A decorative network diagram in the top right corner, consisting of several yellow nodes connected by thin grey lines, forming a complex, interconnected web.

PPDF-based method to account for atmospheric light scattering in spectroscopic observation of GHG from space

**Sergey Oshchepkov, Ryoichi Imasu, Chisa Iwasaki
Andrey Bril, Yukio Yoshida**



History of the method



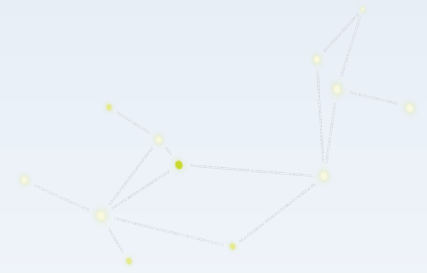
- 1. The developments of this method was initiated by Inoue-san and Yokota-san in 2005**
- 2. The main goal was to develop rapid and precise GOSAT data processing**
- 3. To develop this alternative method we had a small team within GOSAT Project at NIES including DHF staff**
- 4. Currently, the PPDF-based product is available at the NIES GOSAT website**



Content of the talk

- 1. Theoretical background of the PPDF-based algorithm.**
- 2. Validation of CO₂ retrievals using ground-based TCCON measurements and comparison with other algorithms**

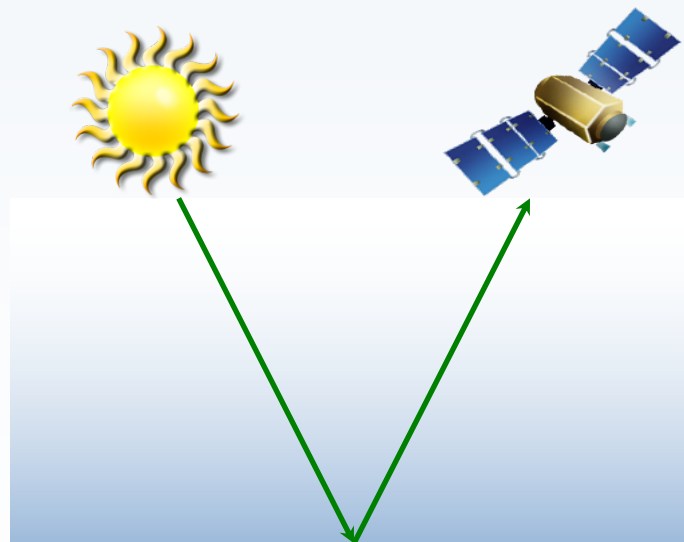




PPDF-based methodology



What is the essence of PPDF-based method?

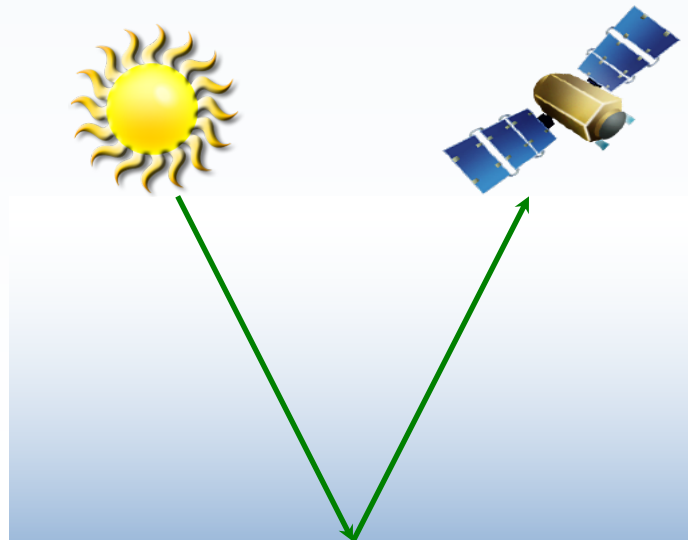


Both PPDF and FPh solutions are completely equivalent by accuracy



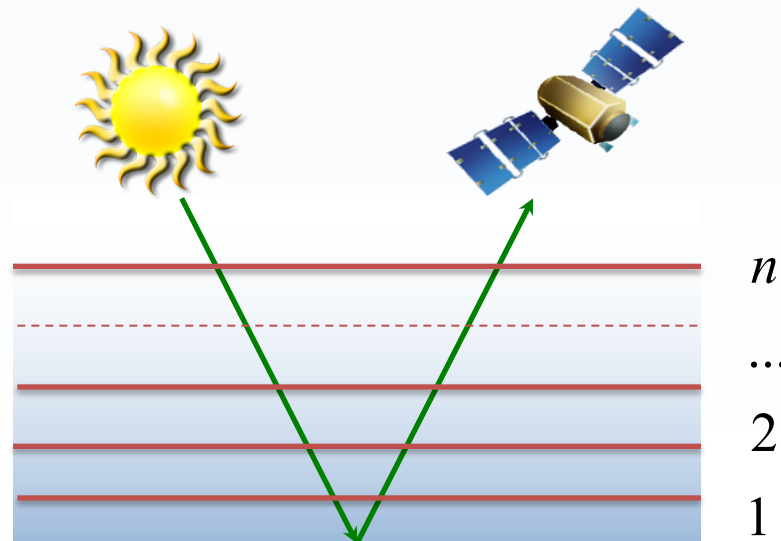
The simplest case refers to non-scattering atmosphere

$$R = \frac{\mu}{\pi} S^0 \cdot \Gamma \cdot \exp \{ - (\textcolor{green}{L} \sigma C_{gas})^* \}$$



