1	Rapid growth in nitrogen dioxide pollution over Western China, 2005-2013
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14 Abstract

Western China has experienced rapid industrialization and urbanization since the implementation of the National Western Development Strategies (the "Go West" movement) in 1999. This transition has affected the spatial and temporal characteristics of nitrogen dioxide (NO₂) pollution. In this study, we analyze the trends and variability of tropospheric NO₂ vertical column densities (VCDs) from 2005 to 2013 over Western China, based on a wavelet analysis on monthly mean NO₂ data derived from the Ozone Monitoring Instrument (OMI) measurements. We focus on the anthropogenic NO₂ by subtracting region-specific "background" values dominated by natural sources. After removing the background influences, we find significant anthropogenic NO₂ growth over Western China between 2005 and 2013 (8.6 \pm 0.9% yr⁻¹ on average, relative to 2005), with the largest increments (15% yr⁻¹ or more) over parts of several city clusters. The NO₂ pollution in most provincial-level regions rose rapidly from 2005 to 2011 but stabilized or declined afterwards. The NO₂ trends were driven mainly by changes in

anthropogenic emissions, as confirmed by a nested GEOS-Chem model simulation and 1 a comparison with Chinese official emission statistics. The rate of NO₂ growth during 2 2005-2013 reaches 11.3 $\pm 1.0\%$ yr⁻¹ over Northwestern China, exceeding the rates over 3 Southwestern China (5.9 \pm 0.6 % yr⁻¹) and the three well-known polluted regions in the 4 east (5.3 $\pm 0.8\%$ yr⁻¹ over Beijing-Tianjin-Hebei, 4.0 $\pm 0.6\%$ yr⁻¹ over the Yangtze River 5 Delta, and $-3.3 \pm 0.3\%$ yr⁻¹ over the Pearl River Delta). Subsequent socioeconomic 6 analyses suggest that the rapid NO₂ growth over Northwestern China is likely related 7 to the fast developing resource- and pollution-intensive industries along with the "Go 8 West" movement as well as relatively weak emission controls. Further efforts should 9 be made to alleviate NO_x pollution to achieve sustainable development in Western 10 China. 11

1 **1 Introduction**

Nitrogen oxides ($NO_x = NO + NO_2$) are major constituents in tropospheric chemistry, 2 leading to ozone formation, acid deposition, and particulate matter pollution. NO_x are 3 emitted into the troposphere from anthropogenic activities (thermal power plants, 4 transportation, industries, and residential use) and natural sources (lightning, open fires, 5 and soil) (Lin, 2012;Russell et al., 2012). Rapid economic development and 6 urbanization across China in recent decades have caused serious air pollution problems, 7 with NO_x becoming the fastest growing air pollutant in China over the last two decades 8 (Richter et al., 2005;Zhang et al., 2012;Zhao et al., 2013). 9

Vertical column densities (VCDs) of tropospheric NO₂ retrieved from various satellite 10 11 instruments have been used widely to study NO_x pollution over China (Richter et al., 2005;van der A et al., 2006;He et al., 2007;Wang et al., 2007b;Zhang et al., 12 2007b;Zhang et al., 2012;Gu et al., 2013;Huang et al., 2013;Lin et al., 2014b). Satellite 13 observations provide a tool to infer patterns of anthropogenic and natural NOx 14 15 emissions (Zhang et al., 2007a;Stavrakou et al., 2008;van der A et al., 2008;Zhang et al., 2009b;Zhao and Wang, 2009;Li et al., 2010;Lin et al., 2010b;Lamsal et al., 2011;Lin, 16 2012; Wang et al., 2012; Reuter et al., 2014; Lin et al., 2015). They are also useful to 17 analyze the large variations in NO_x pollution during several short-term socioeconomic 18 events, such as the Sino-African summit, Beijing Olympic Games, Shanghai Expo, 19 Guangzhou Asian Games, Chinese economic recession and Chinese New Year (Wang 20 et al., 2007a; Mijling et al., 2009; Wang et al., 2009; Witte et al., 2009; Hao et al., 21 2011;Lin and McElroy, 2011;Lin et al., 2013). 22

Most of prior studies have focused on Eastern China, with little attention paid to Western China. As shown in Fig. 1, Western China is specified here as the vast region covering six provinces (Gansu, Guizhou, Qinghai, Shaanxi, Sichuan and Yunnan), five provincial-level autonomous regions (Guangxi, Inner Mongolia, Ningxia, Tibet and Xinjiang), and one provincial-level municipality (Chongqing City). Western China has experienced significant socioeconomic changes following the National Western Development Strategies (the "Go West" movement) launched by the Chinese

government in 1999. Over the last decade, the rates of industrialization and urbanization 1 in Western China has accelerated (Deng and Bai, 2014). Western China is rich in natural 2 resources, such as water, coal, natural gas, petroleum, and minerals. With the 3 adjustment of regional development strategy at a national level, those energy-intensive 4 industries formerly located in Eastern China have been encouraged to move westward 5 (Zhao et al., 2015), although the ecosystems of Western China may be more fragile than 6 those of Eastern China (Shao and Qi, 2008; Chen et al., 2010; Bai et al., 2014; Zhao et 7 8 al., 2015). Although the "Go West" movement is beneficial for local industrial and 9 economic development in Western China, it may have led to unintended environmental impacts that have yet to be understood. The short lifetime of tropospheric NO₂ (hours 10 to a day), its strong link and rapid response to emissions, and the availability of high-11 quality satellite measurements allow evaluating pollution changes and the possibility of 12 13 sustainable development in Western China. Satellite measurements are particularly important in lack of sufficient ground-based measurements. 14

15 This study investigates the spatiotemporal variations of tropospheric NO₂ VCDs between October 2004 and May 2014 over Western China and potential human 16 influences, by analyzing the monthly Royal Netherlands Meteorological Institute 17 (KNMI) Ozone Monitoring Instrument (OMI) NO₂ data (DOMINO v2). We apply a 18 wavelet decomposition analysis to reveal the long-term trends of tropospheric NO₂ over 19 20 Western China. We also use a nested GEOS-Chem simulation and Chinese official emission statistics to confirm that anthropogenic emissions are the main driver of NO₂ 21 22 variations. At last, we discuss the regional differences in NO_2 growths between Northwestern and Southwestern China and between Western and Eastern China, and 23 24 we associate these differences with the driving socioeconomic factors of individual 25 regions.

