# A coupled BRDF $CO_2$ retrieval method for the GF-5 GMI and improvements in the correction of atmospheric scattering

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The Greenhouse Gases Monitoring Instrument (GMI), on board the Chinese Gaofen-5 (GF-5) satellite, provides rich observation data for the global remote sensing of atmospheric $CO_2$. To meet the high-precision satellite retrieval needs of atmospheric $CO_2$, we designs a coupled bidirectional reflectance distribution function (BRDF) $CO_2$ retrieval (CBCR) method, which describes the surface reflectance characteristics by the BRDF, corrects for atmospheric scattering based on full physics retrieval theory, and ensures the stable retrieval of multiple parameters and atmospheric $CO_2$ by enriching prior constraints. Theoretical analysis shows that the influence of atmospheric scattering induced by the surface bidirectional reflectance characteristics is significantly related to the aerosol optical depth, solar zenith angle, and viewing zenith angle. The validation of GMI $CO_2$ retrievals shows that the CBCR method significantly reduced the influence of the surface bidirectional reflectance characteristics under high AOD and high SZA conditions, decreased the atmospheric $CO_2$ retrieval error from $0.58 \pm 5.64$ ppm to $-1.33 \pm 3.13$ ppm, and increased the correlation with the temporal variation of actual atmospheric $CO_2$ from 34.7 to 76.8%. Our CBCR method can correct the influence of atmospheric scattering induced by the surface bidirectional reflectance characteristics on atmospheric $CO_2$ retrieval, and this work demonstrates that describing the surface reflectance characteristics by using BRDF is a promising idea in the field of satellite $CO_2$ retrievals.

## 1. Introduction

- The Chinese GF-5 satellite GMI can provide an abundance of data for the global detection of atmospheric $CO_2$, was launched on 9 May 2018.

- GMI observes solar light reflected from the Earth's surface from near-infrared to the shortwave infrared region based on the spatial heterodyne spectroscopy technique.

Table.1 Technical characteristics of the Greenhouse Gases Monitoring Instrument (GMI)

| Parameter | Spectral Band | | | |
|---|---|---|---|---|
| | NIR | SWIR-1 | SWIR-2 | SWIR-3 |
| Spectral range (nm) | 759–769 | 1568–1583 | 1642–1658 | 2043–2058 |
| Spectral resolution at FWHM (nm) | 0.035 | 0.067 | 0.067 | 0.113 |
| Signal-to-noise ratio (SNR) | 300 | 300 | 250 | 250 |
| Spatial resolution | 10.5 km × 10.5 km | | | |
| Data coverage | August 2018 to April 2020 | | | |