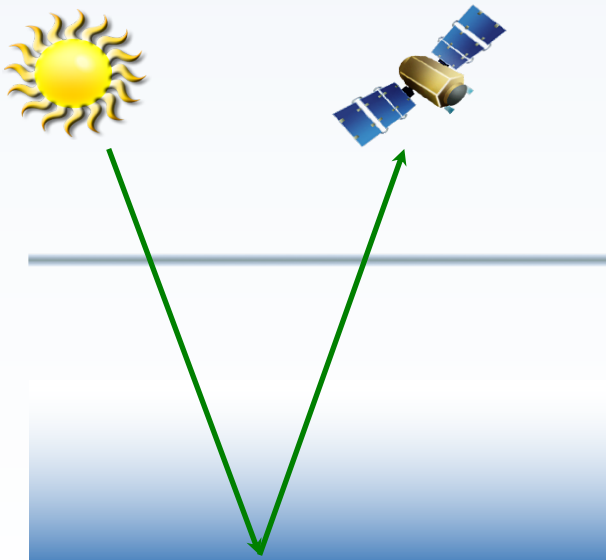
The general case of multi-layered scattering atmosphere

$$T_{1,2,\dots,n} = \iint_{L_1 L_2 \dots} \dots \int_n \exp(-k_1 L_1 - k_2 L_2 - \dots - k_n L_n) P^{(12\dots n)}(L_1, L_2, \dots, L_n) dL_1, dL_2, \dots, dL_n$$

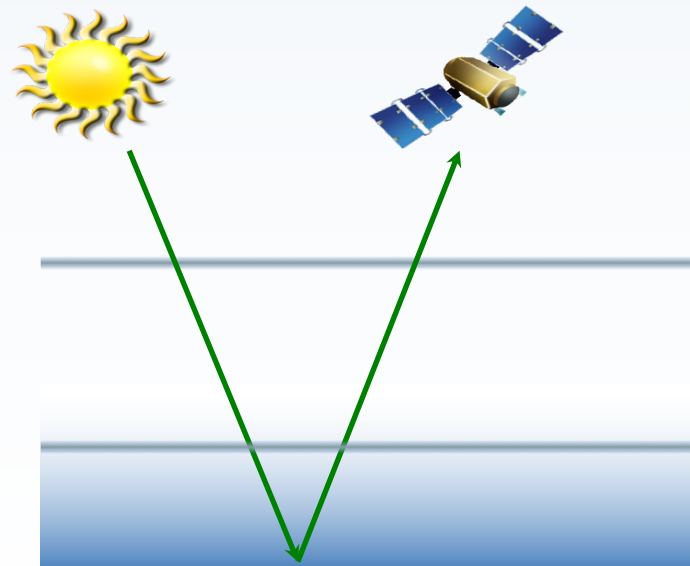


Two versions of PPDF model

Two layer model



Three layer model



These layers refer to effects of light path modification only, we consider arbitrary number of gas layers



This is

An example of PPDF parameterization using two layered atmosphere

$$P(L_1, L_2) = \begin{cases} P_1(L) = \alpha \cdot \delta(L) + (1 - \alpha) P_1^*(L), & h \leq h_e \\ P_2(L) = \delta(L - L_2), & h_c < h \leq h_a, \end{cases}$$

$$R \sim \iint_{L_1, L_2} \exp(-k_1 L_1 - k_2 L_2) P(L_1, L_2) dL_1 dL_2$$

$$\tilde{T} = \alpha T_2 + (1 - \alpha) T_1 T_2,$$

$$T_1 = \exp \left[- \left(\frac{1}{\mu} + \frac{1}{\mu_0} \right) \cdot (1 + \delta) \cdot \tau_1 \right] \quad T_2 = \exp \left[- \left(\frac{1}{\mu} + \frac{1}{\mu_0} \right) \tau_2 \right]$$

$$\tau_1 = \int_0^{h_c} k(h) dh, \tau_2 = \int_{h_c}^{h_a} k(h) dh, \delta = \rho \cdot \exp \{ -\gamma \cdot (\tau_1 + \tau_2) \}, \mu = \cos \Theta$$

this parameterization was derived using Monte-Carlo simulation of Solar radiative transfer in the atmosphere.