- 26 2 Data and study area
- 27 2.1 Satellite data

28 OMI is onboard the EOS-Aura satellite. The satellite measurements have a pixel size

of 13×24 km² at nadir with a local overpass time around 13:40. VCDs of tropospheric 1 NO₂ are derived in three major steps, including derivation of slant column densities 2 (SCDs), separation of stratospheric and tropospheric SCDs, and calculation of 3 tropospheric air mass factors (AMFs) for deduction of the tropospheric VCDs. On a 4 regional and monthly mean basis, the error of retrieved VCDs is about 30% (a relative 5 error) plus 0.7×10^{15} molecules cm⁻² (an absolute error) (Boersma et al., 2011;Lin and 6 McElroy, 2011). More detailed algorithms and error descriptions involved in retrieving 7 8 tropospheric NO₂ VCDs can be found in Boersma et al. (2007) and Boersma et al. (2011). 9

We mapped level-2 v2 10 the DOMINO product (http://www.temis.nl/airpollution/no2.html) to a $0.25 \circ \times 0.25 \circ$ grid, and then averaged 11 daily data to produce monthly mean VCD values. We used data from October 2004 to 12 May 2014 for the present analysis. For data quality control, we excluded pixels with a 13 cloud radiance fraction > 50% or affected by row anomaly (Boersma et al., 2011). We 14 filled the missing monthly mean values in some grid cells using values in the adjacent 15 16 years; the impact on the trend analysis is found to be small by sensitivity analyses on the respective GEOS-Chem simulation results (see Sect. 4.2.2). 17

18 **2.2**

.2 GEOS-Chem Modeling

We used the nested GEOS-Chem chemical transport model version 9-02, on a 0.667 ° 19 long. $\times 0.5$ °lat. grid with 47 vertical layers, to simulate the tropospheric NO₂ and other 20 pollutants over Asia (Chen et al., 2009). The model is run with the full Ox-NOx-VOC-21 CO-HO_x gaseous chemistry and online aerosol calculations, and it is driven by the 22 GEOS-5 assimilated meteorology from the NASA Global Modeling and Assimilation 23 Office. Vertical mixing in the planetary boundary layer follows the non-local 24 parameterization scheme implemented by Lin et al. (2010b). Convection is simulated 25 with a modified Relaxed Arakawa-Schubert scheme (Rienecker et al., 2008). Lateral 26 boundary conditions of the nested model are updated every 3 h by results from 27 28 corresponding global modeling on a 5 °long. \times 4 °lat. grid.

Chinese anthropogenic emissions of NO_x and other species adopt the monthly MEIC 1 inventory with a base year of 2008 (www.meicmodel.org). The spatial resolution of 2 MEIC used in the simulation is 0.667 ° long. $\times 0.5$ ° lat., according to the model grid. 3 We further scaled monthly anthropogenic NO_x emissions to other years, by applying 4 the ratios of monthly DOMINO v2 NO₂ VCDs in those years over the VCDs in the 5 respective months of 2008. The scaling with OMI data was done at the model resolution, 6 after regridding the satellite data from the 0.25 °long. $\times 0.25$ °lat. resolution. Emissions 7 8 for other Asian regions follow the INTEX-B inventory (Zhang et al., 2009a). Other model setups are described in (Lin et al., 2015). 9

Due to limited meteorological inputs, model simulations were conducted from 2004 to 10 April 2013. The first simulation year was used for model spin-up, and results from 2005 11 onward were analyzed in the present analysis. In the following order, modeled vertical 12 profiles of NO₂ were averaged over 13:00 – 15:00 local time, regridded to a 0.25 $^{\circ} \times$ 13 0.25 ° grid, sampled in locations and days with valid OMI data, applied with the 14 15 DOMINO averaging kernel (AK), and then averaged to derive monthly mean VCD values. The use of AK was to eliminate the effect of differences in NO₂ vertical profiles 16 between GEOS-Chem and TM4 (that provides the priori profiles for the DOMINO 17 retrieval). Following our previous work (Lin et al., 2010a;Lin, 2012), we regridded the 18 19 pixel-specific AK to the $0.25 \circ \times 0.25 \circ$ grid. Modeled VCDs data without applying the AK are also analyzed in Sect. 4.2.2 to test the effects of data sampling and temporal 20 interpolation. 21

22 2.3 Official anthropogenic emission and socioeconomic data

We took Chinese official provincial-level NO_x emission inventories for 2007 and 2010-2013 to compare with trends in OMI NO_2 . Chinese central government commenced its 25 official estimate of anthropogenic NO_x emissions following the first nationwide 26 pollution census in 2007 (The first nationwide pollution census committee, 2011). NO_x 27 emissions in 2010-2013 were also based on the estimating system of the first pollution 28 census, allowing for a consistent comparison throughout time. We also included the official emission targets aimed for 2015 from the 12th Five-Year Plan (2011-2015), a
well-known socioeconomic planning step of China. We obtained all socioeconomic
data from the China Statistical Yearbooks Database
(http://tongji.cnki.net/overseas/engnavi/navidefault.aspx).

5 2.4 Study area

Figure 1 highlights the study area in China. We extracted provincial and regional NO₂ 6 7 data according to their administrative divisions. We separated Western China into two sub-regions, including Northwestern China (Gansu, Inner Mongolia, Ningxia, Qinghai, 8 Shaanxi and Xinjiang) and Southwestern China (Chongqing, Guangxi, Guizhou, 9 Sichuan and Yunnan). Tibet is excluded from the present analysis due to lack of 10 socioeconomic data. We also selected three key regions from Eastern China for 11 comparisons with Western China: the Beijing-Tianjin-Hebei region (BTH, including 12 Beijing, Tianjin and Hebei Province), the Yangtze River Delta (YRD, including 13 Shanghai, Jiangsu Province and Zhejiang Province) and the Pearl River Delta (PRD, 14 15 part of Guangdong Province).

16 **3** Methods

17 **3.1** Determining areas dominated by anthropogenic NO₂

This study is focused on areas that have been subjected to significant changes in anthropogenic NO_x emissions. Since NO_x are emitted from both anthropogenic and natural sources (Lin, 2012), we exploited their distinctive seasonal patterns to determine areas dominated by anthropogenic sources.

Over China, anthropogenic emissions tend to maximize in winter, although the seasonal variation is often within 20% (Zhang et al., 2009a). Soil and lightning emissions exhibit summer maxima with very low values in winter. Biomass burning emissions of NO_x are negligible over China (Lin, 2012). In addition, the lifetime of NO_x in winter is several times longer than in summer. Therefore the NO_2 VCDs are the lowest in summer and the highest in winter over the areas dominated by anthropogenic sources, while the opposite seasonality occurs over the regions dominated by natural emissions (Lin,

⁷

2012). Furthermore, lightning and soil emissions are mostly independent of direct anthropogenic influences for 2005-2013, albeit with certain effects from changes in climate and/or land use. There is no evidence that these natural emissions underwent significant trends from 2005 to 2013. By comparison, anthropogenic emissions have exhibited dramatic changes along with the rapid socioeconomic development, and these changes have affected the seasonality of NO₂.