## 2. Objective

- Retrieve high-precision $CO_2$ products from GMI measurements.
- Improve initial retrieval algorithm which doesn't correct atmospheric scattering to obtain high retrieval accuracy and more effective observations.
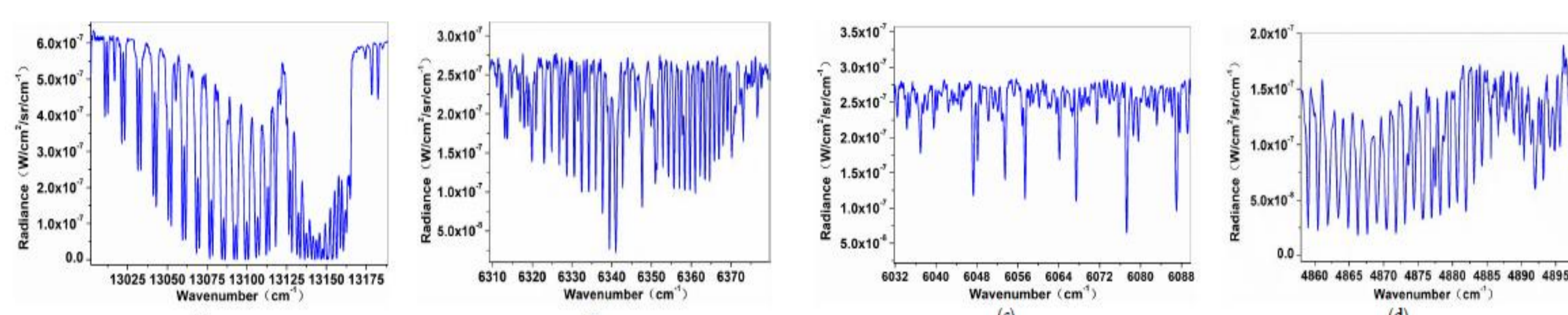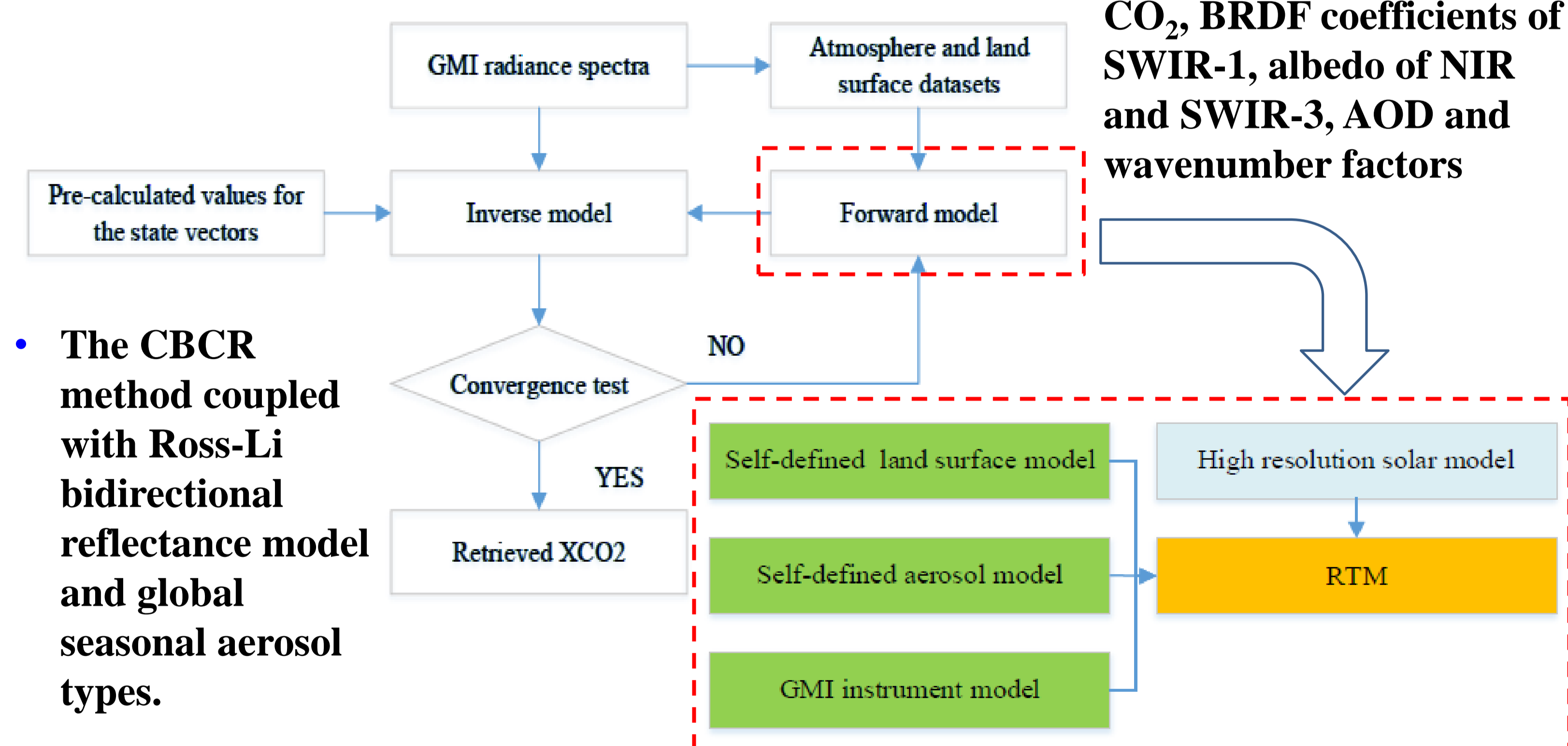


Fig.1 Spectra measured by GMI. Near-infrared (a), shortwave infrared-1, -2, and -3

## 3. Retrieval method

- CBCR method retrieves $CO_2$, BRDF coefficients of SWIR-1, albedo of NIR and SWIR-3, AOD and wavenumber factors



- The CBCR method coupled with Ross-Li bidirectional reflectance model and global seasonal aerosol types.