A simple illustrative example what is PPDF

In absence of aerosol and clouds PPDF is delta function because only pathlength L exists.
Light scattering by aerosol and cloud could both **decrease** and **increase** the light path depending on the surface albedo.

Both of these effects lead to broadening of the PPDF

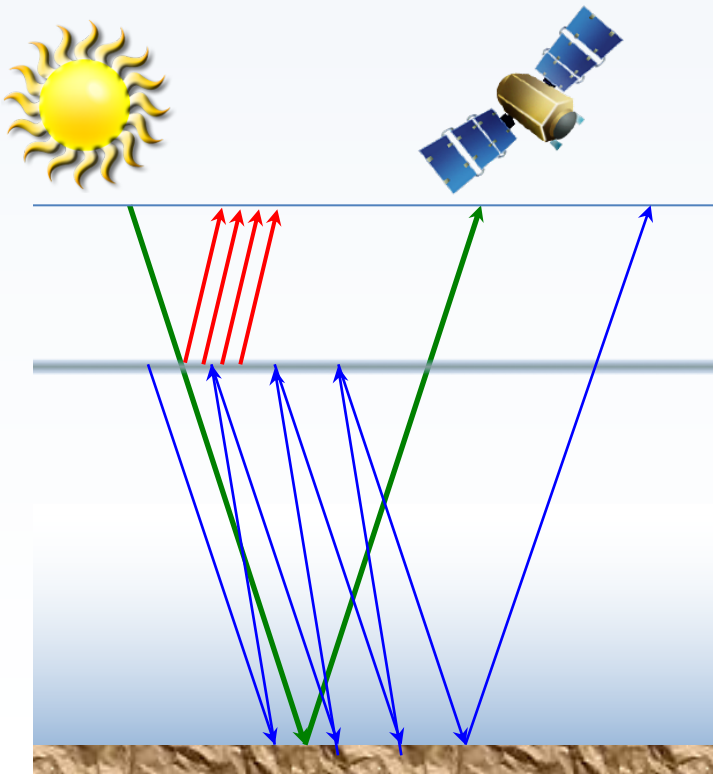
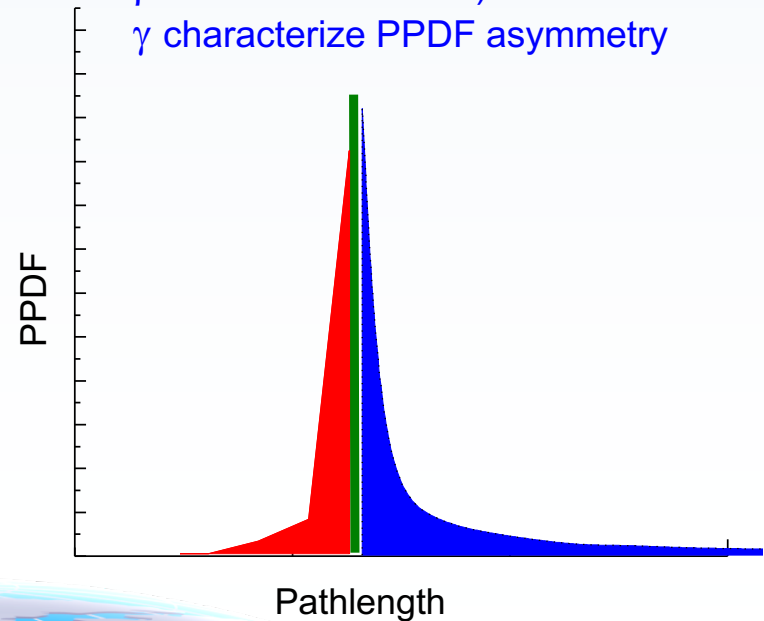
Four PPDF parameters:

h is the effective layer altitude

α is the relative aerosol or cloud reflection

ρ is PPDF half-width)

