

Towards high Precision XCO₂ Retrievals from TanSat Observations

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The TanSat Mission



- National High Technology Research & Development Programs by **Ministry of Science and Technology of China (MOST)** (2011-2017)
- Strategic Priority Research Program from **Chinese Academy of Sciences**
 - Climate Change: Carbon Budget and Relevant Issue
 - Space Science: Scientific Research Satellite
- NSMC (CMA) -- (2016- NOW) , Ground segment—
Satellite data receive and process

*TanSat mission kicked-off at 2011, launched
at 2016*

*TanSat mission will join the ESA 3rd Party
mission*

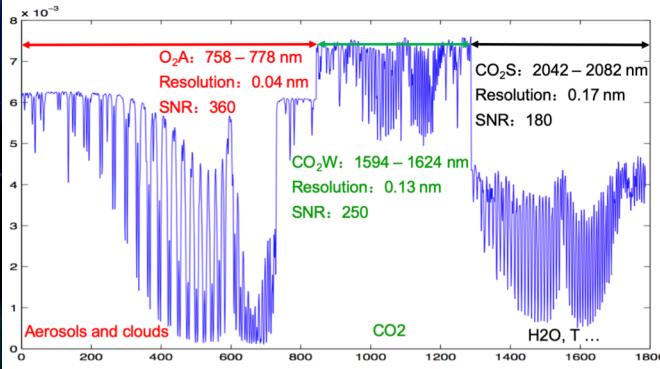
Term-1
Measurement Goals
XCO₂
1~4 ppmv
Monthly
500 x 500 km²

Term-2
Measurement Goals
CO₂ Flux
Relative flux error 20%
Monthly
500 x 500 km²

TanSat & Instrument

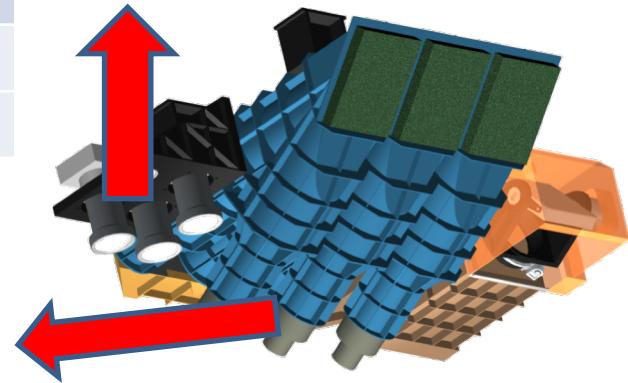


Name	Characters
Orbit type	sun-synchronous
Altitude	700 km
Inclination	98 °
Local time	13:30
Weight	500Kg



Cloud and Aerosol Polarization Imager - CAPI

- A wide field multi-band imager with polarization channels
- UV: 0.38μm; VIS: 0.67μm; NIR: 0.87, 1.375 and 1.64μm
- Polarization: 0.67 & 1.64 μm



Atmospheric Carbon Dioxide Grating Spectrometer - ACGS

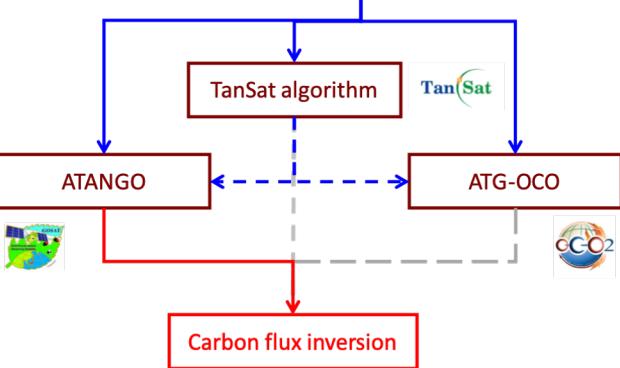
- Hyperspectral grating spectrometer with 3 bands



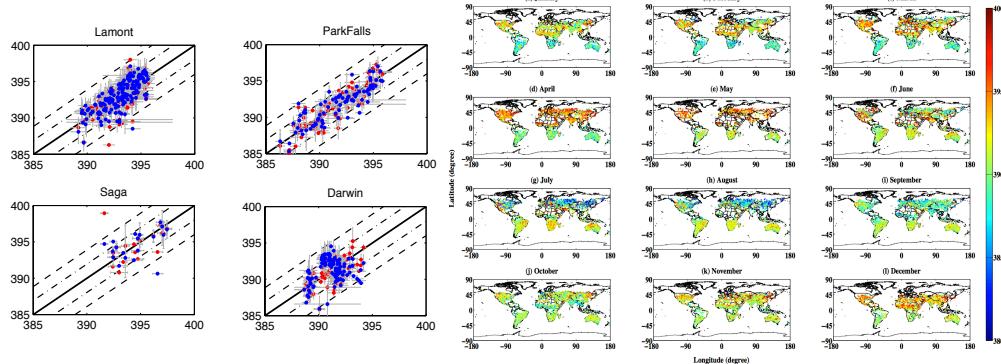
L2 Retrieval Algorithms

IAPCAS

IAP Carbon dioxide retrieval Algorithm for Satellite observation



Carbon flux inversion



(Yang et al., 2018, Liu et al., 2018)