7 Figure 2(a) shows the seasonal variation in OMI NO₂ VCDs, averaged over 2005-2013, for each 0.25 ° x 0.25 ° grid cell in Western China; all grid cells are sorted according to 8 their 9-year mean NO₂ values. Once a grid cell is ordered, its monthly NO₂ values are 9 averaged over 2005-2013 to obtain a 9-year mean monthly climatological dataset with 10 12 values. Finally, the monthly climatological values are converted to their reverse 11 ranks (from 1 to 12), for improved illustration across all grid cells. Figure 2(a) shows 12 that for grid cells with 9-year mean NO₂ VCDs below 1.0 x 10¹⁵ molecules cm⁻², NO₂ 13 generally experiences summer maxima and winter minima, reflecting the dominance of 14 natural sources. In contrast, grid cells with 9-year mean NO₂ VCDs above 1.0×10^{15} 15 molecules cm⁻² exhibit winter maxima, due to the dominance of anthropogenic 16 emissions as well as a longer lifetime. van der A et al. (2006) also found that over 1996-17 2005, polluted Eastern China experienced NO₂ maxima in winter due to large 18 anthropogenic emissions while much cleaner western China experienced summer 19 20 maxima due to natural sources. Similar results were shown by Lin (2012) who compared polluted and cleaner regions in Eastern China in 2006. 21

Figure 2(b) further shows the standard deviation (STD) of monthly OMI NO₂ VCDs 22 year by year for each 0.25 °x 0.25 °grid cell in Western China; again, all grid cells are 23 sorted according to their 9-year mean NO₂ values. Once a grid cell is ordered, the STD 24 25 is calculated for each year to obtain a dataset with nine values over 2005-2013. Finally, the STD values are converted to their reverse ranks (from 1 to 9), for better illustration 26 across all grid cells. Figure 2(b) shows that grid cells with 9-year mean NO₂ VCDs 27 above 1.0 x 10^{15} molecules cm⁻² exhibit a large growth in STD especially since 2009, 28 as a result of large growth in anthropogenic emissions that amplified the seasonality. 29

- 1 By comparison, grid cells with 9-year mean NO₂ VCDs below 1.0×10^{15} molecules cm⁻
- 2 did not experience such significant changes in STD between 2005 and 2013.

Based on the above seasonality analysis, we determined the regions dominated by anthropogenic emissions as those with 2005-2013 mean NO₂ VCDs exceeding 1.0 x 10^{15} molecules cm⁻².

6 **3.2** Removing contributions from natural sources

To obtain the sole anthropogenic NO₂, we further subtracted all NO₂ VCDs by certain
"background" values representing the natural influences. Removing the "background"
influences is meaningful for Western China where the NO₂ VCDs are currently not at
an extremely high level (see Sect. 4.2.1).

We identified six "background" areas that are away from cities and are supposed to be 11 dominated by natural emissions (see the hatched areas in Fig. 1), and we assumed NO₂ 12 VCDs there are all natural. Russell et al. (2012) used the same method to identify 13 "background" NO₂ over the United States. When calculating the trends of NO₂ in the 14 15 grid cells of the chosen human-dominant areas, we subtracted NO₂ VCDs at these grid cells by the NO₂ value averaged over the nearest "background" region. For all grid cells 16 in a given province, the corresponding background region is the same and is indicated 17 in Table 1. The background subtraction was done on a monthly basis to account for 18 19 natural variability. We processed the model NO₂ data with the same method.

Figure 1 shows that the "background" regions in Western China are normally the uninhabited areas. Over there, the NO₂ VCDs are only about $0.4 - 0.5 \times 10^{15}$ molecules cm⁻² in 2005 (with little interannual variability), lower than NO₂ in the polluted areas by a factor of 2 - 5 (Table 1). For Eastern China (Table 1), the "background" values are higher ($0.7 - 1.2 \times 10^{15}$ molecules cm⁻² in 2005); whereas these values are 6–13 times lower than the NO₂ VCDs over the three polluted eastern regions (BTH, YRD and PRD).

Note that the chosen "background" values may not fully represent the actual natural contributions to the targeted human-dominant areas. For example, soil emissions may vary in space due to differences in temperature, radiation, land cover and land use type,

and other climatic factors. Lightning emissions of NOx may have spatial dependence 1 as well. The "background" regions may not be totally free from anthropogenic 2 influences, as a certain amount of NO_x in the polluted areas may be oxidized to produce 3 peroxyacyl nitrates (PANs), which can be transported to "background" areas and 4 converted back to NO_x. For these reasons, our choice of background values is relatively 5 6 rough. Nevertheless, unless the actual natural contributions differ substantially from the chosen values, which we do not expect to occur on a provincial average, the resulting 7 8 effect on our trend calculations should be small, because the chosen background values 9 are smaller than NO₂ over their corresponding polluted areas by a factor of 2–13 (Table 1). Future work is needed to fully separate the anthropogenic from natural NO_2 for 10 individual locations. 11

12 **3.3** Wavelet decomposition analysis

Due in part to the short lifetime of NO_x , the tropospheric NO_2 VCDs respond quickly to emission changes at various temporal scales, from a general growth along with socioeconomic development to short-term perturbations such as the Chinese New Year holidays and the economic recession (Lin and McElroy, 2011;Lin et al., 2013). Also, uncertainties and sampling biases in the satellite data may introduce additional noises in the NO₂ monthly time series. If not separated, these short-term variability and noises may affect linear trend calculations.

Here we conducted discrete wavelet transform (DWT) (Daubechies, 1992;Partal and 20 K üçük, 2006) to distinguish temporal variability of NO₂ at multiple scales. The wavelet 21 22 transform is a useful tool for diagnosing the multi-scale and non-stationary processes 23 over finite space and time periods, with the advantage of localization in the time and 24 frequency domain (Echer, 2004; Percival and Walden, 2006), suitable for our analysis of NO₂ trends and variability. Different from the approaches adopted by previous NO₂ 25 studies (e.g., (van der A et al., 2006)), our wavelet analysis does not require prior 26 27 assumptions about seasonality and other temporal scales. As shown in Sect. 3.1, the magnitude of NO₂ seasonality is correlated to the amount of annual mean NO₂ and 28 anthropogenic sources, and this information is captured by the wavelet analysis here. 29

The multi-scale analysis in DWT is able to decompose a time series f(t) into n-scale 1 components (n is the decomposition level): 2

$$3 \quad f(t) = \sum_{i=1}^{n} D_i + A_n \tag{1}$$

where D_i is a detail signal (high frequency) at level *i* and A_n is the approximation signal 4 (low frequency) at the set of maximum level n. The detail and approximation signals 5 were generated based on the convolution of time series of wavelet functions and scaling 6 7 functions. We chose Meyer orthogonal discrete wavelets as the wavelet functions which have been used to study ozone column, NDVI and land-cover changes (Abry, 8 9 1997; Echer, 2004; Freitas and Shimabukuro, 2008; Mart nez and Gilabert, 2009). Specifically, the approximation and detail signals were derived through an iterative 10 multi-layer decomposition process. In the first layer of decomposition, $f(t) = A_1 + A_2$ 11 D_1 . Then, $A_1 = A_2 + D_2$ and $f(t) = A_2 + D_2 + D_1$. And so on. The iteration stops at 12 level n = 5 for all provinces. At level 5, the period of the A5 time series is longer than 13 the length of the dataset (116 months). This criterion is typically used in investigating 14 15 the long-term trend of a time series (Echer, 2004; Chen et al., 2014). As an example, Fig. 3 presents the wavelet transform result for one grid cell (34.5 N, 108.9 E) in Xi'an City, 16 Shaanxi Province. 17

18 As a result, the approximation signal A5 represents the long-term trend of the original NO₂ time series (with a period longer than the length of the dataset). Although similar 19 to the 12-month moving average time series, the A5 time series is much smoother with 20 21 no short-term variability (see the example in Fig. 3). The detail components D1-D5 22 indicate higher-frequency variations, which are not analyzed in this study.

