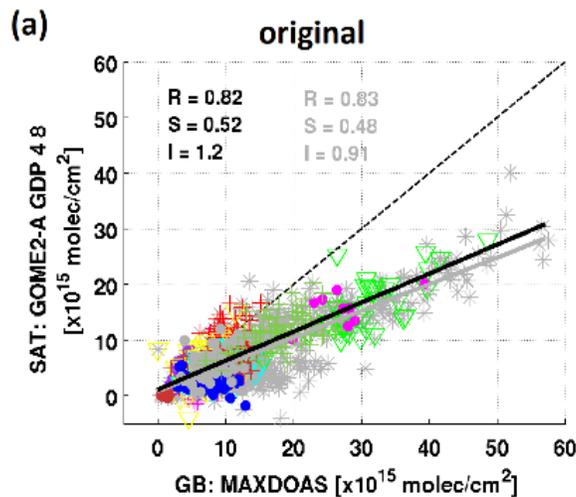
Generally slopes closer to 1 with Dilution Correction, but some negatives (stratospheric correction for DS?), and over-estimation for a few sites (for some satellite data).  
Some sites: very small slopes (very local GB signal: Nairobi, Thessaloniki, Harvard)

Filter of daily comparison points (removing values larger than the 75th percentile of GB values of each station) to excludes large local values that cannot be captured by satellite measurements → allows for a more robust statistical regression analysis

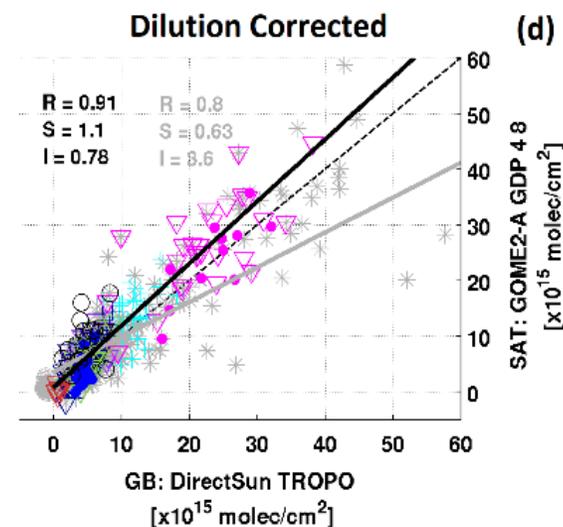
# RESULTS USING THE DILUTION CORRECTION

Impact on monthly-mean overview scatter plots at UIPP sites with/without correction:

+ impact of percentile 75 filtering (grey to black regression lines)



