

SEASONAL CHANGING TREND OF CO₂ CONCENTRATION RESPONDING TO CARBON ABSORPTION OF VEGETATION OBSERVED BY SATELLITES

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ABSTRACT:

It is not exactly known how the seasonal variations of CO₂ concentration such as its seasonal peak and amplitude etc., are influenced by vegetation carbon absorption. This paper presents the seasonal changing trend of CO₂ concentration affected by the seasonal activity of vegetation carbon absorption observed by Greenhouse Gases Observing Satellite (GOSAT). We extracted the seasonal changing characteristic values of CO₂ concentration using the global mapping of column-averaged CO₂ dry-air mole fraction (XCO₂) retrievals from GOSAT observing data during June 2009 to May 2014. The seasonal changing characteristic values of CO₂ concentration mainly include the amplitudes, the peak and its time of XCO₂ seasonal variations. As a result, it is found that the amplitude of XCO₂ seasonal variation is spatially corresponding to that of the normalized difference vegetation index (NDVI) from Moderate Resolution Imaging Spectroradiometer (MODIS) which could indicate the magnitude of vegetation carbon absorption. Additionally the seasonal variation of XCO₂ is strongly correlated with the seasonal variation of NDVI over vegetation covers in the northern hemisphere.

1. INTRODUCTION

Satellite observation of atmospheric CO₂ such as Greenhouse Gases Observing Satellite (GOSAT) and Orbit Carbon Observation (OCO-2) offers us new opportunities to know the mechanism of land biosphere absorption for CO₂ as its advantage of global coverage and high measurement density comparing to in-site measurements (Buchwitz et al., 2015, Hungershofer et al., 2010, Crisp et al., 2004; Yokota et al., 2004). The patterns of XCO₂ distribution averaged over a long period of several years are mostly affected by distribution of the underlying surface fluxes (Schneising et al., 2011). It is not completely clear what is the spatial differences of seasonal variation of CO₂ concentration in a global scale although we know that the seasonal cycle of CO₂ is mainly induced by the seasonal activities of biosphere absorption for CO₂ [Zeng et al., 2014; Schimel et al., 2015].

In this paper we applied the global XCO₂ mapped from GOSAT XCO₂ data to extract the seasonal changing characteristics of XCO₂ and analyze these characteristics related with the vegetation absorptive strength using NDVI data.

2. USED DATA AND PROCESSING

2.1 Raw XCO₂ data

We collected the raw XCO₂ data (ACOS-GOSAT v3.3, <http://co2web.jpl.nasa.gov>) produced by the Atmospheric CO₂ Observations from Space (ACOS) project from applying the Orbiting Carbon Observatory (OCO) calibration, validation, and remote sensing retrieval algorithm to the GOSAT spectral measurements spanning from June 2009 through May 2013 (O'Dell et al., 2012; Wunch et al., 2011). We extracted those land-only data with high gain flag from those raw ACOS-GOSAT v3.3 XCO₂ retrievals. The data is first filtered using the advanced screening criteria to extract the good soundings, and then bias-corrected to remove the systematic bias in the XCO₂ retrievals, as recommended by ACOS data users' guide (Wunch et al., 2011, Crisp et al., 2012). The filtered and bias-corrected data are referred to as ACOS-XCO₂ hereafter. It is reported that the bias-corrected data is uncertain to ~0.3 ppm when compared with data from Total Carbon Column Observing Network (TCCON) (ACOS User Guide, 2014), and ACOS datasets show more stable performance comparing with the other several individual satellite retrieval

algorithms (Buchwitz et al., 2015). Additionally we collected the simulation XCO₂ data by Carbon-Tracker model from June 2009 to May 2014 for comparing with ACOS-XCO₂ (<http://www.esrl.noaa.gov/gmd/ccgg/carbontracker>).