UoL-FP

Incoming Spectra

Standard Retrieval Process

Pre-tabulated Data

Simulated Spectral Radiance

Instrument Model

Solar Model

Radiative Transfer Model

Retrieval State \mathbf{x}

Convergence Test

More Iteration

Final Atmospheric/Surface State

Compute for individual sounding

$\mathbf{X}_{\text{CO}_2} > \mathbf{h}^{\top} \mathbf{X}_{\text{CO}_2}$

Error covariance matrix

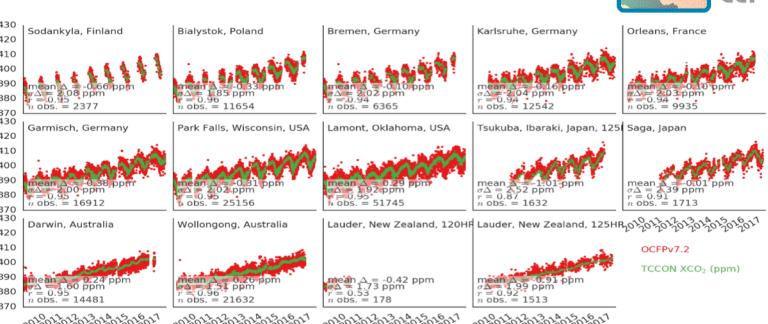
Averaging kernel matrix

Proper Mapping & Averaging

Global \mathbf{X}_{CO_2} Measurements

Climate Change Service

ghg
cci

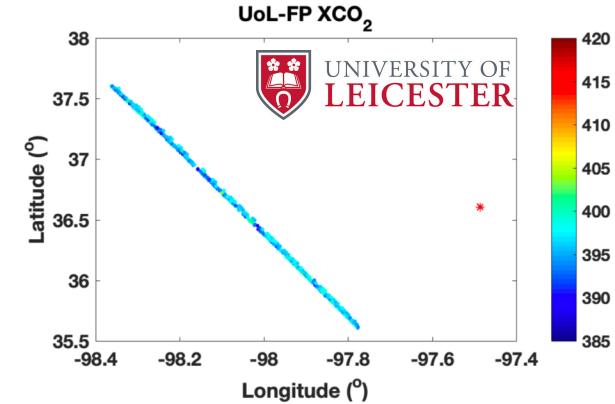
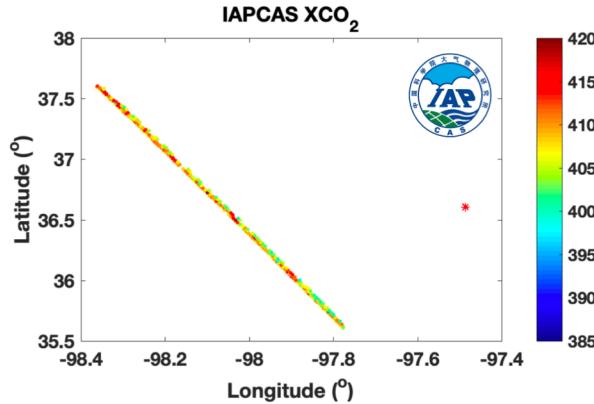
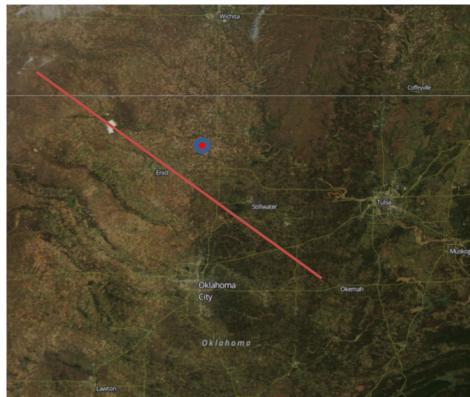


(Parker et al., 2011; Cogan et al., 2012; Boesch et al., 2013; Somkuti et al., 2018)