**Surface model (kernel-driven bidirectional reflectance model)**

$$\rho(\theta_i, \theta_v, \varphi; \lambda) = f_{iso}(\lambda)K_{iso} + f_{vol}(\lambda)K_{vol} + f_{geo}(\lambda)K_{geo}$$
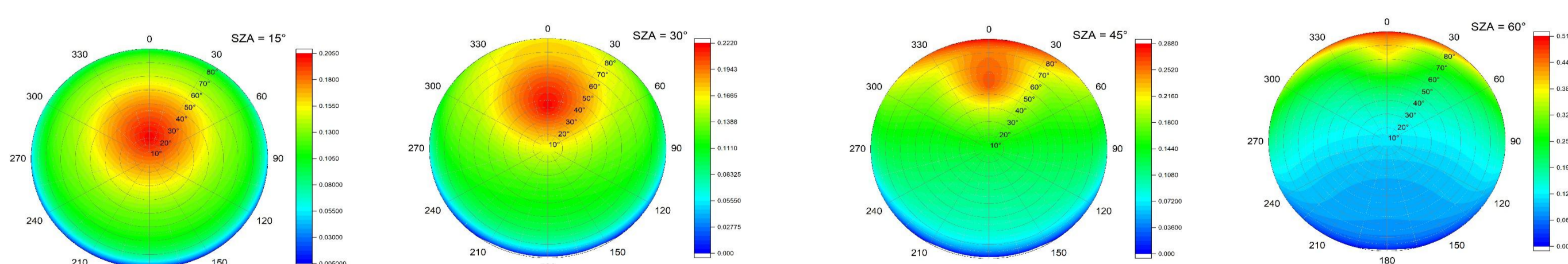


Fig.2 BRDF characteristic maps corresponding to the underlying urban surface in different solar zenith angles . 15° (a), 30° (b), 45° (c) and 60°

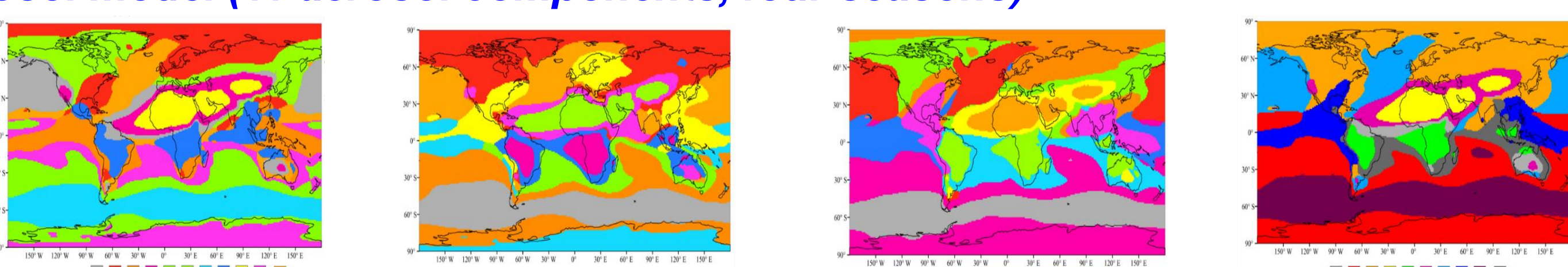**Aerosol model (11 aerosol components, four seasons)**



Fig.3 Four seasonal global aerosol models. Spring (a), summer (b), autumn (c), and winter (d)