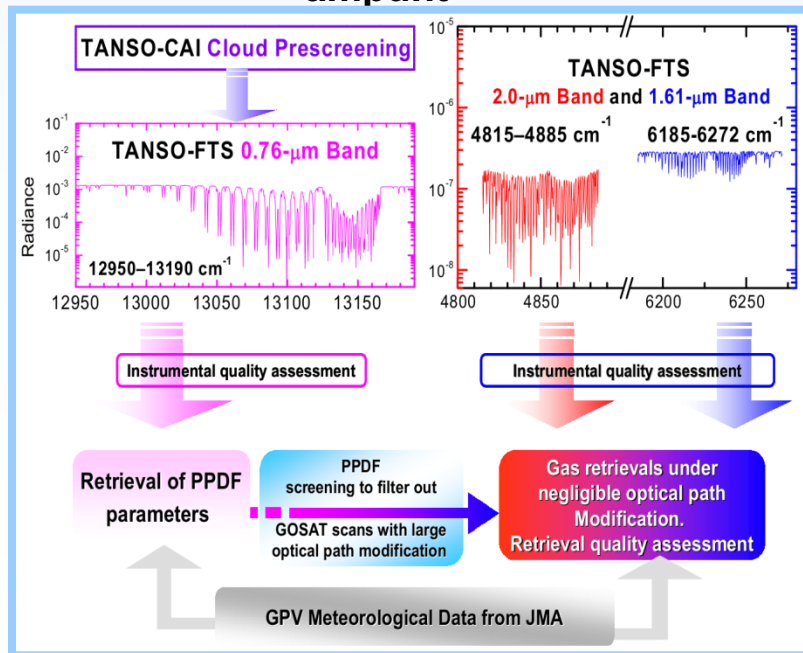
γ characterize PPDF asymmetry



Retrievals

PPDF-D

Then simple DOAS technique retrieves gas amount



PPDF-S

Radiance spectra derived from FTS SWIR of GOSAT

Band 1:
12980–13080 cm^{-1}

Band 3:
4815–4885 cm^{-1}

Band 2:
6185–6272 cm^{-1}

Estimation of surface albedo

Estimation of surface albedo

Estimation of surface albedo

Spectroscopic look-up-table for O_2 , CO_2 , H_2O , and CH_4

Estimation of PPDF parameters for Rayleigh light scattering using observation geometry, surface pressure, and surface albedo

GPV meteorological data from JMA

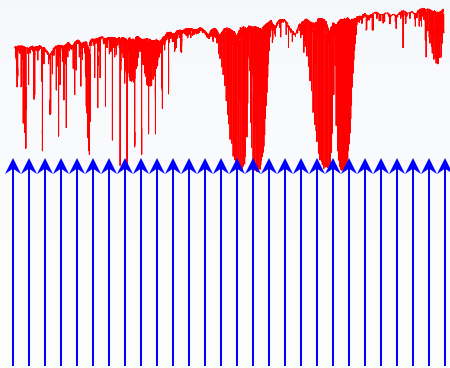
Satellite-sun geometry

Simultaneous retrieval of gas and light path modification from all GOSAT SWIR bands
Band-to-band PPDF variability is allowed. The retrievals use three-layer PPDF model [14]

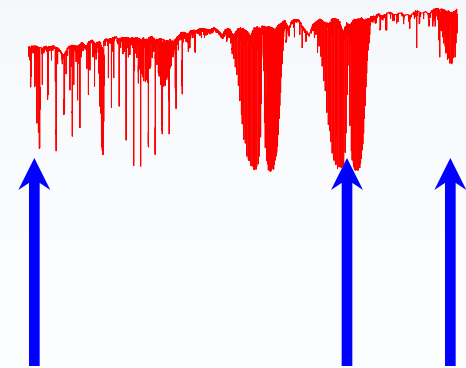
Advantages to be emphasized

Rapid data processing

due to limited aerosol and cloud spectral calculation.



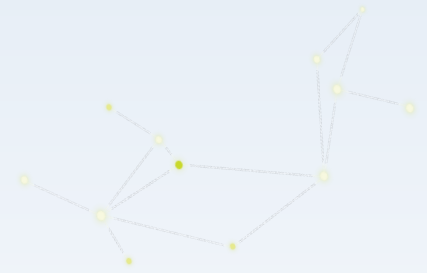
If ... with FP we do not need
spectral calculations at
each individual line ↓
PPDF formalism deals with
only one PPDF for each of
the three bands ↓



PPDF Parameterization

is optimal because it describes the net effect of ALS

Connection between PPDF and FPh is available



Validation of XCO₂ retrievals using ground- based TCCON measurements

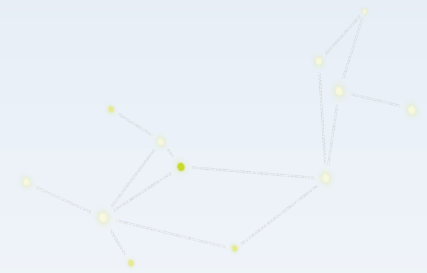


Global location of the total Carbon Column Observing Network (TCCON)