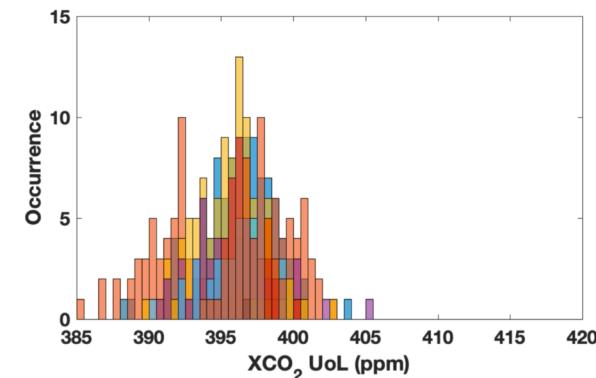
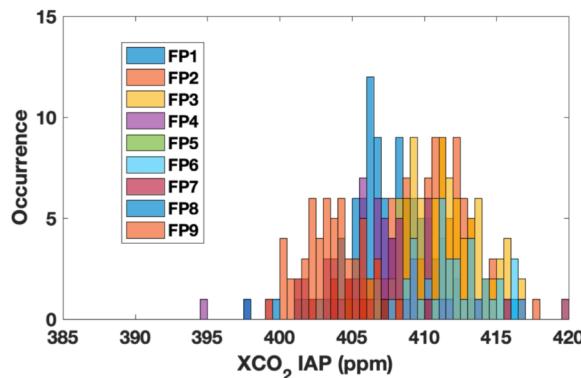
Here, a 2-band retrieval (NIR + 1.6 μm CO₂ band) is used for IAPCAS and UoL-FP

Preliminary Result: Comparison of Retrieval Results from Original L1B Data

Retrieval comparison between
UoL-FP .VS. IAPCAS



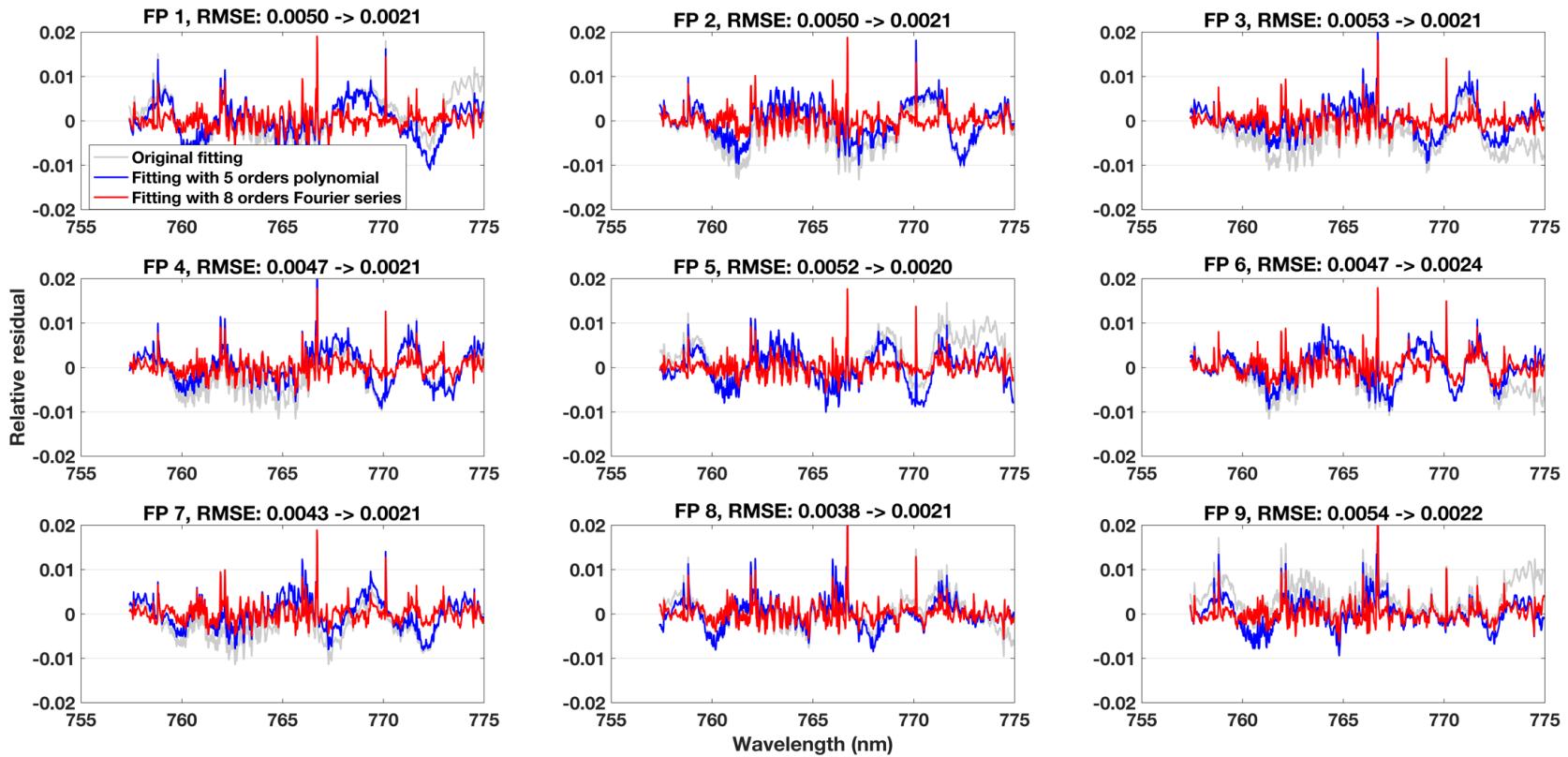
Case study, TanSat 8 Oct. 2017,
around Lamont with almost cloud
free condition