## 4. Simulation results

- The influence of surface bidirectional reflectance characteristics to $XCO_2$ retrievals is directionality and varies with AOD, 1 ppm under AOD 0.05 and 4.91ppm under AOD 0.4 (SZA<60°)
- The CBCR method can improve the $XCO_2$ retrieval precision to 0.3ppm under AOD 0.05 and 2.2ppm under AOD 0.4, and reduced the directionality.
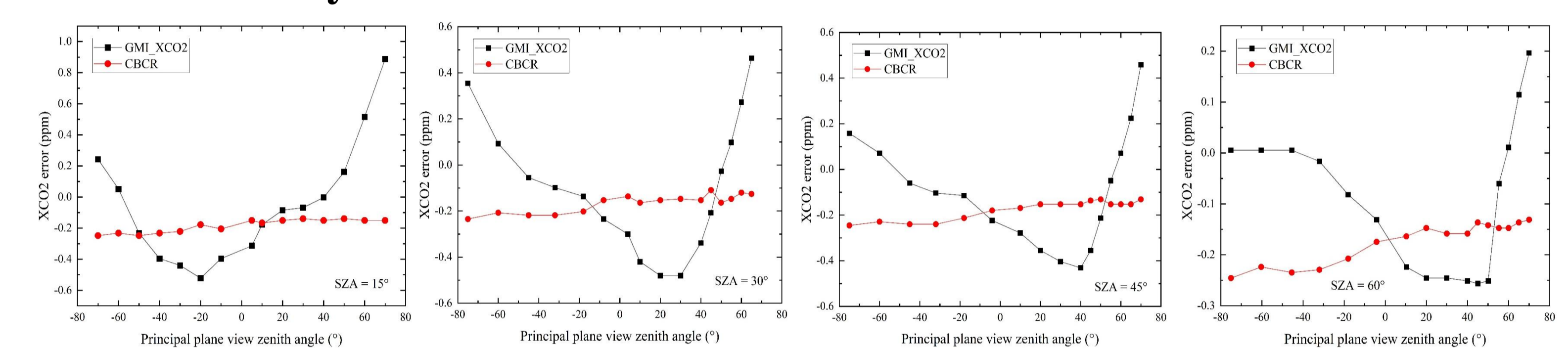


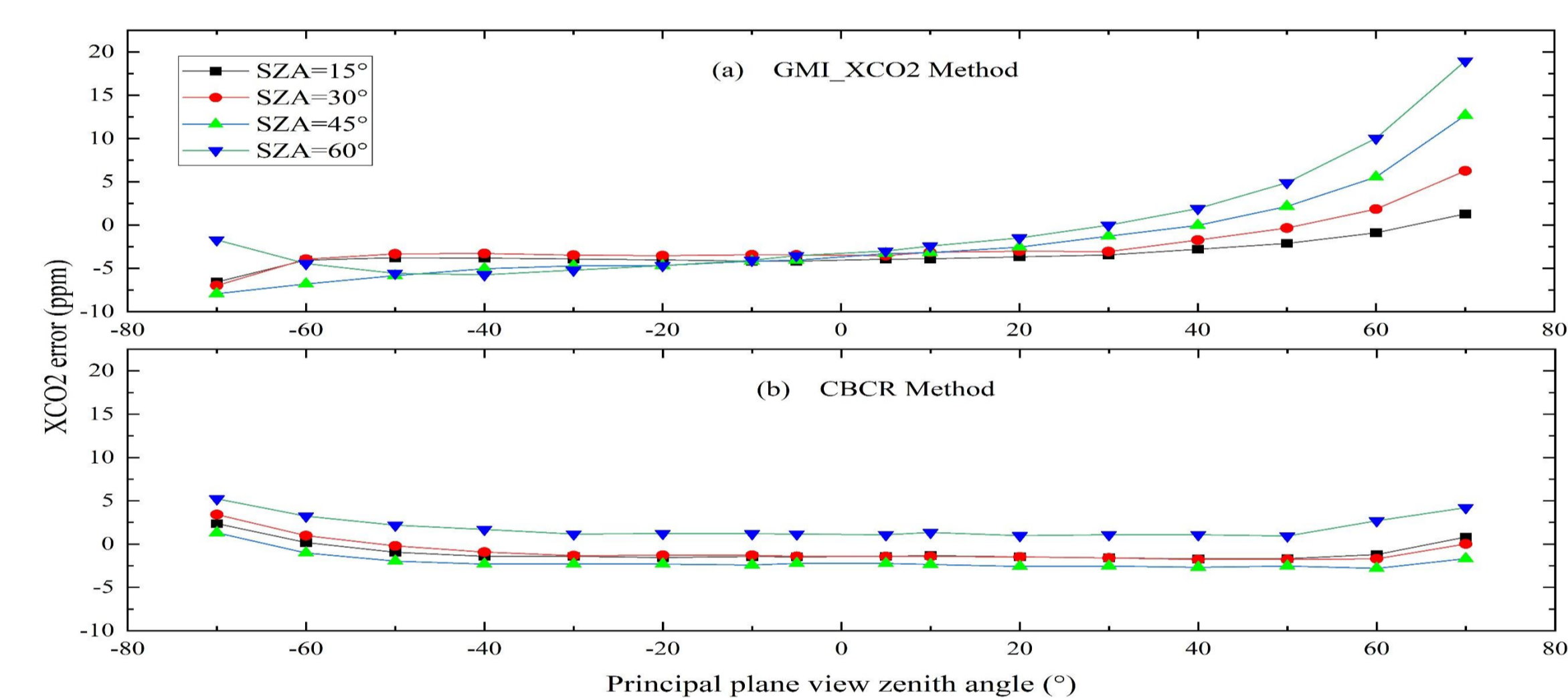Fig.4 Results of GMI_XCO2 and CBCR method under different observation conditions (AOD = 0.05)