2.2 Mapping XCO₂ data from ACOS-GOSAT retrievals

XCO₂ data from ACOS-GOSAT retrievals are irregularly distributed and have many gaps in space and time mainly due to cloud coverage and the observation mode of GOSAT-FTS (Zeng et al., 2014), which make it difficult to directly interpret the detailed spatio-temporal variations of CO₂ concentration. The mapping method to fill the gaps between ACOS-GOSAT XCO₂ data is therefore applied to the ACOS- XCO₂ data. The method is based on the spatio-temporal geo-statistical estimation approach, which first quantify and model the spatio-temporal correlation structure in the data and then make optimal estimations of XCO₂ in the gaps using spatio-temporal kriging (Zeng et al., 2014). The mapping method and the resulted mapping XCO₂ data, which are used in this study, are described and assessed in Zeng et al. (2013) and Guo et al. (2015). Using the mapping method, we obtained the mapped ACOS-XCO₂ dataset and the corresponding estimation standard deviation, a measurement of estimation uncertainty, in 1°×1° grids in space and 3 days interval in time from June 2009 to May 2014.

2.3 NDVI data

The data of the normalized difference vegetation index (NDVI) from Moderate Resolution Imaging Spectroradiometer (MODIS) is collected as well in the same period as XCO₂ dataset released from USGS (<http://e4ftl01.cr.usgs.gov>). All of these data is resampled in 1°×1° grids matching with the grid size of XCO₂ data.

2.4 Fitting of XCO₂ seasonal cycle

The temporal variation of CO₂ concentration could be divided into two parts for annual growth and seasonal cycle mainly affected by the anthropogenic fossil fuel emissions and biosphere activities. The classical formula, a skewed sine wave, can be used to fit the temporal variation of CO₂ concentration [Vettr et al., 2015; Lindqvist et al., 2015]. We fitted an monthly seasonal cycle to the mapping XCO₂ and daily Carbon-Tracker simulating data using the harmonic functions [Lindqvist et al., 2015].

3. RESULTS AND DISCUSSION

The amplitude of XCO₂ seasonal variation, which is the difference between the maximum and the minimum XCO₂, is extracted using fitting XCO₂ seasonal cycle from the temporal variation of mapping ACOS-XCO₂ data, and is shown in Figure 1. Similarly Figure 2 demonstrates the amplitude of XCO₂ seasonal variation using fitting XCO₂ seasonal cycle from the temporal variation of simulated XCO₂ data by Carbon-Tracker.

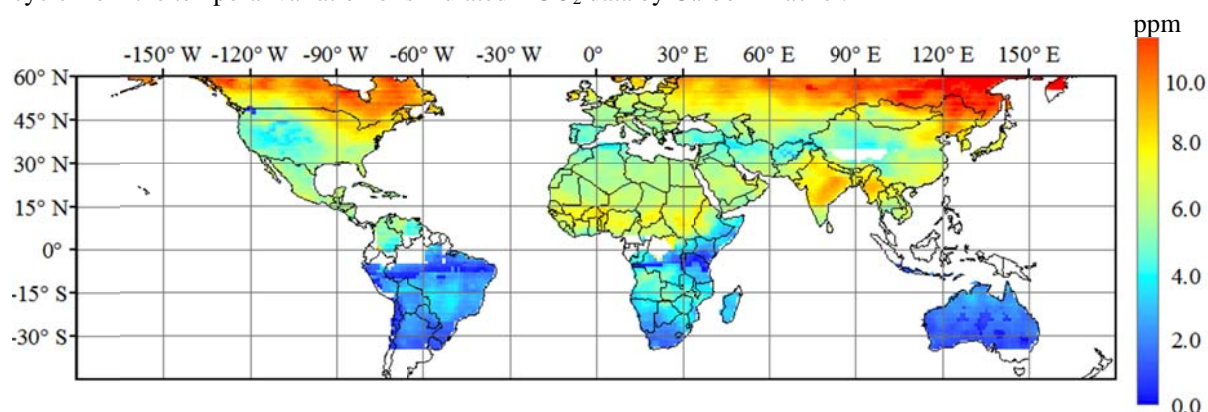


Figure 1. The amplitude of XCO₂ seasonal variation from fitting seasonal cycle of mapping XCO₂ derived from GOSAT ACOS v3.5 data from June 1 2009 to May 30 2014 with 3 day time resolution.

We can find from Figure 1 that the amplitude of XCO₂ seasonal variation observed by GOSAT clearly changes with the latitudinal band and responding to the border of high latitudinal forest in the northern hemisphere. Comparing with the amplitude of XCO₂ seasonal variation from simulated XCO₂ by Carbon-Tracker 2015 as shown in Figure 2, they demonstrated very similar spatial distribution whereas that of ACOS-XCO₂ presented slightly higher value than that of simulating XCO₂.