S: 0.52 to 0.76 for MAX-DOAS and 0.67 to 1.1 for direct sun data



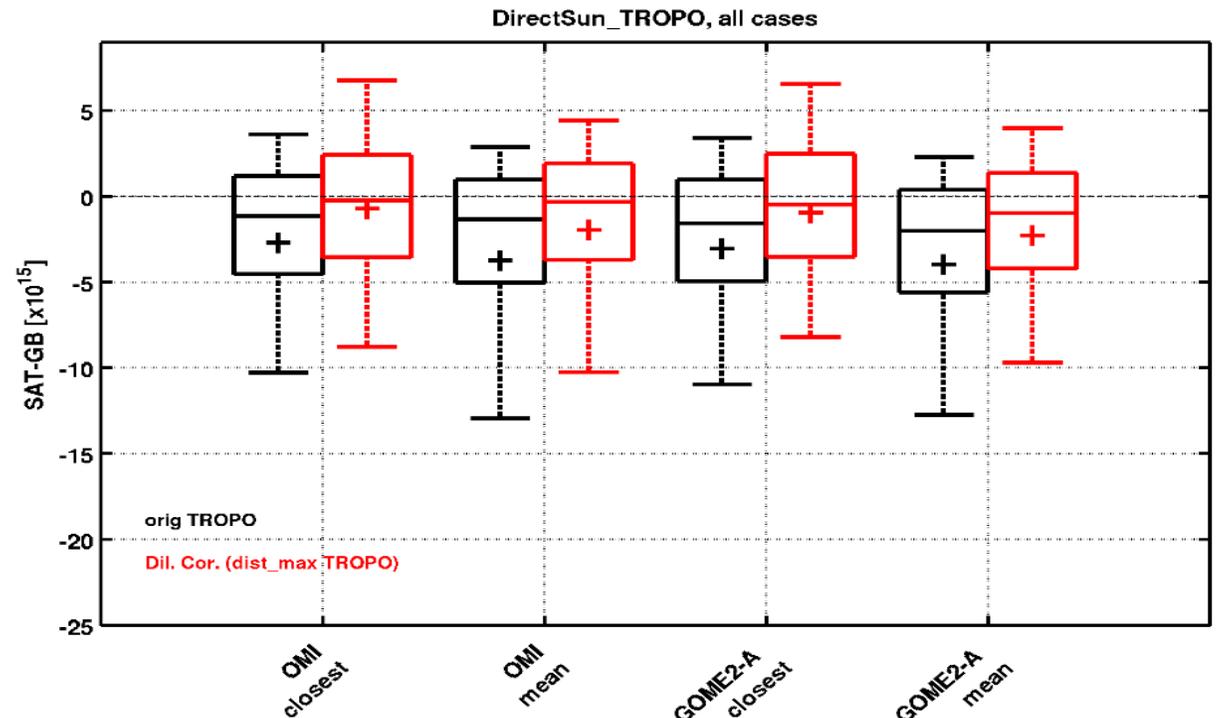
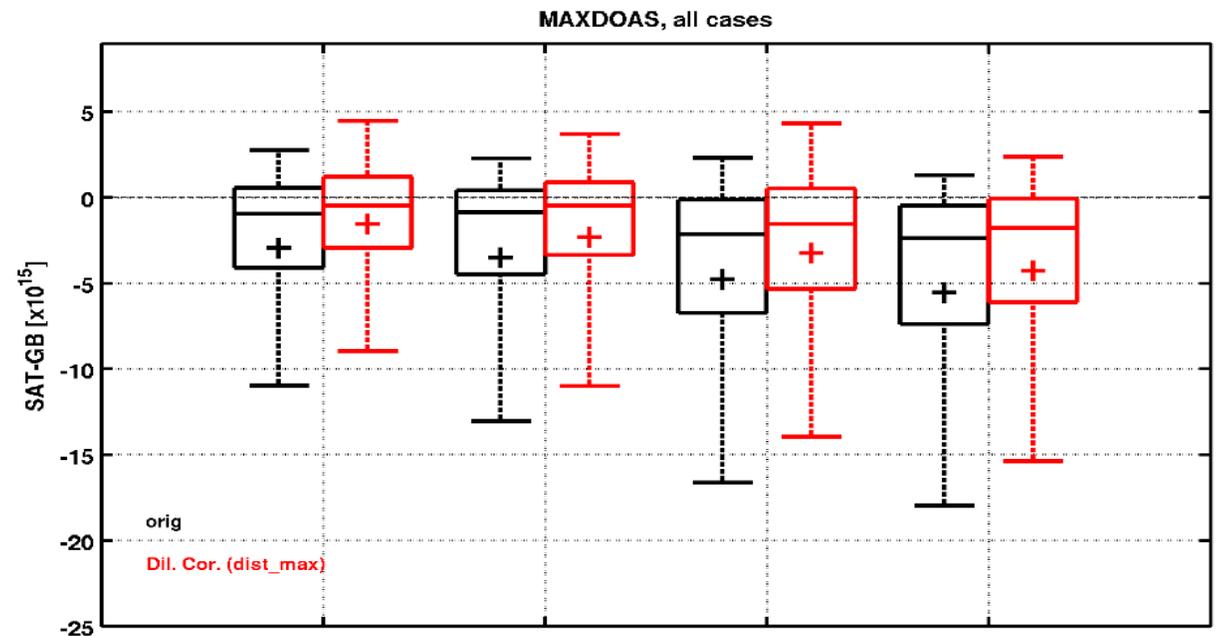
direct sun data are more affected by the filtering (S from 0.38 to 0.67) than MAX-DOAS ones (S: 0.49 to 0.52). → likely related to sampling of sites. Pandoras tend to be located closer to strong NO<sub>2</sub> emission sources than MAX-DOAS instruments