Fig.5 Retrieval errors of GMI_XCO2 and CBCR under different observation conditions (AOD = 0.4)
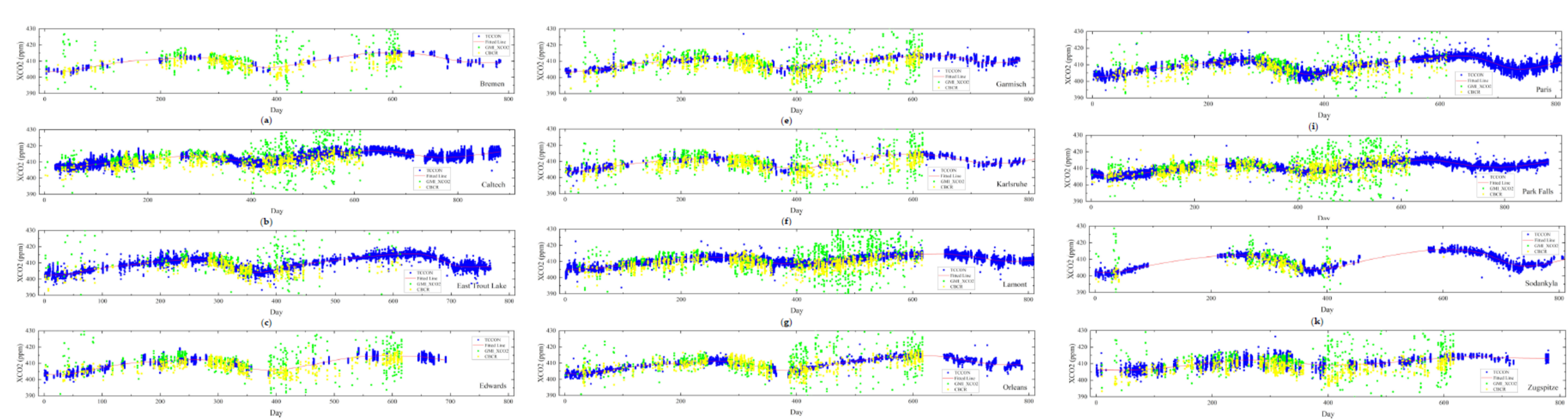
## 5. Validation



Fig.6 The GMI_XCO2 and CBCR method results and the results of 12 TCCON sites

- With the CBCR method we obtained GMI $XCO_2$ products with retrieval error 3.13ppm and high temp-spatial consistent with TCCON stations, with maximum of 3.3 ppm, a minimum of 2.43 ppm, and a maximum difference of only 0.87 ppm.