- Large spread of XCO₂ retrieval results
- Poor consistency between different TanSat footprints (FP1-FP8)
- Large differences between UoL-FP and IAPCAS retrievals

Analysis of TanSat Solar Measurements

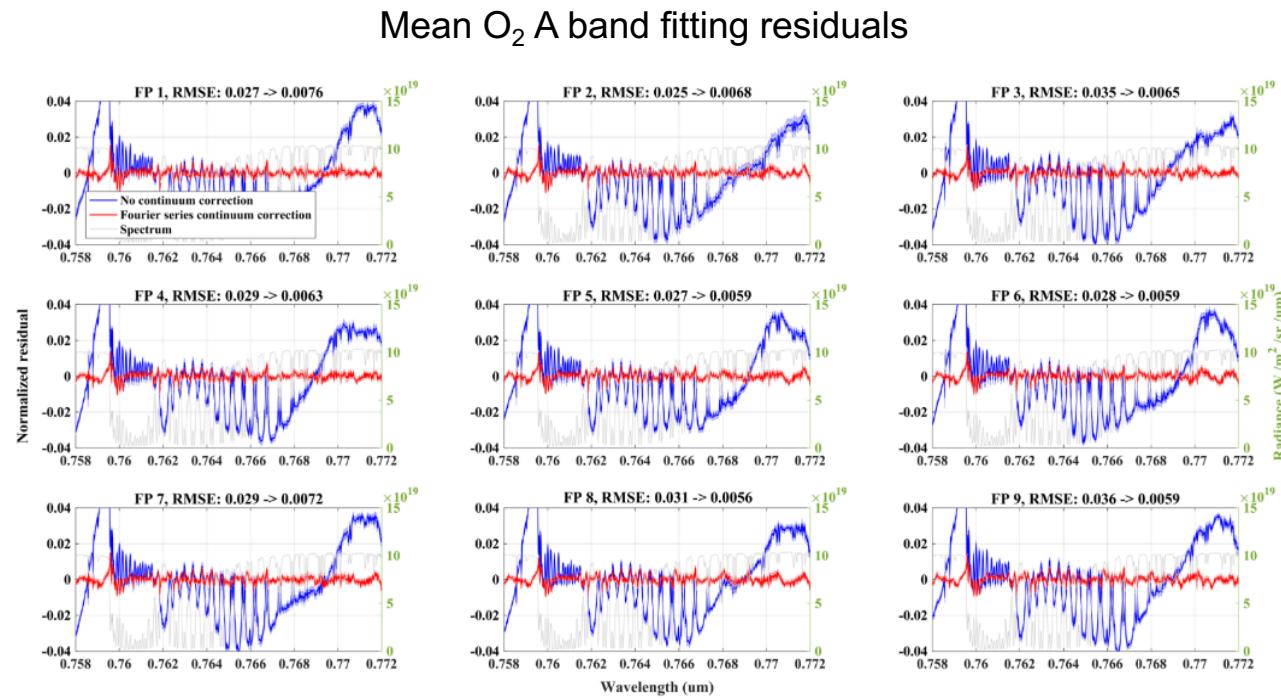
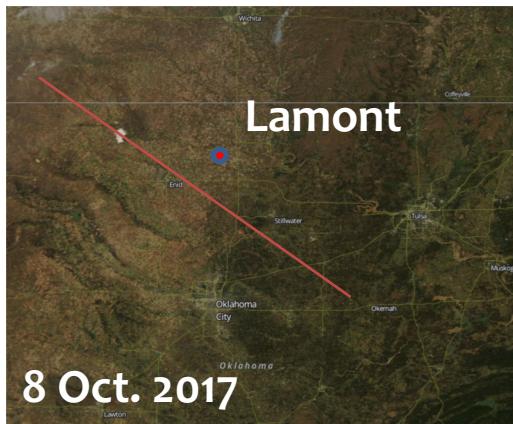
- A persistent frequency pattern is observed in O₂ A band when compared to UoL-FP solar model
- A Fourier series correction has been developed for radiometric correction
 - Method minimizes residual pattern when solar measurements are analyzed