23 4 **Results and analysis**

4.1 Spatial patterns of tropospheric NO₂ VCDs over China, prior to removing 24 "background" influences 25

Figure 4 shows the spatial distributions of annual average OMI NO₂ VCDs over China 26 27 in 2005, 2012 and 2013. Here the "background" values have not been subtracted. The NO₂ VCDs exceed a high value of 6 x 10^{15} molecules cm⁻² in many areas of Central-28

East China and parts of Western China. Chengdu-Chongqing, Urumqi and Shaanxi-1 Guanzhong city clusters are well-known pollution "hot spots" of Western China (see 2 Fig.1 for region definitions). These "hot spots" have intensified since 2005, as well as 3 other polluted western areas including Gansu-Ningxia and Inner Mongolia industrial 4 city clusters. The annual and regional average NO₂ VCDs over Western China has 5 increased by 51% between 2005 and 2013, higher than the increase at 41% in Central-6 East China. The large growth of NO₂ over Western China highlights the necessity of 7 8 understanding potential human influences in these regions.

9 Figure 4 also compares the OMI derived and GEOS-Chem modeled annual average NO₂ VCDs in 2005 and 2012. OMI and model NO₂ share similar spatial and temporal 10 patterns. Linear regression for model NO₂ as a function of OMI NO₂ reveals that for 11 12 any given year, model NO₂ are highly correlated with OMI values in space. Table 2 shows that for the whole China in 2008, the magnitudes of model NO₂ are close to OMI 13 NO₂ (slope = 1.09, $R^2 = 0.88$). For other years, the slopes are larger (1.11–1.26), 14 indicating positive model biases, while the R^2 ranges from 0.86 to 0.90. The scatterplot 15 16 in Fig. 4 further confirms the model-OMI consistency in 2012. Similar results are found for Western China, although the R^2 is smaller, at 0.68–0.76 over 2005–2012. The model 17 biases in years other than 2008 reflect the nonlinear relation between changes in NO_x 18 emissions and changes in NO₂ VCDs (Martin et al., 2003; Valin et al., 2011; Lin, 2012) 19 20 that we did not account for when linearly scaling model emissions from MEIC 2008 to other years based on the interannual variation in OMI NO₂. 21

4.2 Trends of anthropogenic NO₂ over Western China, after removing "background" influences

24 **4.2.1 NO₂ trends**

Figure 5 shows OMI and modeled NO₂ trends at individual grid cells over Western China, by applying a linear regression to the approximation signal *A5* from the wavelet decomposition. All trend values are normalized relative to the 2005 mean NO₂ VCDs. All the NO₂ data have been subtracted by its respective "background" values prior to

the wavelet analysis. Results are only shown for grid cells with 2005-2013 average NO₂ 1 VCDs exceeding 1.0×10^{15} molecules cm⁻² and with statistically significant trends (*P*-2 value < 0.05 according to an *F*-test). Note that the growth rates without subtracting 3 "background" values are smaller than the rates with "background" values subtracted by 4 0.5-2.9%/yr (1.5%/yr on average) over the northwestern provinces and 0.1-1.0%/yr5 (0.7%/yr on average) over the southwestern provinces. In addition, the A5-based trends 6 here are similar to the linear trends calculated based on the original NO₂ time series 7 8 (not shown). However, as the wavelet transform removes small-scale variability and noises, we believe the A5-based trends are more robust in general. 9

Figure 5(a) shows that OMI NO₂ grew at most grid cells from 2005 to 2013, with a regional average annual growth at 8.6 \pm 0.9 % yr⁻¹. NO₂ grew the fastest over the city clusters, reflecting rapid economic development, urbanization, and population growth. Parts of Chengdu-Chongqing, Shaanxi-Guanzhong and Urumqi city clusters experienced NO₂ growth of 15 % yr⁻¹ or more. Most grid cells in yellow color are suburban or rural areas, but they also underwent rapid NO₂ growth since 2005 (6 -10 % yr⁻¹).

Table 1 shows the trends of OMI NO₂ VCDs from 2005 to 2013, as a percentage of mean values in 2005, on a provincial basis. NO₂ grew the fastest over Xinjiang, Ningxia and Qinghai with a growth rate at 15.1%, 12.3% and 11.2% per year, respectively. The growth rates in Northwestern China $(7.5 - 15.1 \% \text{ yr}^{-1})$ were much greater than the rates in Southwestern China $(4.0 - 7.8 \% \text{ yr}^{-1})$, primarily as a result of the regional differences in socioeconomic development (see Sect. 5.2).

A comparison of Fig. 5(b) and 5(c) shows that GEOS-Chem generally captures the OMI NO₂ trends from 2005 to 2012, suggesting that anthropogenic emissions are the main driver of the observed NO₂ trend. OMI data exhibit stronger growth than modeled data over North Xinjiang, East and South Inner Mongolia, South Sichuan, East Guizhou and South Guangxi, whereas the OMI trends are weaker than the modeled trends over most other regions. The differences between modeled and OMI NO₂ reflect the strong but nonlinear relation between NO_x emissions and NO₂ VCDs.

To further confirm that anthropogenic emissions are the main driver of the observed 1 NO₂ trends, we conducted an additional model simulation for 2012 where 2 anthropogenic emissions are fixed at the 2005 levels (while natural emissions and 3 meteorology correspond to the 2012 levels). We contrasted the model NO_2 change from 4 2005 to 2012 in this case to the standard case that has included year-specific 5 anthropogenic emissions. Table 3 shows that inclusion of anthropogenic emission 6 changes from 2005 to 2012 leads to large changes in model NO₂, and keeping 7 8 anthropogenic emissions unchanged leads to much reduced changes in NO₂. The NO₂ growth reduces from 85.8% to 6.9% averaged over the northwestern provinces and 9 from 46.8% to -6.3% over Southwestern China. 10

11 **4.2.2 NO₂ time series**

Figure 6 further shows the A5 monthly time series for individual provinces as a result 12 of wavelet analyses on OMI NO₂. All values are normalized with respect to 2005. In 13 particular, the OMI 1 time series (black line) results from a wavelet analysis on OMI 14 15 NO₂ over Oct 2004 – May 2014. OMI_1 shows that NO₂ grew rapidly between 2007 and 2011 over all provinces. For Xinjiang, Qinghai and Yunnan, OMI NO2 increased 16 continuously from 2005 to 2013. Over other provinces, OMI NO₂ peaked around 2011-17 2012 and then stagnated or even slightly declined thereafter. These stagnation or 18 reduction patterns likely reflect recent effective emission control policies (see Sect. 5.1). 19 Figure 6 also compares the A5 time series for OMI NO₂ (OMI_2, green line) and model 20 21 NO₂ (GC_AK, red line) derived from wavelet analyses on the same period from Jan 22 2005 to Apr 2013. Model results were sampled coincidently with OMI data and were applied with the AK. OMI_2 and GC_AK do not show a stagnation/reduction feature 23 as obvious as OMI_1 after 2011, because of a shorter time series for wavelet 24 decomposition. OMI_2 and GC_AK exhibit similar increasing trends and variability in 25 most western provinces, consistent with the finding in Sect. 4.2.1 that variations in 26 27 anthropogenic emissions (accounted for in the model) were the main driver of NO₂

28 changes.