GOSAT single scans were selected over 12 TCCON stations



GOSAT-TCCON coincidence criteria



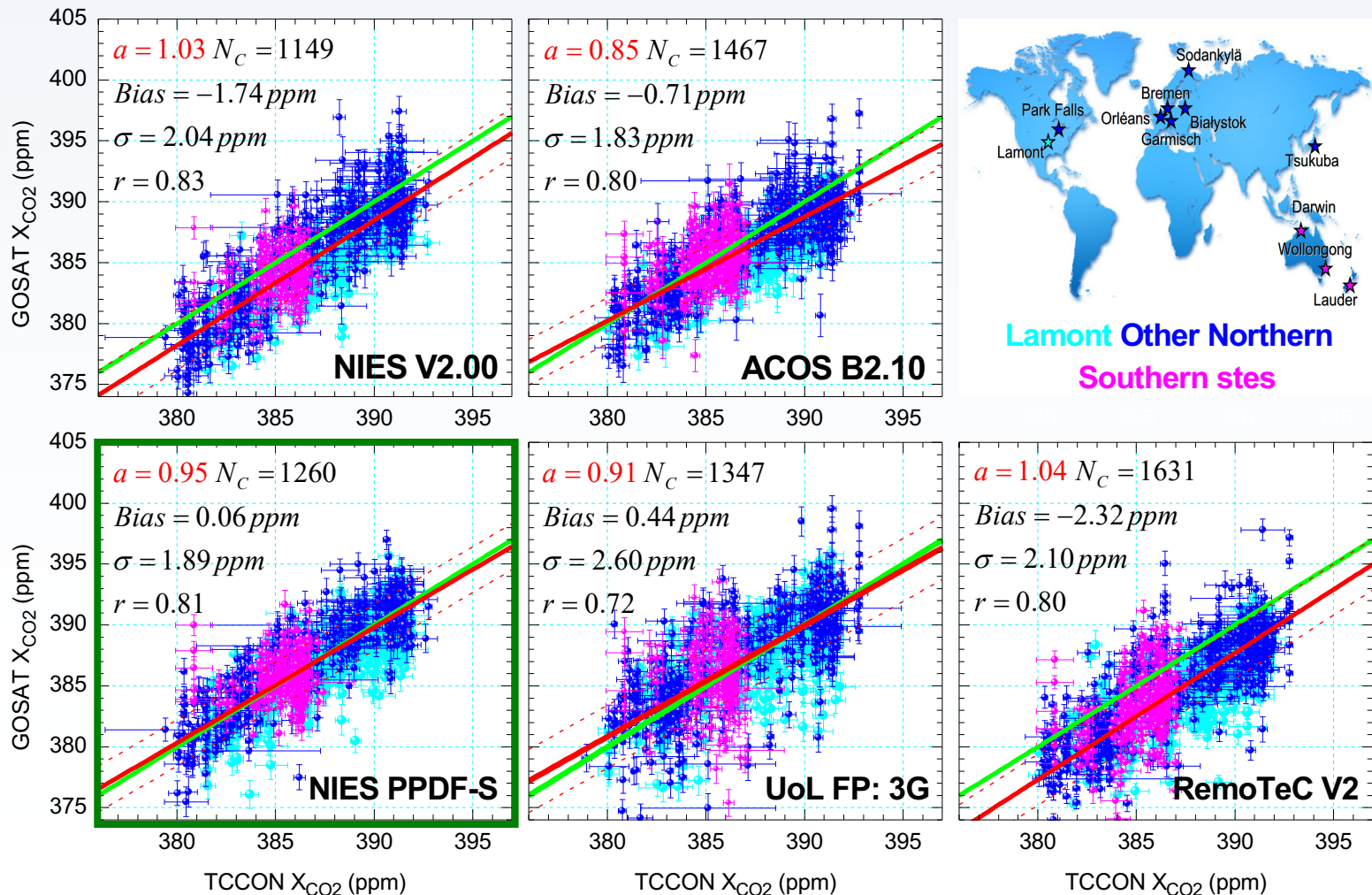
- **Temporal averaging:** both GOSAT and TCCON soundings were weakly mean.
- **Spatial averaging:** data fall within 5° radius circle centered at each TCCON station.
- **TCCON data:** within ± 1 h of the GOSAT overpass time.
- **GOSAT data:** around 2 years of GOSAT operation from June 2009.