Impact of L1B Correction Method on XCO₂ Retrievals

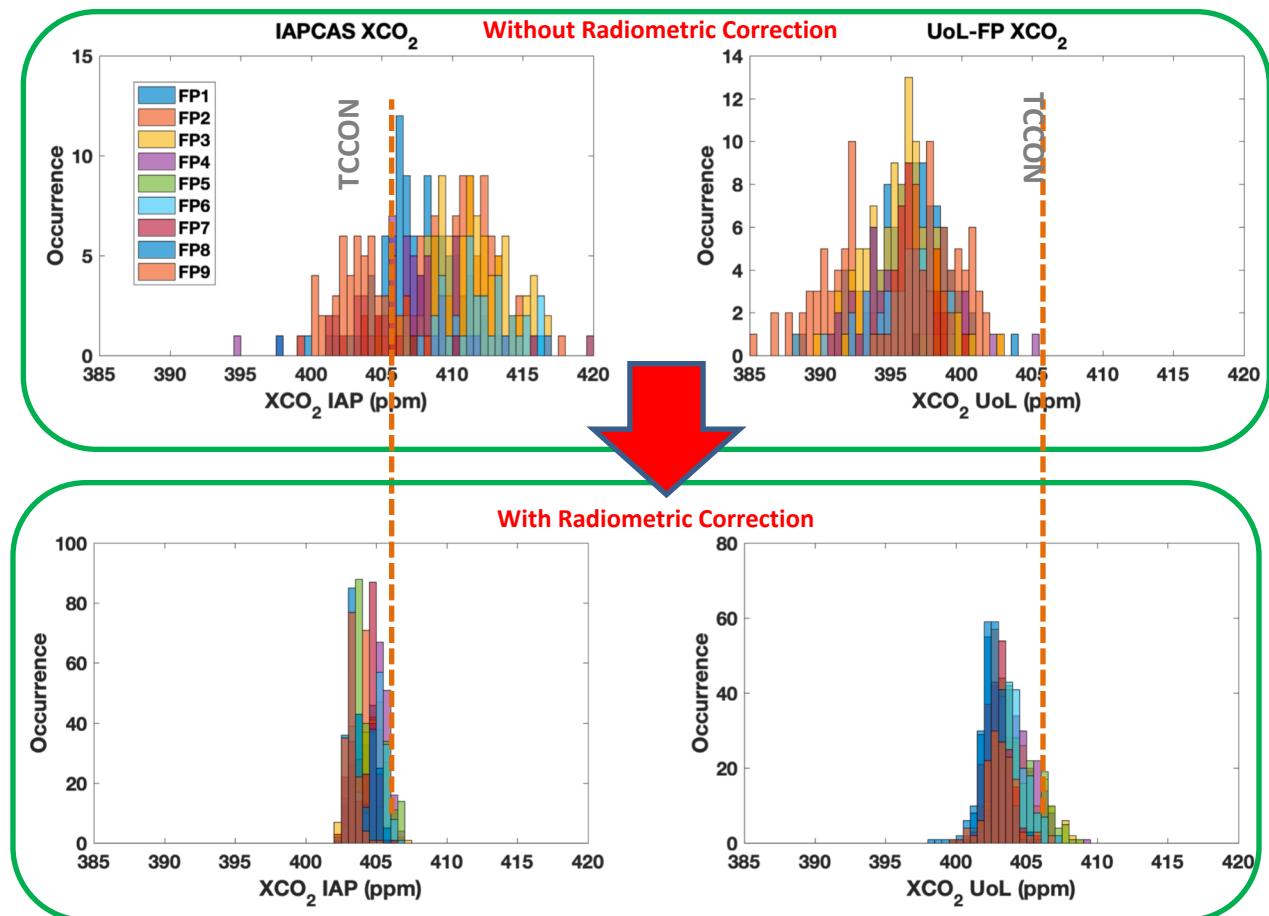
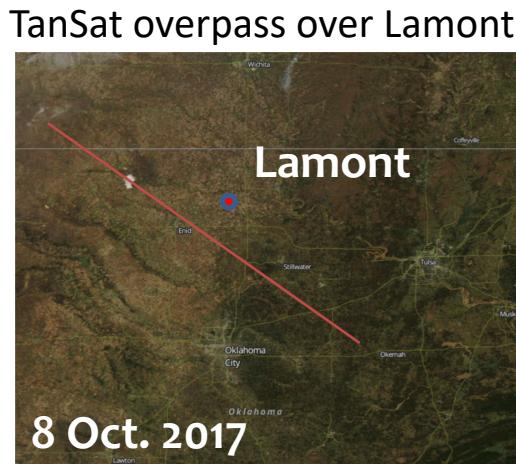
- New method for radiometric correction of TanSat L1b measurement leads to much improved the fitting residual and consistency of the XCO₂ retrieval