- The CBCR method reduces the correlations of $CO_2$ retrieval errors to the AOD and SZA.
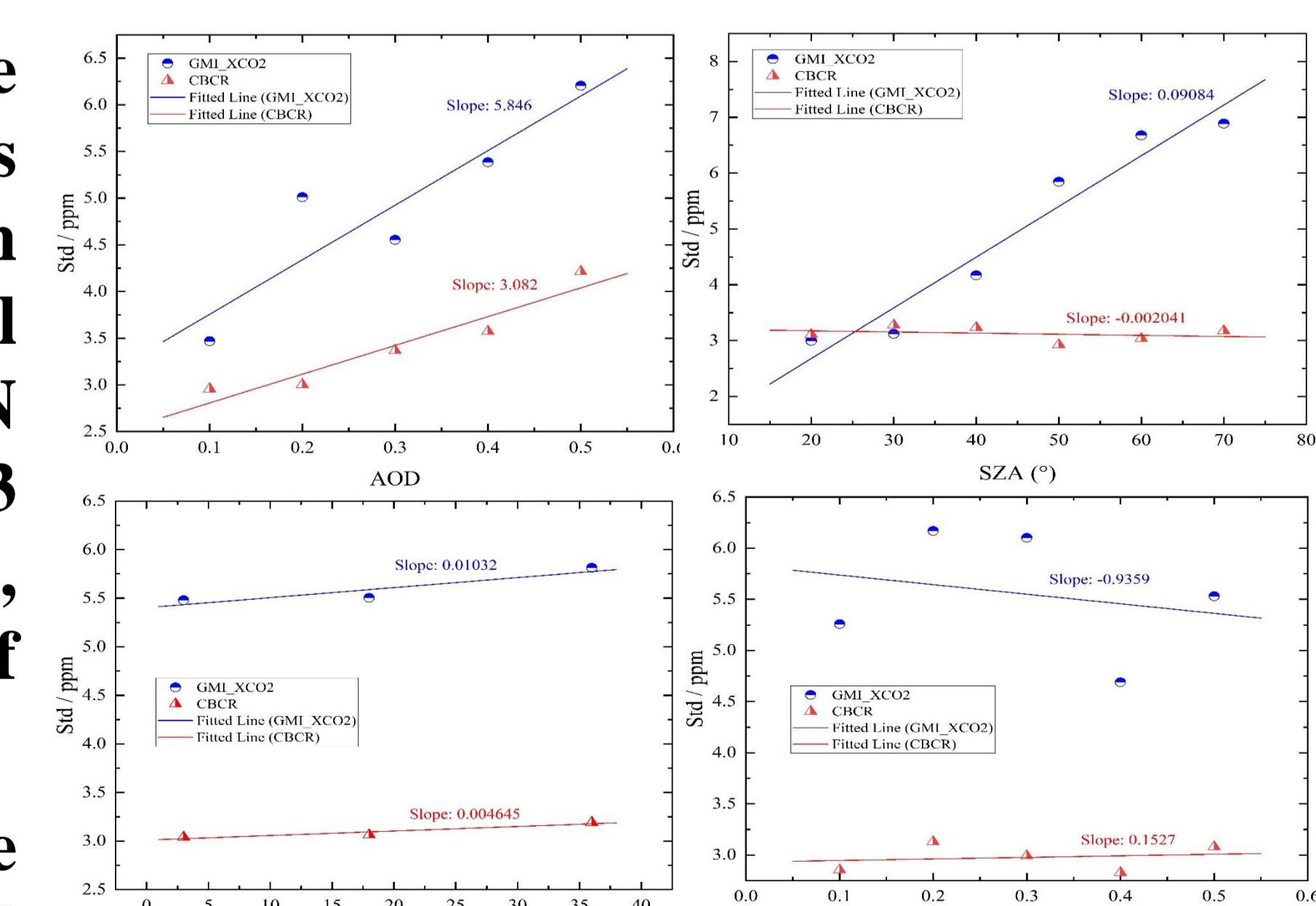


Fig.7 Correlation of atmospheric $CO_2$ retrieval deviation with AOD, SZA, VZA, and reflectance

## 6. Conclusions

➢ With the CBCR method we obtained GMI $XCO_2$ products with retrieval error 3.13ppm.

➢ The CBCR method can reduced the directionality of $CO_2$ retrieval error and significantly reduces the influence of surface bidirectional reflectance characteristics under high AOD and high SZA.