Our trend analyses may be affected by missing OMI data and the corresponding temporal interpolation procedure. To evaluate the effects, we compared two additional datasets based on model results: GC_NAK1 (blue line in Fig. 6) represents model NO₂ on all days without applying the AK, and GC_NAK2 (orange line) represents model NO₂ sampled from days with valid OMI data but without applying the AK. Figure 6 shows almost no differences between GC_NAK1 and GC_NAK2 for all provinces. Therefore, the missing data have little influence on our trend analyses.

8 4.3 Comparison between satellite observations and bottom-up anthropogenic 9 emission estimates

Figure 7 shows Chinese official bottom-up provincial anthropogenic emission 10 inventory for 2007 and 2010-2013, together with the provincial emission targets for 11 2015 (as a goal of the 12th Five-Year Plan) (The State Council of the People's Republic 12 of China, 2011a). Provincial mean OMI NO₂ VCDs are also shown for comparison. 13 Both emission and VCD datasets were normalized to their 2007 mean values to remove 14 15 the effect of regional dependence in the relation between NO_x emissions and NO₂ VCDs. Ningxia, Xinjiang and Inner Mongolia had the largest increases in NO_x emissions from 16 2007 to 2010, consistent with their growth of NO₂ VCDs. NO_x emissions in most 17 provinces grew significantly from 2007 to 2010 and peaked in 2011-2012, also in 18 general consistency with the trends in OMI NO₂. On the other hand, the emission 19 inventory suggests a reduction since 2011 for Xinjiang and Yunnan, inconsistent with 20 the notable growth in NO₂ VCDs. This likely suggests an underestimate in the official 21 emission inventory. 22

Relating pollution changes to socioeconomic development and environmental policies

25 5.1 General discussion on NO₂ trends over Western China

As described in Sect. 4, the tropospheric NO₂ VCDs over Western China have grown notably since 2005. The growth occurred not only over cities but also over many suburban and rural regions, indicating an expansion of human influences from urban to remote areas. This scale of pollution growth was associated with the rapid urbanization and industrialization over Western China following the "Go West" movement. Table 4 shows that the urban population (i.e., the percentage of total population living in urban areas) increased by 10% or more from 2005 to 2013 in all provinces of Western China except Xinjiang. Over the same period, Western China experienced steep economic growth with industrial GDP growth rates of 12.4 – 20.3 % yr⁻¹ across the provinces.

On the other hand, the NO₂ VCDs declined or stabilized since 2011 in many provinces 7 (see Fig. 6), partly reflecting some improvements in environmental strategies. China's 8 air pollution control strategy has been transformed from a traditional end-of-pipe 9 control strategy (i.e., only using low NO_x combustion technologies in some power 10 11 plants) into a combined energy saving and emission reduction strategy after 2006 (Gu et al., 2013;Zhao et al., 2013). In particular, total NO_x emissions have become a major 12 target of national pollution control in the 12th Five-Year Plan (2011-2015), with a legally 13 binding goal to reduce the national emissions by nearly 10% in 2015 compared to 2010 14 (The State Council of the People's Republic of China, 2011b). Furthermore, Chinese 15 central government has also decided to consider the effectiveness of this reduction in 16 evaluating local governments' performance (The State Council of the People's Republic 17 of China, 2012). In aspect of energy saving measures, great efforts have also been made 18 to improve energy efficiency, to slow down growth of energy demand, and to adjust 19 20 structure in various sectors (power plants, transportation, industries, and residential use) over the past few years (Wang and Hao, 2012; Zhao et al., 2013). 21

22 5.2 On the contrast between Northwestern and Southwestern China

Northwestern China (Inner Mongolia, Xinjiang, Qinghai, Gansu and Shaanxi) has an average NO₂ growth rate at $11.3 \pm 1.0 \%$ yr⁻¹ from 2005 to 2013, about twice the average growth rate ($5.9 \pm 0.6 \%$ yr⁻¹) in Southwestern China (Sichuan, Chongqing, Guizhou, Guangxi and Yunnan). The contrast in NO₂ growth rate between Northwest and Southwest reflects their distinctive states of socioeconomic development. According to the nationwide pollution census, Northwestern China generates much more NO_x emissions per unit of GDP (11.94 tonnes/billion RMB in 2007) than the Southwest (6.98

tonnes/billion RMB) (The first nationwide pollution census committee, 2011). The 1 difference in pollution intensities also reflects their dissimilar economic structures. In 2 particular, Northwestern China has recently become an important energy producer (due 3 to the "West to East Power Transmission" project) and a heavy industry base (in terms 4 of mining, fossil fuels and raw materials)(Chen et al., 2010;Deng and Bai, 2014), and 5 these industries are often associated with significant NO_x emissions. The electricity 6 consumption of heavy industries in Northwestern China grew by 152.5% from 2005 to 7 8 2011, greater than the growth at 99.6% in Southwestern China.

9 About 70% of China's industrial and residential energy consumption is supplied by coal burning in 2009 (Li and Leung, 2012), and the value has not changed drastically in later 10 years. Figure 8 shows that Northwestern China has consumed more coal than the 11 Southwest since 2005, and by 2012 their difference has increased by a factor of 35 12 (from merely 9.03 million tonnes in 2005 to as large as 318.3 million tonnes in 2012). 13 For the Northwest, there is an extremely high correlation between NO₂ VCDs and coal 14 use across the years ($R^2 = 0.95$, *P*-value < 0.05), compared to a correlation at 0.84 (*P*-15 value < 0.05) for the Southwest. 16

Furthermore, the annual amount of electricity generated by coal-fired power plants in 17 Northwestern China increased by 237%, from 226.3 billion kWh in 2005 to 763.1 18 billion kWh in 2013; the annual growth rates are 9.8-22.8 % yr⁻¹ for individual 19 provinces (see Table 4). The growth was much smaller in the Southwest, about 110% 20 from 165.6 to 347.9 billion kWh, translated to growth rates of 6.0-14.9 % yr⁻¹ for 21 individual provinces. This difference was partly due to the stronger growth in 22 hydropower production in the Southwest (from 147.2 to 471.6 billion kWh over 2005-23 2013, at the rates of 8.9-21.6 % yr⁻¹ in individual provinces) than the growth in the 24 Northwest (from 40.0 to 107.3 billion kWh, 4.7-18.4 % yr⁻¹). 25

Transportation plays a more important role in NO_x pollution over the Southwest, compared to the Northwest. Table 4 shows that transportation contributes to much larger fractions of NO_x emissions in the capital cities of Southwestern China than in the Northwestern capital cities except Xi'an, Shaanxi. In addition, the number of vehicles

1 grew faster in the Southwestern capital cities during 2005–2012.