TanSat overpass over Lamont



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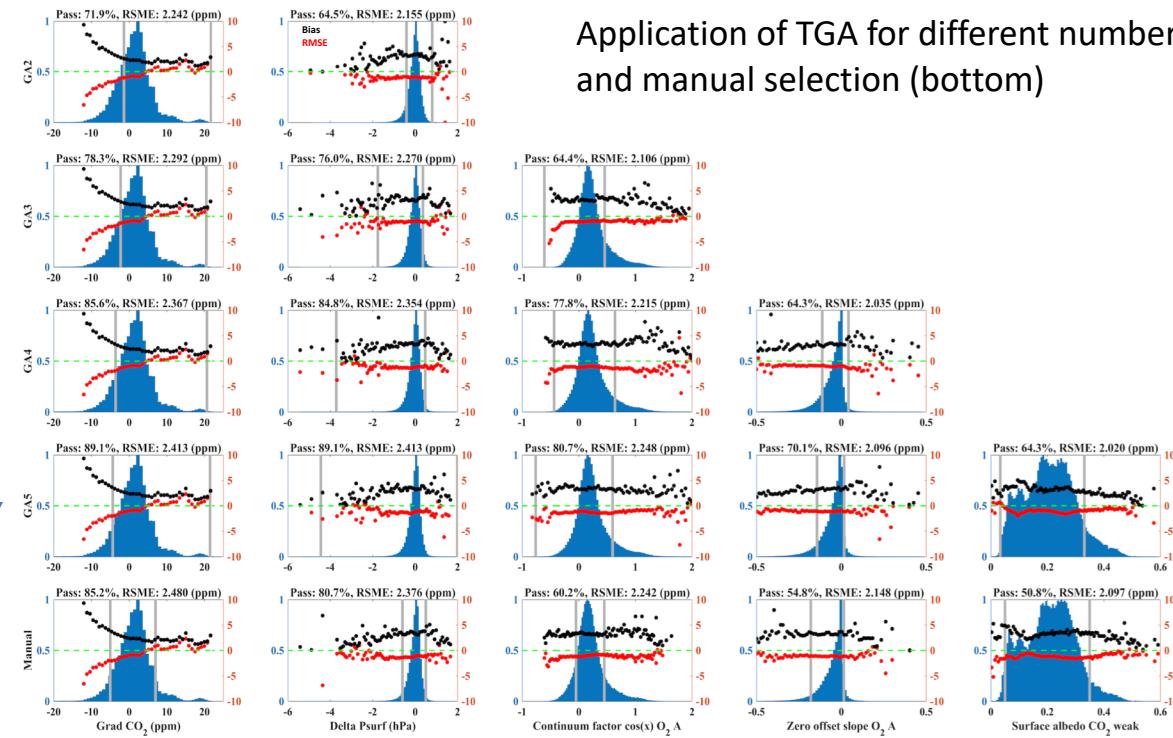
Filtering and Bias Correction

Application of Target Genetic algorithm for quality filtering of TanSat retrievals:

- Pre-selects transparency and complexity based on candidate filters selected according to correlation of error against TCCON
- Transparency of ~65% and 2 ppm RMSE can be achieved with 5 filters
- Empirical selection results in additional 13.5% loss of data

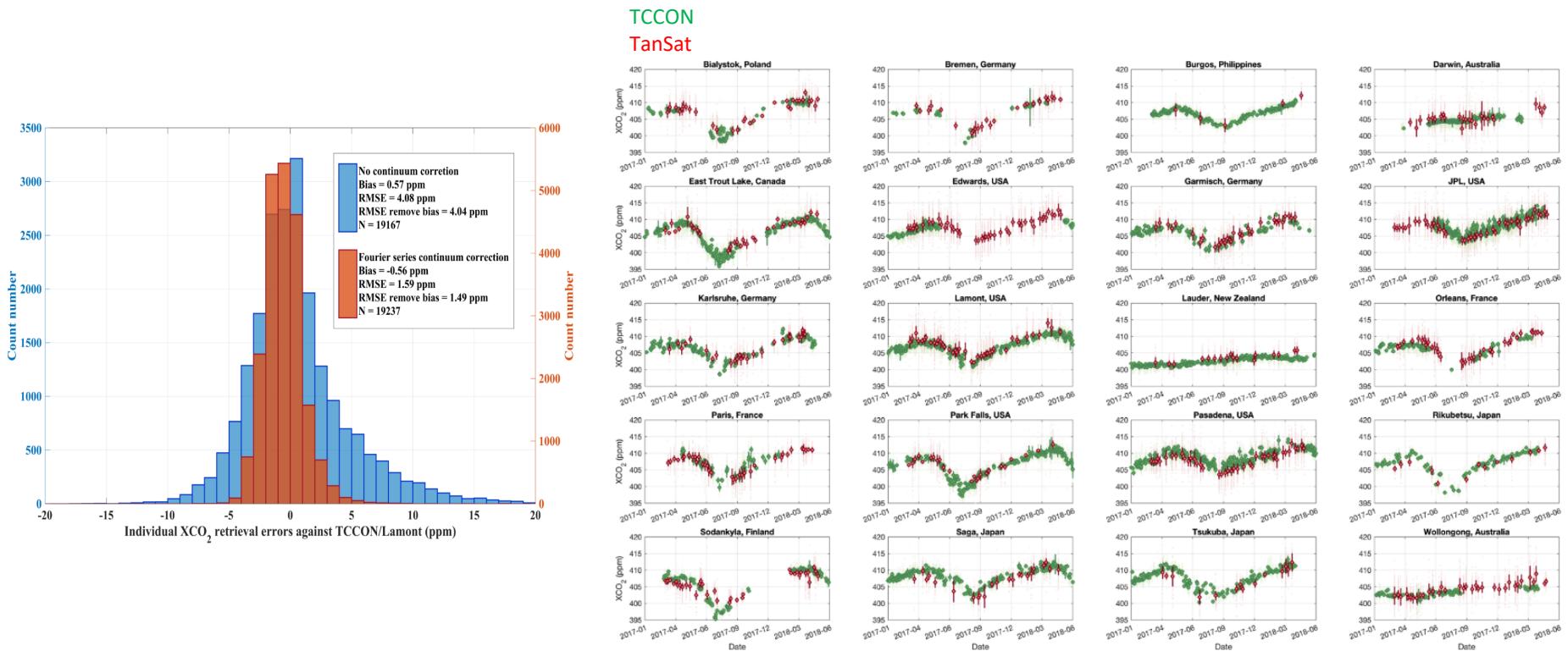
Bias correction based on multi-linear regression of same 5 parameters against TCCON