## RESULTS USING THE DILUTION CORRECTION

Impact on biases at all sites with/without correction:

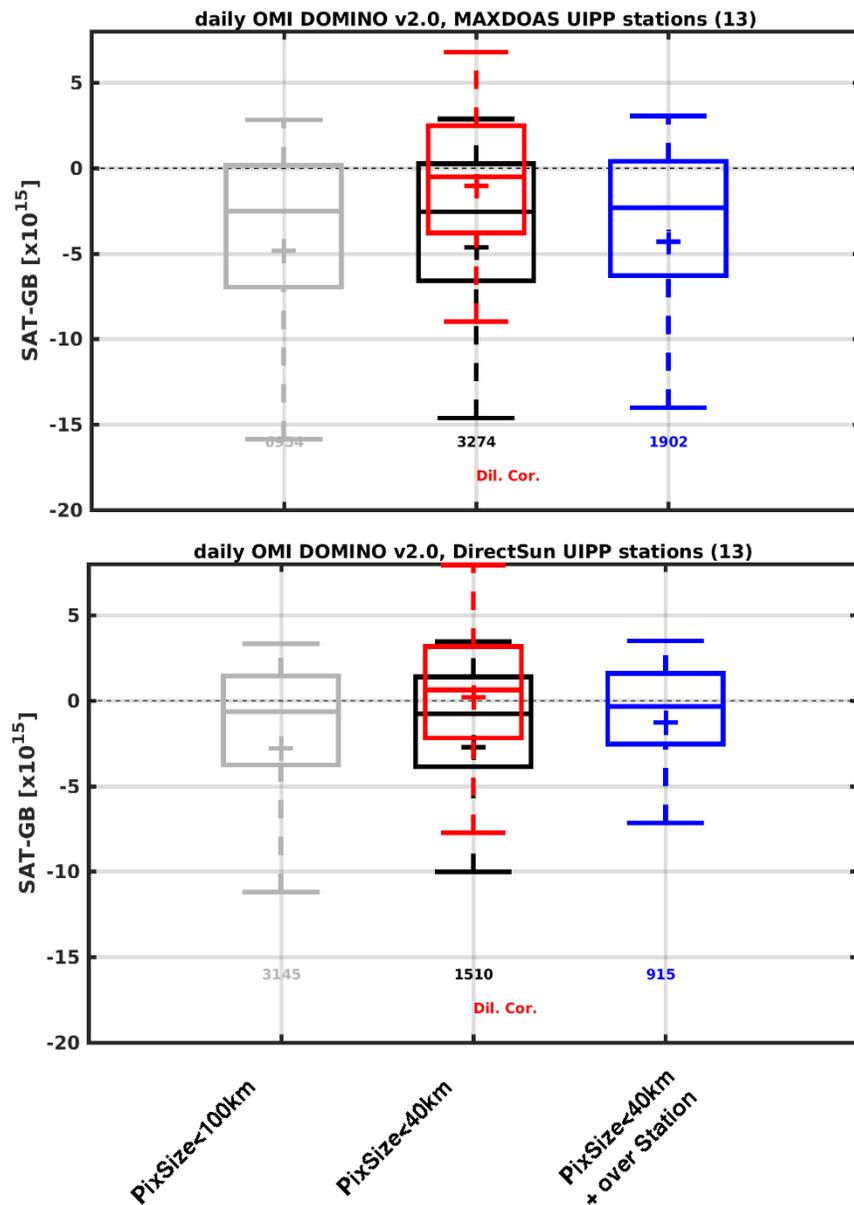
For different selections of satellite pixels: closest cloud free pixel per day, or daily average within 50km