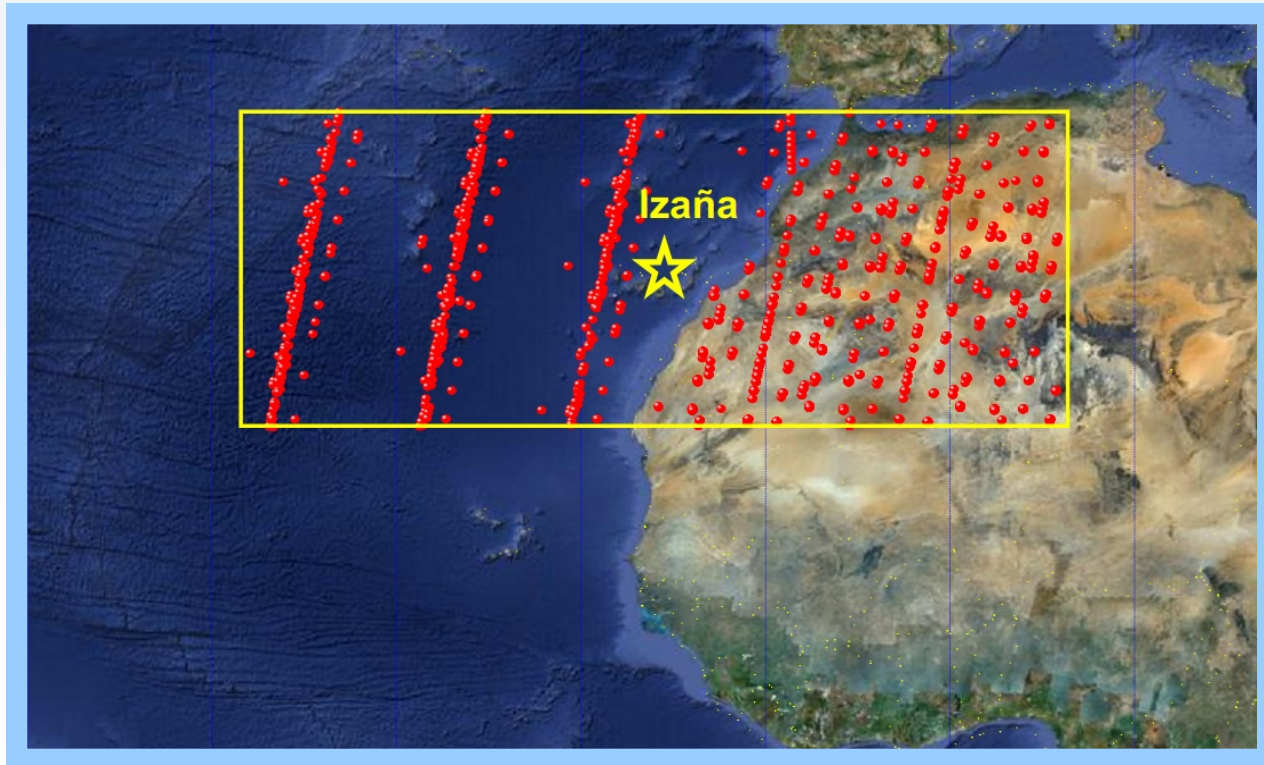
GOSAT-TCCON XCO₂ correlation diagrams for all five algorithms

Generally, GOSAT XCO₂ PPDF-S retrievals ↓ look well

At least, it provided the lowest bias and standard deviation ↓ as compared with TCCON data



Seasonal trends of GOSAT retrievals around Izaña site

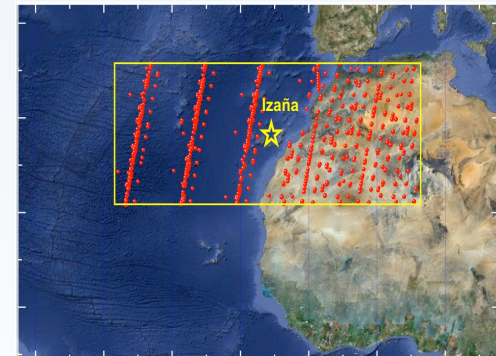
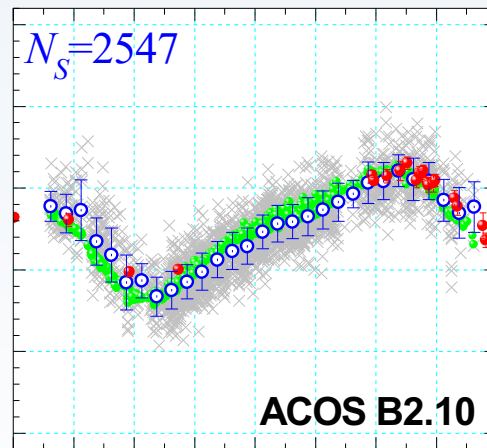
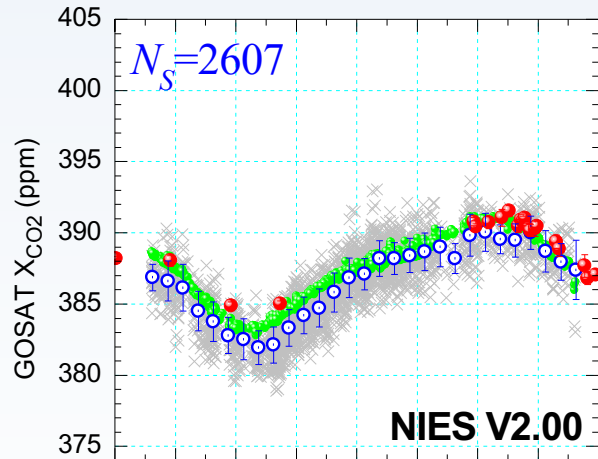


This site has an unique location for providing validation of satellite-based measurements. Here we could expect strong dust aerosol both over dark (ocean) and bright (Western part of Sahara desert) surfaces.