2 5.3 On the contrast between Western and Eastern China

The average NO₂ growth rate was 8.6 \pm 0.9% yr⁻¹ for Western China, much larger than 3 the rates in the three key eastern regions BTH (5.3 $\pm 0.8\%$ yr⁻¹), YRD (4.0 $\pm 0.6\%$ yr⁻¹) 4 and PRD (-3.3 $\pm 0.3\%$ yr⁻¹) (see Table 1). This regional contrast reflects both their 5 economic activities and the emission control policies adopted by the Chinese central 6 7 and local governments. In particular, China's development strategy for its western provinces might have led to unintended westward pollution migration, as many 8 resource- and pollution-intensive industries gradually moved from the East to the West 9 after 2000. Table 4 shows that from 2005 to 2013, the average industrial GDP growth 10 rate in Western China was 17.2% yr⁻¹ (relative to 2005), higher than the rates in the 11 three key eastern regions (13.2% yr⁻¹ in BTH, 11.6% yr⁻¹ in YRD and 12.0% yr⁻¹ in 12 PRD). The fast economic and pollution growth in Western China in part reflects its 13 growing production to support consumption in other regions (Lin et al., 2014a;Zhao et 14 15 al., 2015). According to (Zhao et al., 2015), NO_x emissions over Western China in 2007 were largely attributable to the economic production to supply Eastern China and 16 foreign countries, with 366 Gg related to interprovincial trade and 49.1 Gg related to 17 international trade. Together with atmospheric transport, trade has become a critical 18 mechanism for transboundary pollution transfer at both the global and regional scales 19 (Lin et al., 2014a), with significant consequences on public health (Jiang et al., 2015). 20

The west-east contrast in NO₂ growth also reflected their different pollution control 21 strategies and measures. Although China has a national NO_x emission reduction target 22 23 at 10% (from 2010 to 2015), the targets are set differently for individual provinces. Table 1 shows that the targets were higher, at 13.9%, 17.7% and 16.9%, for the three 24 key eastern regions (BTH, YRD, and PRD), but they are as low as 5.7% averaged over 25 26 Western China (The State Council of the People's Republic of China, 2011a). In particular, an emission increase by 15% is allowed for Qinghai Province. In addition, 27 28 although NO_x emission reduction measures have been taken in power plants and some other industrial sectors since 2006 (via de-nitrification systems that involve selective 29

catalytic or non-catalytic reduction), by 2010 as much as 57% of these systems were
installed in the three key eastern regions (Zhao et al., 2013). The capacity of small
power generators being shut-down in Western China was about 10808 MW (excluding
small diesel generators), only accounting for about 19% of the capacity of total shutdown small power plants in China (55630MW) during the 11th Five-Year Plan period
(2006-2010) (NDRC, 2009-2011;Xu et al., 2013).

7 Furthermore, the vehicle emission control has also been implemented much more stringently in the East than in the West (Li and Leung, 2012). Although large amounts 8 of "Yellow-Label Vehicles" (YLVs, highly-emitting vehicles that fail to meet the 9 National I emission standard) have been banned from entering into big cites in Eastern 10 11 China, over the recent years a considerable number of used YLVs have been brought to the West that has much weaker restrictions on YLVs (Qi, 2010). Greater efforts to 12 reduce NO_x pollution in Western China, with lessons learnt from the East, will help to 13 achieve its sustainable development. 14

15 6 Conclusion

This study investigates the spatiotemporal variations of tropospheric NO₂ VCDs over 16 Western China during 2005-2013, by using a wavelet decomposition analysis to 17 distinguish long-term trends and other scales of temporal variability. We focus on the 18 anthropogenic NO₂ by subtracting region-specific "background" values dominated by 19 natural sources. We find that the anthropogenic NO₂ grew rapidly over Western China 20 at a regional average rate of 8.6 $\pm 0.9\%$ yr⁻¹ from 2005 to 2013. Under the competing 21 influences of economic growth and emission control, NO2 levels in most western 22 23 provinces increased from 2005 to 2011 and stabilized or slightly declined afterwards. GEOS-Chem model simulations and the official emission statistics are used to confirm 24 that the OMI observed NO₂ trends were driven mainly by changes in anthropogenic 25 emissions. 26

Between 2005 and 2013, Northwestern China experienced much larger NO₂ growth (11.3 \pm 1.0% yr⁻¹) than Southwestern China (5.9 \pm 0.6% yr⁻¹) and the three traditional

key regions of Eastern China (BTH, YRD and PRD, (-3.3)–(+5.3) % yr⁻¹). The rapid NO₂ growth in Northwestern China was possibly attributed to the fast developing resource- and pollution-intensive industries along with the "Go West" movement as well as relatively weak emission controls. Rapid industrialization and urbanization in Western China should be accompanied with more stringent pollution control to achieve sustainable development.

7 Acknowledgements

8 This research is supported by the National Natural Science Foundation of China, grant

9 41175127 and 41422502, and by the 973 program, grant 2014CB441303. We

acknowledge the free use of DOMINO v2 NO_2 product from www.temis.nl.

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- 28

_	Region	Average NO ₂ in	NO_2	NO _x emission
		2005 ^a	trend ^b	reduction plan of
		10 ¹⁵ molecules cm ⁻²	(% yr ⁻¹)	2015 (%) ^c
Northwest	Gansu	0.9 (0.4, I)	$7.5\ \pm 1.2$	3.1
	Inner Mongolia	1.1 (0.4, I)	$10.2~{\pm}1.3$	5.8
	Ningxia	1.4 (0.4, I)	$12.3~\pm1.7$	4.9
	Qinghai	1.0 (0.5, II)	$11.2~{\pm}1.2$	-15.3
	Shaanxi	2.3 (0.5, II)	$10.5\ \pm 1.0$	9.9
	Xinjiang	1.0 (0.5, II)	$15.1~{\pm}2.0$	0
Southwest	Chongqing	2.2 (0.5, III)	7.8 ± 0.9	6.9
	Guangxi	1.2 (0.5, III)	$4.0~{\pm}0.5$	8.8
	Guizhou	1.3 (0.5, III)	6.9 ± 1.0	9.8
	Sichuan	1.7 (0.5, III)	$6.1~\pm0.7$	6.9
	Yunnan	0.7 (0.5, III)	$4.2~{\pm}0.3$	5.8
Region	West	1.3 (0.5, II)	8.6 ± 0.9	5.7
	Northwest	1.2 (0.5, II)	$11.3~{\pm}1.0$	4.5
	Southwest	1.4 (0.5, III)	5.9 ± 0.6	7.6
	BTH	9.2 (0.7, IV)	$5.3\ \pm 0.8$	13.9
	YRD	7.2 (1.2, V)	$4.1~{\pm}0.6$	17.7
	PRD	8.0 (1.2, VI)	-3.3 ± 0.3	16.9

Table 1. Regional trends of OMI NO_2 VCDs over 2005-2013 and NO_x emission reduction plan of 2015.

a. All the provincial NO_2 data have been subtracted by its respective "background" values. The "background" values and regions are indicated in the parentheses.

b. NO₂ trends are derived from the *A5* time series. All trend values are relative to 2005 and are statistically significant.

c. NO_x reduction represents the proposed emissions in 2015 relative to 2010. The value for PRD refers to the proposed target for Guangdong Province. Qinghai Province is allowed to emit more NO_x in 2015 compared to 2010.