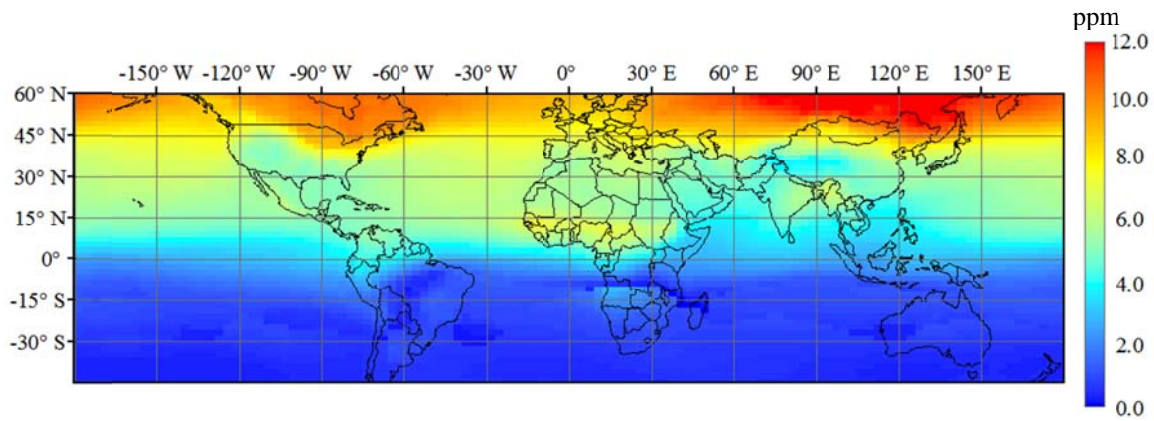


Figure 2. The amplitude of XCO₂ seasonal variation from fitting seasonal cycle of simulating daily XCO₂ derived from Carbon-Tracker 2015 from June 1 2009 to May 30 2014 with 3 day time resolution.

The month of minimum XCO₂ and the month of maximum in XCO₂ seasonal variation, which is extracted using fitting XCO₂ seasonal cycle from the temporal variation of mapping ACOS-XCO₂ data, are shown in Figure 3. It can be seen from Figure 3 that both of the month of maximum XCO₂ and minimum XCO₂ changed with the latitudinal band in the northern hemisphere.