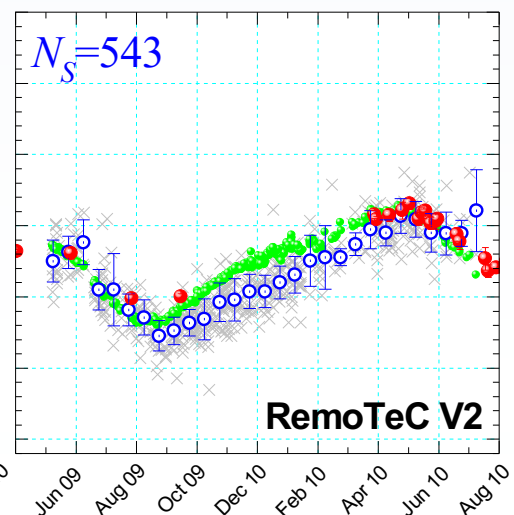
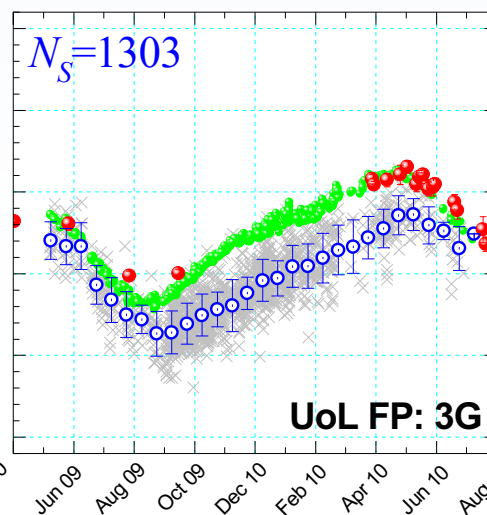
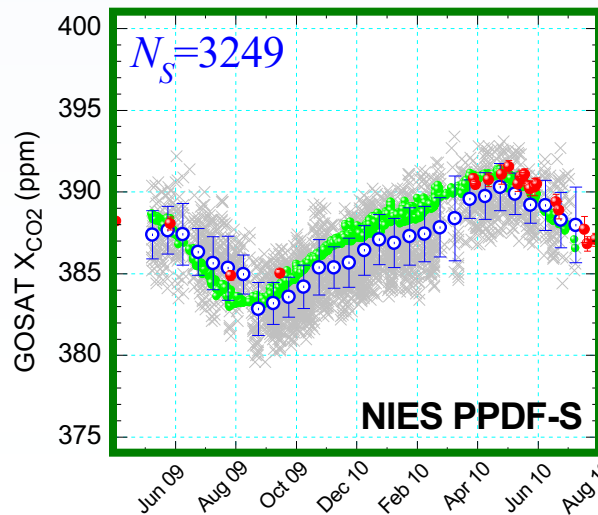
Seasonal trend of XCO₂ for five algorithms over Sahara desert ↓

The retrievals - blue colors, red - FTS measurements, green ATM

Generally, all algorithms reproduce the seasonal cycle well, PPDF-S provides the largest observation number available for the processing ↓