Increasing number
of filter parameters
for TGA



Application of TGA for different number filters
and manual selection (bottom)

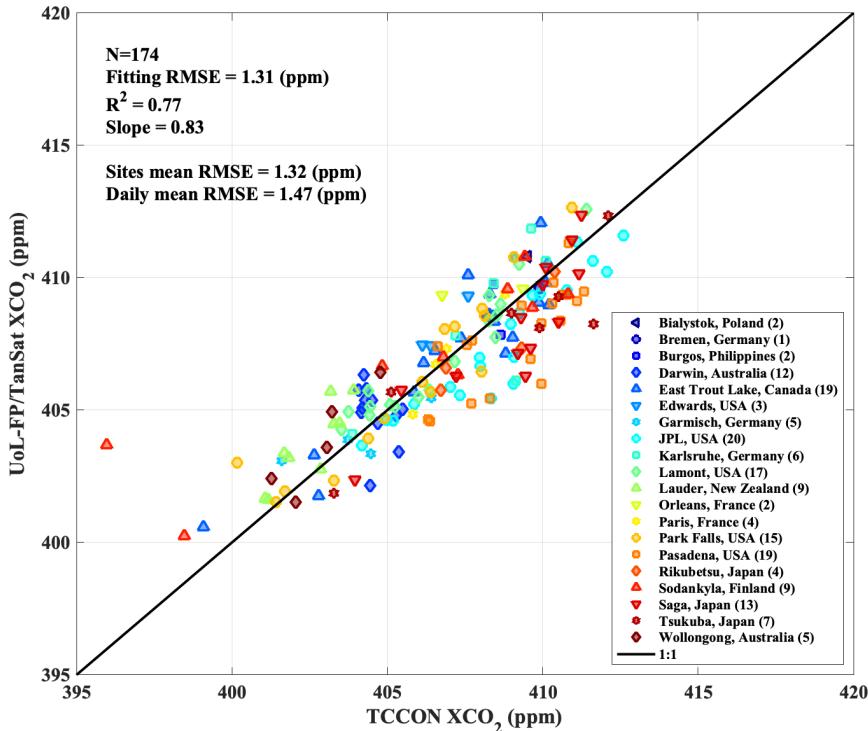
Validation of UoL-FP XCO₂ against TCCON



- Good comparisons of UoL-FP TanSat retrieval against TCCON similar to other missions (OCO-2, GOSAT)