Year	2005	2006	2007	2008	2009	2010	2011	2012
China								
Slope	1.11	1.18	1.19	1.09	1.15	1.17	1.26	1.22
Intercept	0.26	0.33	0.36	0.32	0.27	0.32	0.31	0.21
\mathbb{R}^2	0.88	0.86	0.89	0.88	0.88	0.89	0.90	0.89
Western China								
Slope	1.17	1.16	1.22	1.08	1.19	1.18	1.23	1.26
Intercept	-0.05	0.07	0.01	0.03	-0.08	-0.01	0.00	-0.13
\mathbb{R}^2	0.70	0.68	0.71	0.72	0.74	0.76	0.76	0.75

Table 2. Linear regression for GEOS-Chem modeled annual mean NO_2 VCDs as a function of OMI values over China and Western China.

	Region	With changes in	Without changes in		
		anthropogenic emissions	anthropogenic emissions		
Northwest	Gansu	70.9	-8.4		
	Inner-Mongolia	129.3	21.9		
	Ningxia	94.9	-1.2		
	Qinghai	102.2	12.6		
	Shaanxi	81.6	-6.6		
	Xinjiang	51.8	1.5		
Southwest	Chongqing	54.1	-2.7		
	Guangxi	27.0	-16.6		
	Guizhou	71.1	3.2		
	Sichuan	52.2	-5.1		
	Yunnan	9.4	-10.7		
Region	West	70.4	1.6		
	Northwest	85.8	6.9		
	Southwest	46.8	-6.3		
	BTH	62.5	1.9		
	YRD	40.4	3.2		
	PRD	-30.4	-0.6		

Table 3. Percentage changes in modeled NO₂ from 2005 to 2012.

Region	Provincial-level	Urban	Urban	Industrial GDP	Thermal power	Hydropower	Capital	Increase in vehicle	Percentage of
	regions	population	population	annual growth rate	generation annual	generation annual	cities ^a	ownership between	transportation to
		in 2005	in 2013	for 2005-2013 (%	growth rate for	growth rate for		2005 and 2012	total NO _x
		(% of total)	(% of total)	yr-1)	2005-2013 (% yr-1)	2005-2013 (% yr-1)		(million vehicles)	emissions (%)
Northwest	Gansu	30.0	40.1	13.8	9.8	9.9	Lanzhou	-	21.1
	Inner Mongolia	47.2	58.7	20.3	16.9	15.0	Hohhot	0.41	17.5
	Ningxia	42.3	52.0	15.0	17.9	7.2	Yinchuan	0.18	21.3
	Qinghai	39.3	48.5	16.0	12.0	13.2	Xining	0.03	27
	Shaanxi	37.2	51.3	17.0	14.0	4.7	Xi'an	1.09	56.6
	Xinjiang	37.2	44.5	12.4	22.8	18.4	Urumqi	0.37	25.7
Southwest	Chongqing	45.2	58.3	19.4	11.2	14.5	Chongqing	2.79	40.9
	Guangxi	33.6	44.8	17.4	14.9	11.2	Nanning	0.6	47.7
	Guizhou	26.9	37.8	14.0	9.9	8.9	Guiyang	0.44	26.4
	Sichuan	33.0	44.9	18.5	6.0	15.4	Chengdu	1.56	46.9
	Yunnan	29.5	40.5	14.6	7.0	21.6	Kunming	1.02	34.1

Table 4. Socioeconomic statistics for individual provinces and capital cities.

a. Vehicle data for Lanzhou are unavailable.

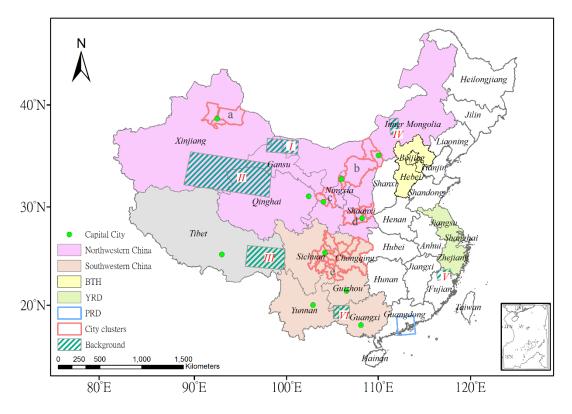


Figure 1. The study regions. Several city clusters are also identified: (a) Urumqi city cluster, (b) Inner Mongolia industrial city cluster, (c) Gansu-Ningxia, (d) Shaanxi-Guanzhong, and (e) Chengdu-Chongqing.

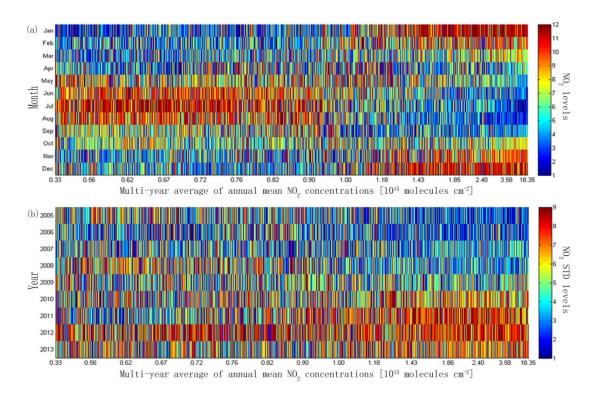


Figure 2. (a) 2005-2013 average seasonal variation of OMI NO₂ VCDs for each 0.25 ° x 0.25 ° grid cell of Western China; the grid cells are sorted by their 9-year average NO₂ VCDs. For each grid cell, the 9-year average monthly NO₂ values are converted to their reverse ranks (from 1 to 12; 1 represents the smallest NO₂ value). (b) Standard deviation (STD) of monthly OMI NO₂ VCDs in individual years over 2005 – 2013 for each 0.25 ° x 0.25 ° grid cell of Western China; the grid cells are sorted by their 9-year average NO₂ VCDs. For each grid cell, the seasonal STDs in the nine years are converted to their reverse ranks (from 1 to 9; 1 represents the smallest STD value).