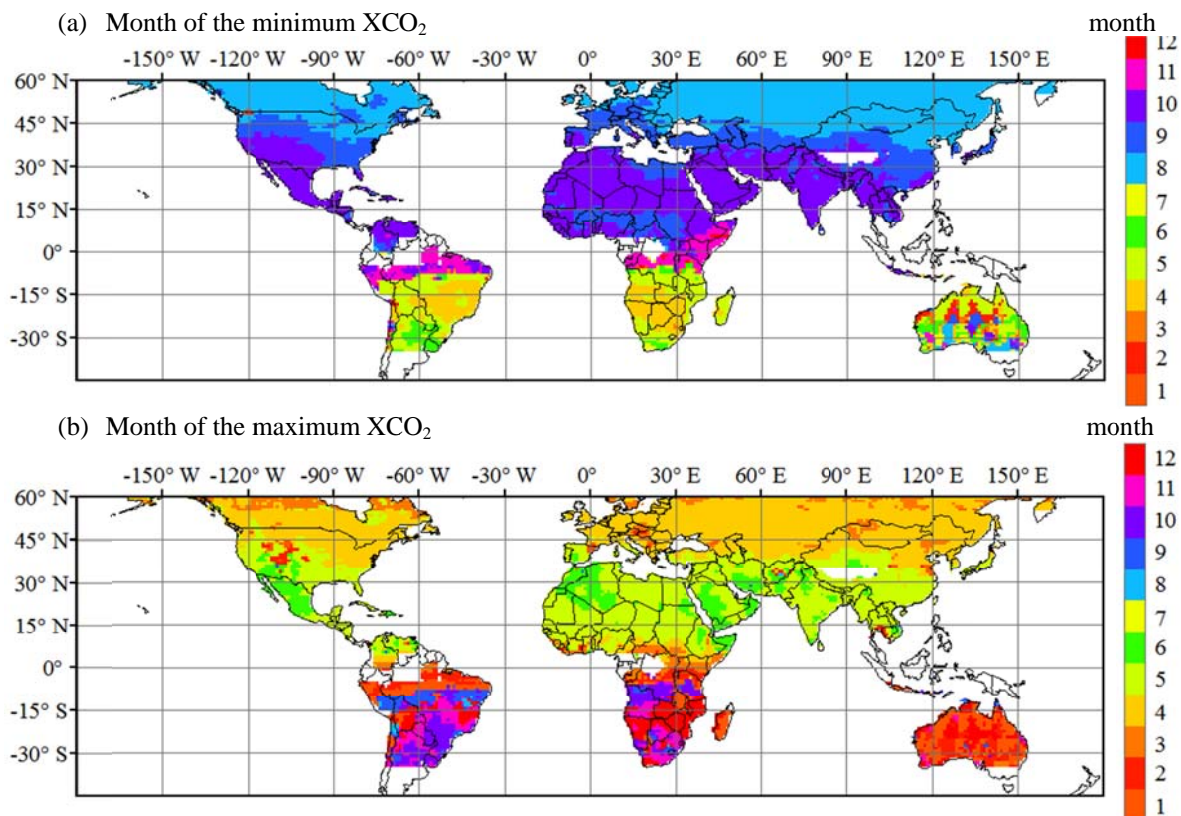


Figure 3. The month of peak in XCO₂ seasonal variation is extracted from fitting seasonal cycle of mapping ACOS-XCO₂ observed by GOSAT from June 1 2009 to May 30 2014 with 3 day time resolution, (a) the month of minimum XCO₂; (b) the month of maximum XCO₂.

Moreover the amplitude magnitude of ACOS-XCO₂ is agreement with the amplitude contour of ACOS-XCO₂ 8 ppm (Figure 4).

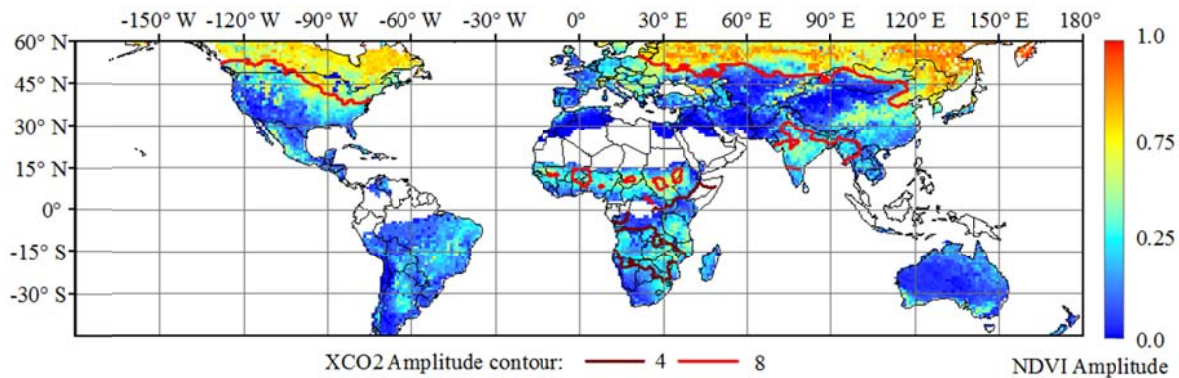


Figure 4. The amplitude of NDVI seasonal variation is extracted from fitting seasonal cycle of MODIS NDVI from June 1 2009 to May 30 2014 with 8 day time resolution which is overlapped with the amplitude contour of ACOS-XCO₂ seasonal variation in 4 ppm and 8 ppm.

4. CONCLUSION

This study probed the potential application of ACOS-GOSAT XCO₂ retrievals for assessment of vegetation absorption of atmospheric CO₂. In order to study the continued variations of XCO₂ in space and time, a mapped XCO₂ dataset, generated by applying a geostatistical estimation method of spatio-temporal data to fill the gaps in original ACOS-GOSAT XCO₂ data, is used in this study. As a result, the mapped XCO₂ dataset captures the spatio-temporal variations of XCO₂ and the seasonal cycle of CO₂ concentration in space in good detail which is related with the absorption of vegetation for atmospheric CO₂.

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