Validation of UoL-FP XCO₂ against TCCON

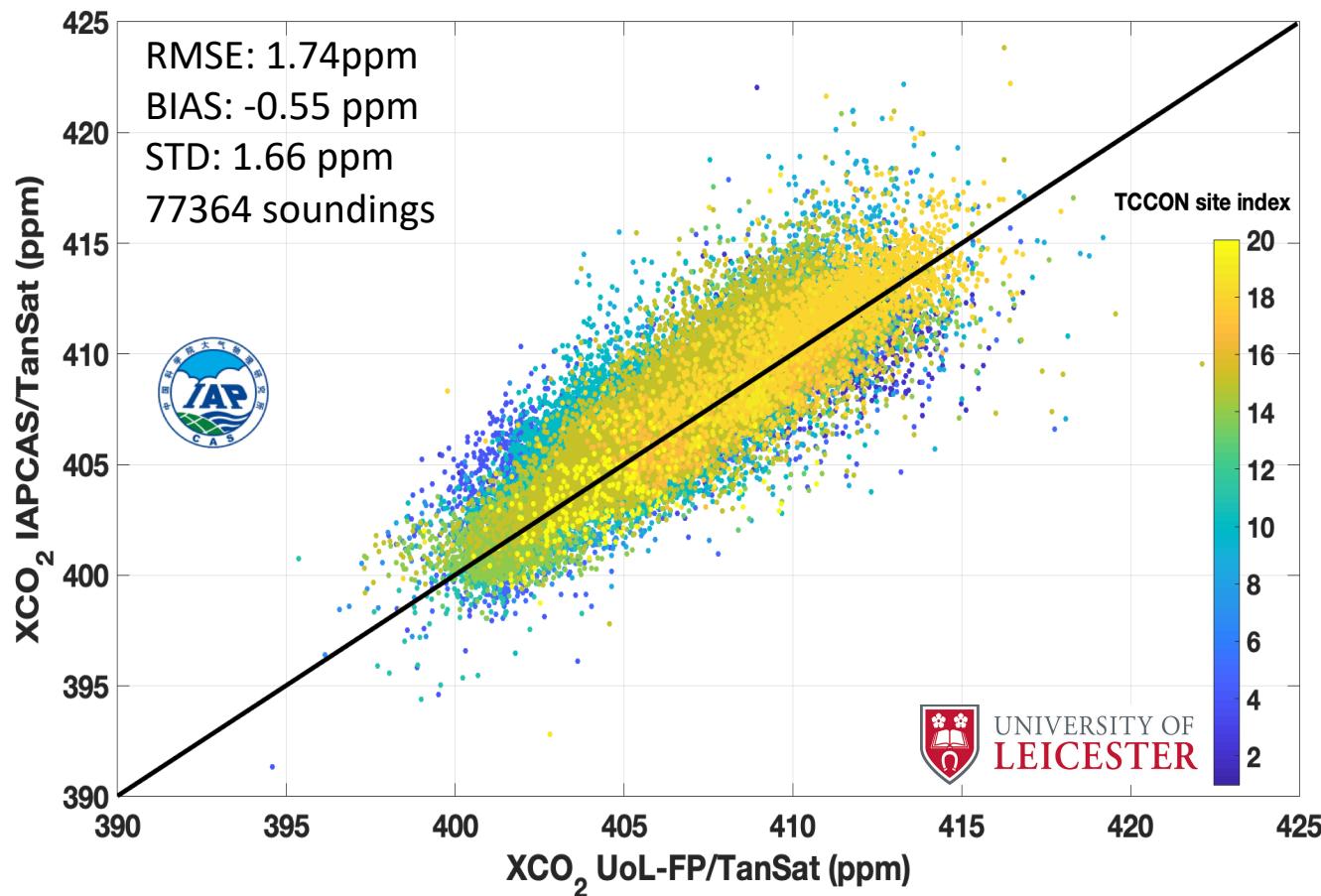


Site	N (overpasses)	validation	
		bias (ppm)	RMSE (ppm)
Bialystok, Poland	2	0.78	0.93
Bremen, Germany	1	-0.29	0.29
Burgos, Philippines	2	0.27	1.10
Darwin, Australia	12	0.29	1.36
East Trout Lake, Canada	19	0.21	1.12
Edwards, USA	3	1.36	1.39
Garmisch, Germany	5	0.24	1.18
JPL, USA	20	-1.12	1.39
Karlsruhe, Germany.	6	0.33	1.67
Lamont, USA	17	0.37	0.76
Lauder, New Zealand	9	1.19	1.40
Orléans, France	2	1.40	1.83
Paris, France.	4	0.048	0.62
Park Falls, USA	15	0.41	1.20
Pasadena, USA	19	-1.41	1.84
Rikubetsu, Japan	4	-0.85	1.12
Sodankylä Finland	9	1.17 (0.35)*	2.83 (1.25)*
Saga, Japan	13	-0.92	1.53
Tsukuba, Japan	7	-1.04	1.62
Wollongong, Australia	5	0.90	1.23

- Good comparisons of UoL-FP TanSat retrieval against TCCON similar to other missions (OCO-2, GOSAT)



Inter-comparisons of TanSat UoL-FP and IAPCAS Retrieval



- Direct intercomparisons show good agreement between UoL and IAPCAS retrieval
- Note that no bias correction si applied here to both retrievals

Summary and Outlook

- We have applied the UoL-FP retrieval to TanSat XCO₂ retrieval over TCCON sites
- By analyzing the solar calibration measurement, we found spectral artifacts can be effectively eliminated by applying a Fourier series model for radiometric correction
- This correction significantly improves fitting residual, and accordingly reduces XCO₂ retrieval RMSE against measurements from the TCCON
- After applying a bias correction and filtering, a mean RMSE of 1.47 ppm against TCCON is found with typical biases of a few tenths of a ppm for individual TCCON sites but larger biases (~1 ppm) are observed for some sites
- The methods developed in this study will be applied to IAPCAS XCO₂ retrieval which is used for the operational processing of TanSat L2 data. IAPCAS data will be available on the China GEO data service (www.chinageoss.org/tansat)
- UoL-FP TanSat data will be made available via ESA CCI+ website.