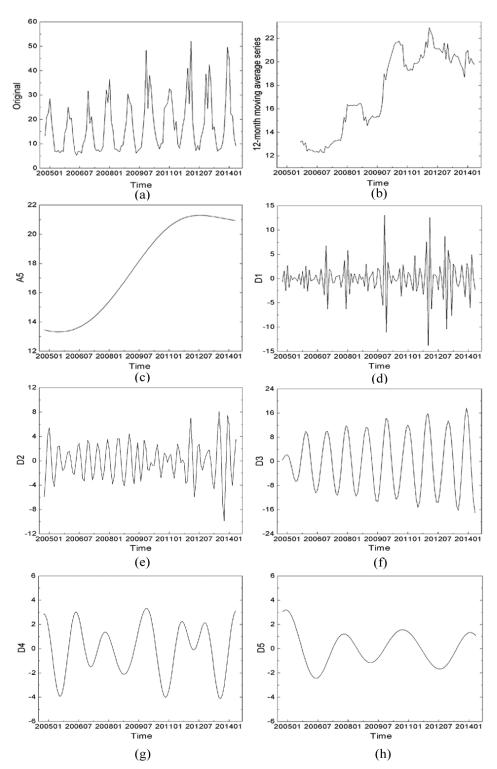


Figure 3. An example of the 5-level wavelet decomposition. (a) The original monthly time series of OMI NO₂ at a grid cell in Xi'an (34.5°N, 108.9°E), (b) The 12-month moving average time series, (c) The approximation signal A5 representing the long-term trend, (d)-(h) Five decomposition levels *D1-D5* indicating temporal variability at various scales.

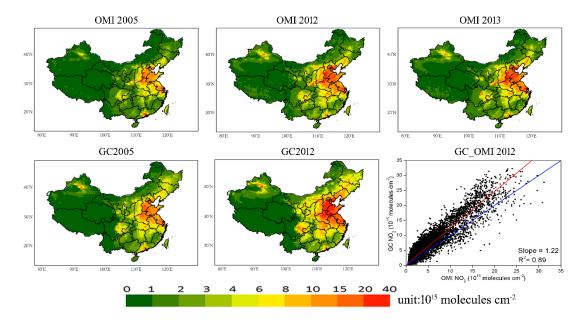


Figure 4. Annual mean OMI NO₂ VCDs over China in 2005, 2012 and 2013, annual mean GEOS-Chem NO₂ VCDs in 2005 and 2012, and a scatterplot with linear regression for model vs. OMI NO₂ in 2012. In the scatterplot, the red line represents a linear fit, and the blue line is the 1:1 line.

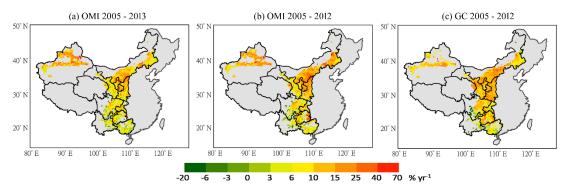


Figure 5. Percentage trends of annual mean OMI and Model NO₂ VCDs over Western China (relative to 2005), by applying a linear regression to the approximation signal *A5* from the wavelet decomposition. All the NO₂ data have been subtracted by their respective "background" values prior to the wavelet decomposition. Results are shown only for grid cells with 2005-2013 average NO₂ VCDs exceeding 1.0 x 10^{15} molecules cm⁻² and with statistically significant trends (*P*-value < 0.05 according to an *F*-test). (a) OMI NO₂ trends from 2005 to 2013, (b) OMI NO₂ trends from 2005 to 2012.

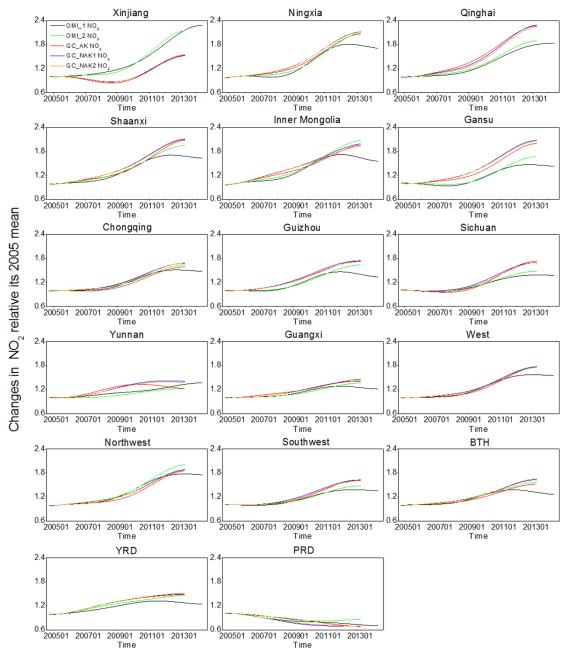


Figure 6. The long-term trends (i.e., the *A5* component out of the wavelet analysis) of OMI and modeled NO₂ in individual provinces and regions. The values are normalized to 2005. OMI_1 (black line) denotes the *A5* signal from a wavelet analysis of OMI NO₂ over Oct 2004 – May 2014, and OMI_2 (green line) corresponds to the wavelet analysis over Jan 2005 – Apr 2013. GC_AK (red line) corresponds to a wavelet analysis of coincident modeled values (applied with the AK) over Jan 2005 – Apr 2013. GC_NAK1 (blue line) represents the *A5* signal for modeled NO₂ on all days (without applying the AK) over Jan 2005 – Apr 2013, and GC_NAK2 (orange line) is similar to GC_NAK1 but with model results coincident with valid OMI data.

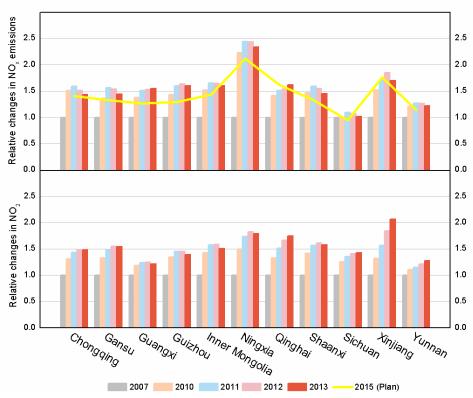


Figure 7. Relative Changes in OMI NO₂ VCDs and NO_x emissions in 2007 and 2010-2013 (relative to 2007). (Top) Chinese official provincial-level NO_x emission inventory for 2007 and 2010-2013 as well as its targeted emissions for 2015. (Bottom) Annual mean OMI NO₂ levels in 2007 and 2010-2013.

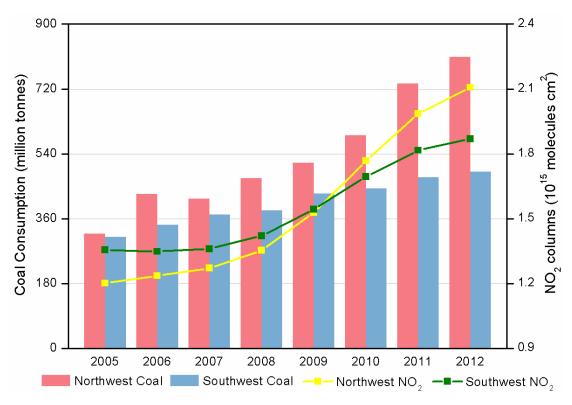


Figure 8. Coal consumption and annual mean OMI NO₂ levels over Western China.