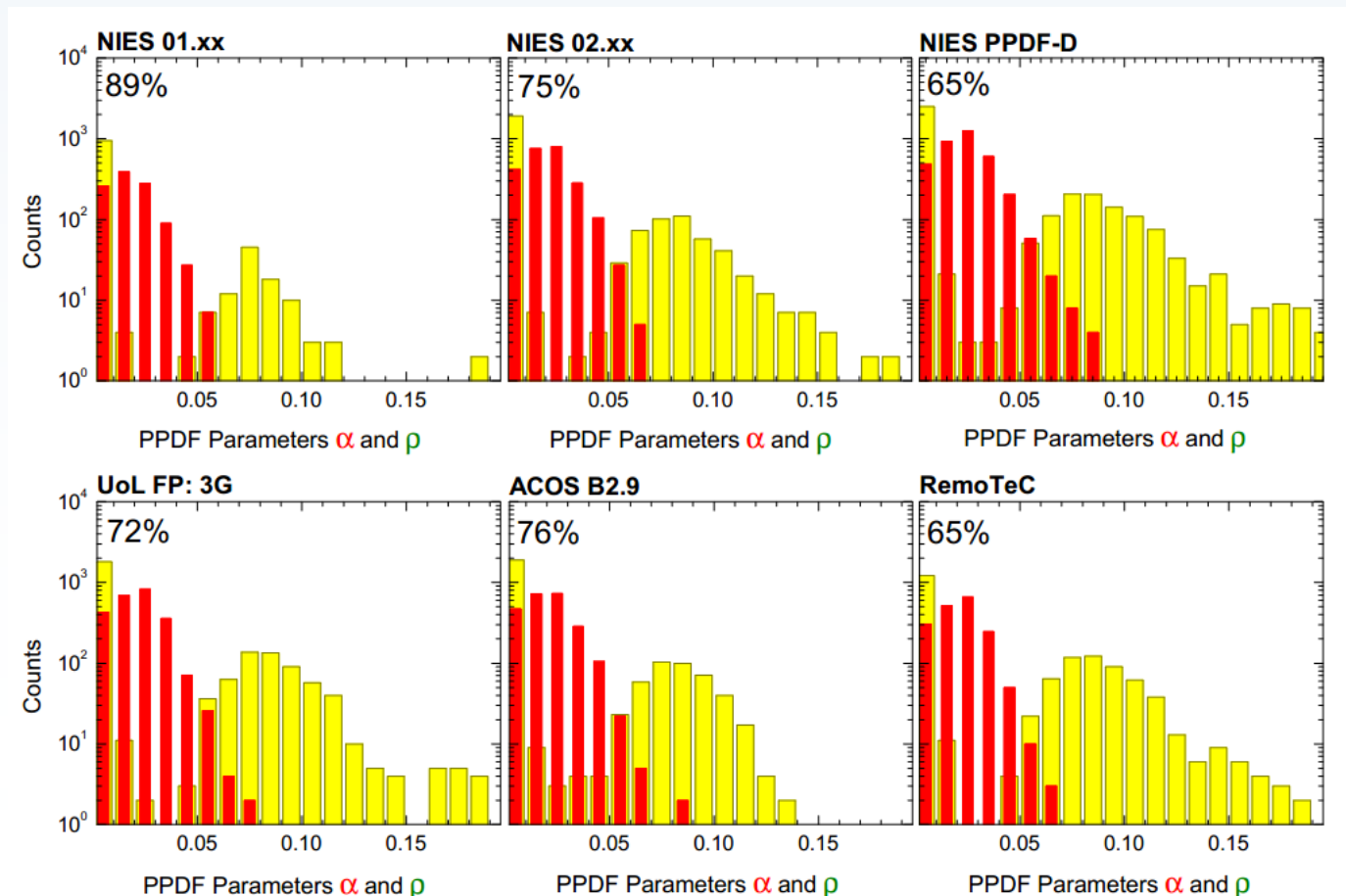


Observations
over Sahara desert



GOSAT single scan counters distributed by PPDF parameters from different algorithms

Percentage numbers at the corner of each panel characterize the part of GOSAT observation under very small level of ALS (PPDFs<0.04)



Basic PPDF publications

1. Bril A., S. Oshchepkov, T. Yokota, and G. Inoue (2007), Parameterization of aerosol and cirrus cloud effects ... ***Applied Optics***, 2007, 46, 13, P.2460-2470.
2. Oshchepkov, S., A. Bril, and T. Yokota (2008), PPDF- D method ..., ***JGR***, 113, D23210, doi:10.1029/2008JD010061.
3. Bril, A., S. Oshchepkov, T. Yokota (2008), model study of desert dust aerosol, ***JQRST***, 109, 1815-1827.
4. Bril A., S. Oshchepkov, and T. Yokota (2009), Retrieval of atmospheric methane ..., ***Applied Optics***, Vol. 48, No. 11. P. 2139-2148.
5. Oshchepkov S., A. Bril, and T. Yokota (2009), An improved ... model ... ***JGR***. 114, D19207, doi:10.1029/2009JD012116.
6. Oshchepkov S., A. Bril, S. Maksyutov, and Tm Yokota (2011) Detection of optical path in spectroscopic space-based observations of greenhouse gases: Application to GOSAT data processing, ***JGR***, 116, D14304, doi:10.1029/2010JD015352.
7. Bril A., S. Oshchepkov, and T. Yokota (2012), Application of a probability density function-based atmospheric light-scattering correction to carbon dioxide retrievals from GOSAT over-sea observations, ***Remote Sensing of Environment***, 117C, 301–306.
8. Oshchepkov, S., A. Bril, T. Yokota, et al. (2012), ... validation ... PPDF-D ... retrievals ..., ***JGR***, 117, D12305, doi:10.1029/2012JD017505.
9. Oshchepkov, S., A. Bril, T. Yokota, et al. (2013), ... Part 2: Algorithm intercomparison ..., ***JGR***, 118, doi:10.1002/jgrd.50146.
10. Oshchepkov, S., A. Bril, T. Yokota, et al. (2013), Simultaneous retrieval of atmospheric CO₂ and light path modification ..., ***Applied Optics***, Vol. 52, P. 1339-1350

One more PPDF presentation at poster session



Poster Session 1 (Day 2 (June 4, 2019) 12:30 - 13:45)

Topic 2. Retrieval Algorithms and Uncertainty Quantification

...

17. Improvement and Application of PPDF-S
Method for Retrieving XCO₂ over Aerosol
Dense Areas (**C. Iwasaki**, Univ. Tokyo,
Japan)