- overall agreement better for OMI comparisons
- after dilution correction, slightly better for direct sun than for MAX-DOAS sites (cf site sampling)
- Larger spread in MAX-DOAS comparisons (measurements made under more variables conditions, e.g. cloudy conditions)
- Best agreement: daily closest OMI vs direct sun (median bias  $-1.16 \times 10^{15}$  to  $-0.23 \times 10^{15}$  molec/cm<sup>2</sup> with DC). For the MAX-DOAS comparisons:  $-0.95$  to  $-0.47 \times 10^{15}$  molec/cm<sup>2</sup>



## IMPACT OF SATELLITE PIXEL SELECTION

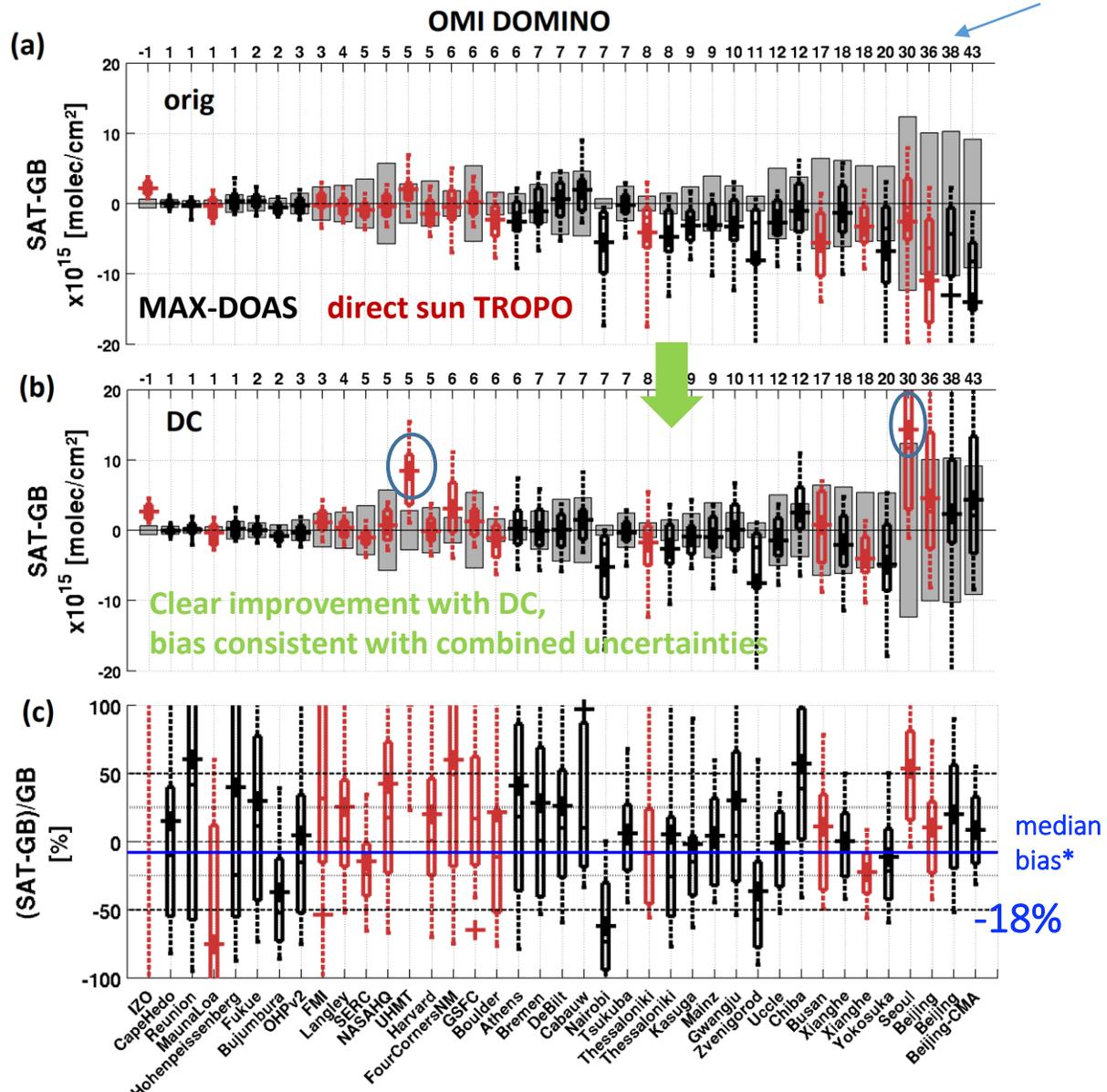
Alternative approach of selection restricted to OMI pixels covering the stations:



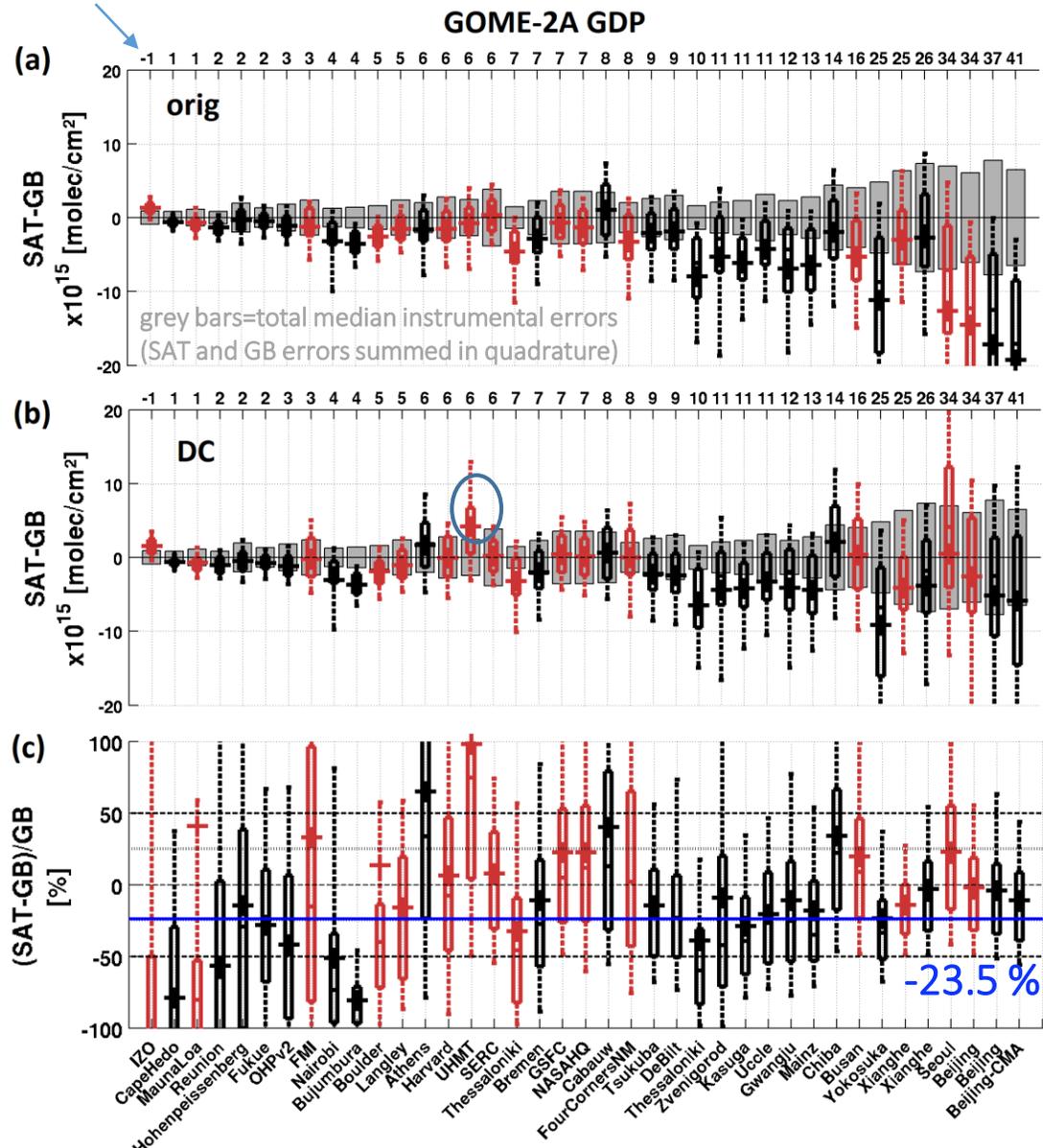
- restricting the comparison to small pixel sizes (from 100 to 40 km) slightly improves median bias, but reduces the comparison spread
- pixels in strict overpass with the stations: bias is reduced, but for the MAX-DOAS ensemble, not as much as when a horizontal dilution correction is applied.

OVERALL RESULTS:

Merge MAX-DOAS and direct-sun results

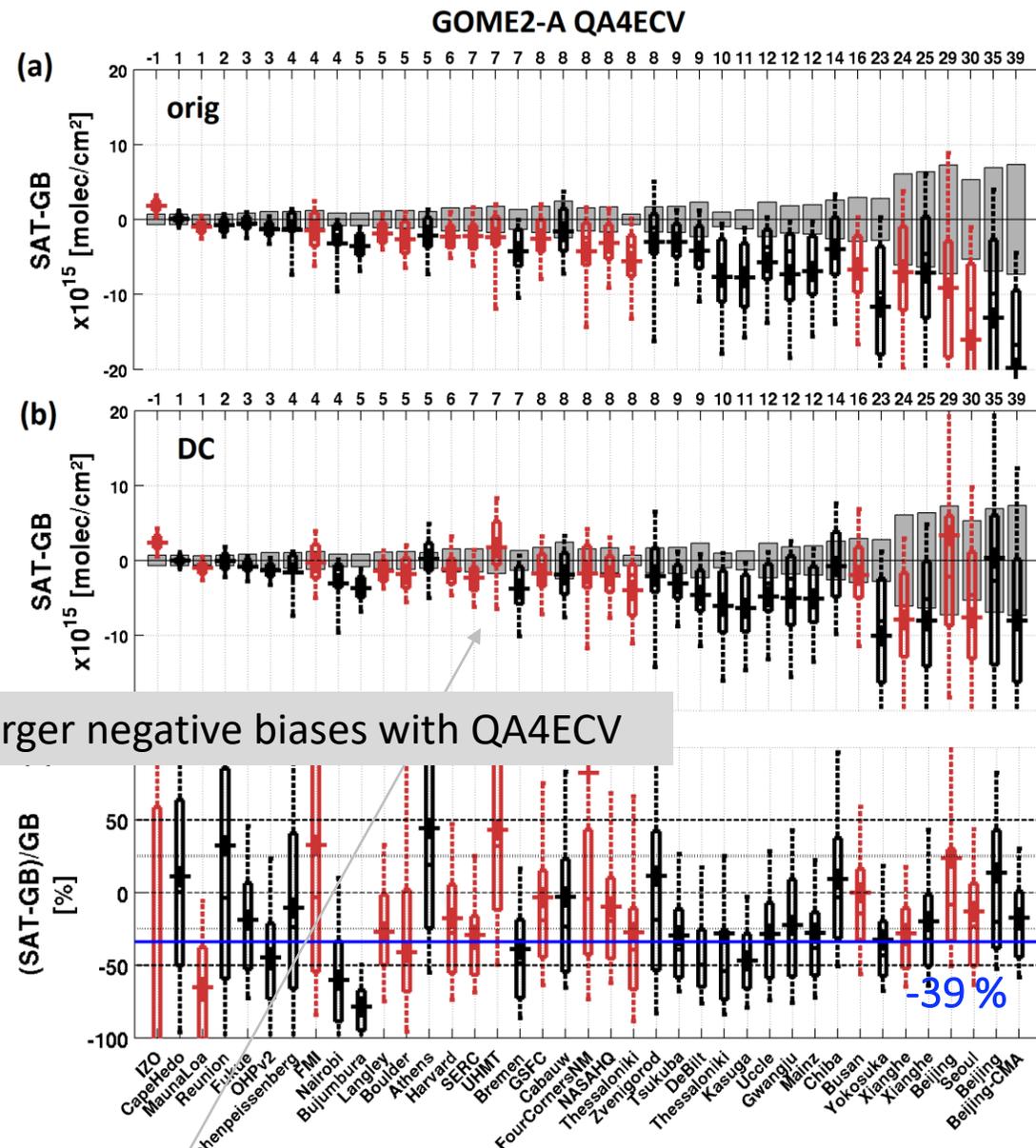
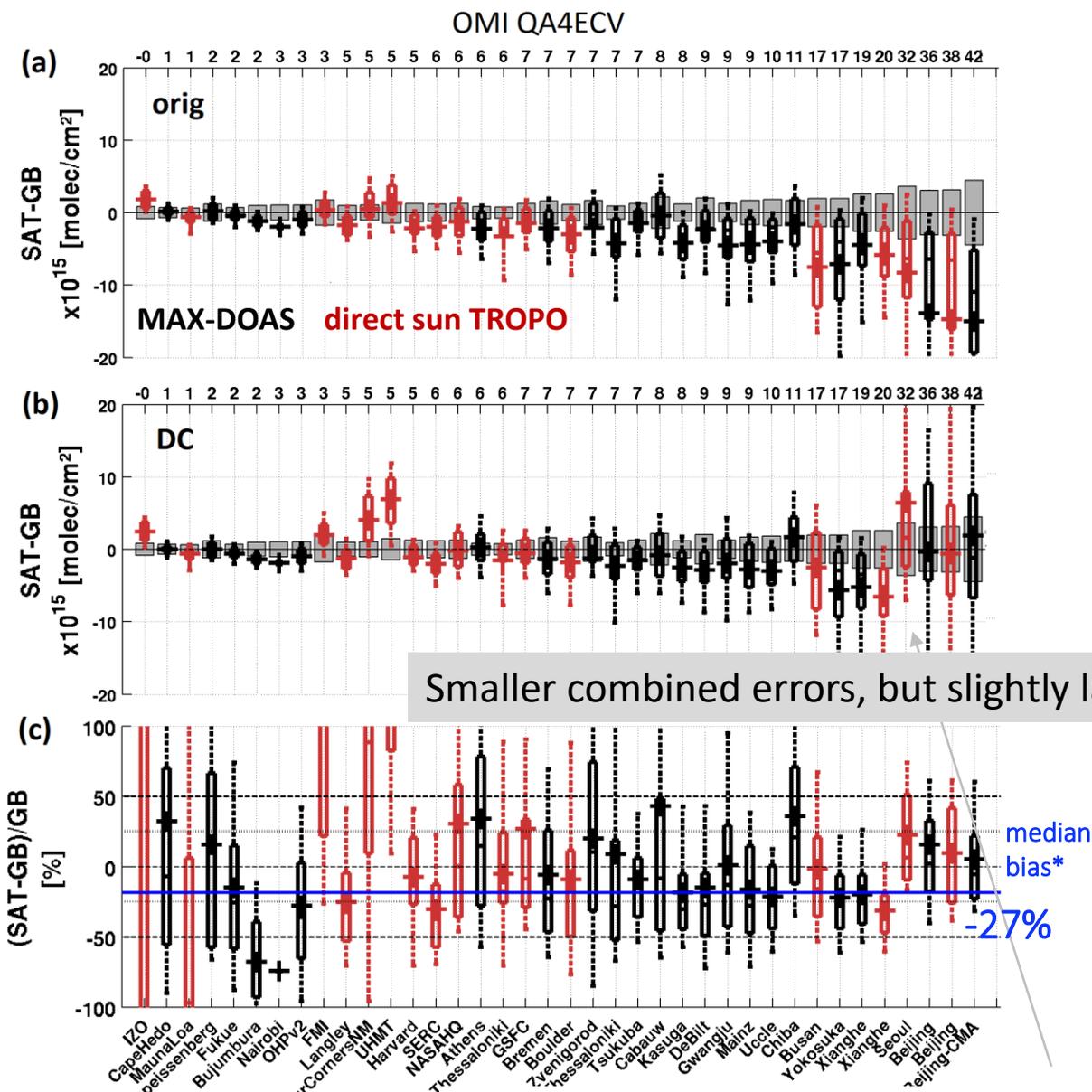


Numbers are the VCDtropo(GB)



OVERALL RESULTS:

Merge MAX-DOAS and direct-sun results and compare to QA4ECV NO<sub>2</sub> products



Smaller combined errors, but slightly larger negative biases with QA4ECV

## OVERALL RESULTS: Merge MAX-DOAS and direct-sun results

- The **dilution correction** improves the validation results for both sensors, by **about 10 to 13% in total** over the station ensemble
- Only **pixels over the stations** is to reduce the bias by **2 to 6% for OMI**, but negligible effect on GOME-2A, probably due to the large size of the GOME-2A pixels (40x80 km<sup>2</sup>)

	Original baseline	Original over stations	DC baseline	DC over stations	
OMI DOMINO	-2 x10 <sup>15</sup> [ -30 %]	-1.7 x10 <sup>15</sup> [ -24 %]	-1.2 x10 <sup>15</sup> [ -18 %]	-0.8 x10 <sup>15</sup> [ -10.6 %]	<b>-11% to -22%</b>
OMI QA4ECV	-2.5 x10 <sup>15</sup> [ -38 %]	-2.2x10 <sup>15</sup> [-34.4%]	-1.8 x10 <sup>15</sup> [-27 %]	-1.4 x10 <sup>15</sup> [-21.5%]	
GOME-2A GDP	-2.9 x10 <sup>15</sup> [ -36 %]	-2.8 x10 <sup>15</sup> [ -34.2 %]	-2 x10 <sup>15</sup> [ -23.5 %]	-1.9 x10 <sup>15</sup> [ -21.6 %]	<b>-22% to -36%</b>
GOME-2A QA4ECV	-3.7 x10 <sup>15</sup> [ -48 %]	-3.7 x10 <sup>15</sup> [-45.6%]	-2.9 x10 <sup>15</sup> [-39 %]	-2.9 x10 <sup>15</sup> [-36.5%]	

## CONCLUSIONS:

Pinardi et al., 2020, AMTD: Tropospheric NO<sub>2</sub> from 39 stations (MAX-DOAS + direct sun) used to validate OMI and GOME-2A data from several products:

- Despite the lack of network harmonization settings, there is a clear capacity of the instruments to perform as a network (sampling of different NO<sub>2</sub> levels and scenarios)
  - Harmonization ongoing within NDACC/FRM4DOAS/PGN
- Challenging situations in urban environment : smoothing difference errors due to the horizontal dilution of the measured NO<sub>2</sub> field → proposal of quantitative characterization and dilution correction
  - Simplified method but reduction of the horizontal comparison smoothing error
- Dilution correction generally reduces the comparison bias (10 to 13% impact in total) and spread (with a few exceptions)
- Pixels over the station: better agreement for OMI (2 to 6%), negligible for GOME-2
- Final validation results: remaining significant bias for the 4 products.
  - OMI DOMINO v1.2 (-11%), OMI QA4ECV (-22%), GOME-2 GDP 4.8 (-22%), GOME-2 QA4ECV (-36%)

Extention of the comparison study (without the dilution correction) to TROPOMI tropospheric NO<sub>2</sub> validation with MAX-DOAS data from the NIDFORVAL project and Pandora data from PGN (<https://www.pandonia-global-network.org/>):

Extension of the study of Verhoelst et al., submitted to AMTD.

Ongoing study...

Rk: only a few stations are the same than Pinardi et al AMTD analysis, and comparison time periods are different !!

More on TROPOMI NO<sub>2</sub> validation results:

- <http://mpc-vdaf-server.tropomi.eu/no2/>
- <https://nikal.eventsair.com/QuickEventWebsitePortal/sentinel-5-precursor-workshop-2019/sentinel-5p/ExtraContent/ContentPage?page=5>

### EXTENSION OF THE STUDY TO TROPOMI:

