



Evaluation of a
chemistry transport
model using a
regional OMI NO₂
retrieval

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Evaluation of a regional chemistry
transport model using a newly developed
regional OMI NO₂ retrieval

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Abstract

In this paper, we evaluate a high-resolution chemistry transport model (CTM) (3 km × 3 km spatial resolution) with the new Hong Kong (HK) NO₂ retrieval developed for the Ozone Monitoring Instrument (OMI) on-board the Aura satellite. The three-dimensional atmospheric chemistry was modelled in the Pearl River Delta (PRD) region in southern China by the Models-3 Community Multiscale Air Quality (CMAQ) modelling system from October 2006 to January 2007. In the HK NO₂ retrieval, tropospheric air mass factors (AMF) were recalculated using high-resolution ancillary parameters of surface reflectance, NO₂ profile shapes and aerosol profiles of which the latter two were taken from the CMAQ simulation. We also tested four different aerosol parametrizations. Ground level measurements by the PRD Regional Air Quality Monitoring (RAQM) network were used as additional independent measurements.

The HK NO₂ retrieval increases the NO₂ vertical column densities (VCD) by (+31 ± 38) %, when compared to NASA's standard product (SP2), and reduces the mean bias (MB) between satellite and ground measurements by 26 percentage points from -41 to -15 %. The correlation coefficient r is low for both satellite datasets ($r = 0.35$) due to the high spatial variability of NO₂ concentrations.

The correlation between CMAQ and the RAQM network is low ($r \approx 0.3$) and the model underestimates the NO₂ concentrations in the north-western model domain (Foshan and Guangzhou). We compared the CMAQ NO₂ time series of the two main plumes with our regional OMI NO₂ product. The model overestimates the NO₂ VCDs by about 15 % in Hong Kong and Shenzhen, while the correlation coefficient is satisfactory ($r = 0.56$). In Foshan and Guangzhou, the correlation is low ($r = 0.37$) and the model underestimates the VCDs strongly (MB = -40 %). In addition, we estimated that the OMI VCDs are also underestimated by about 10 to 20 % in Foshan and Guangzhou because of the influence of the model parameters on the AMF.

In this study, we demonstrate that the HK OMI NO₂ retrieval reduces the bias of the satellite measurements and thus the dataset can be used to study the magnitude of

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NO₂ concentrations in a regional model. The low bias **can be** achieved if AMFs are recalculated with more accurate surface reflectance, aerosol profiles and NO₂ profiles; **only NO₂ profiles have been replaced in earlier studies**. Since unbiased concentrations are important, for example, in air pollution studies, the results of this paper can be very helpful in future model evaluation studies.

1 Introduction

Nitrogen oxides (NO_x = NO + NO₂) play an important role in atmospheric chemistry. They have a vital role in the formation of photochemical smog (Haagen-Smit, 1952) and can damage crops and buildings **as a component of** acid rain (Driscoll et al., 2001). In an urban environment, NO₂ concentrations **have a high spatial and temporal variability due to its** short tropospheric life time and the variety of sources and sinks. The **spatial and temporal distribution can be** studied **with** chemistry transport models (CTM) and **satellite instruments**.

The first satellite instrument able to detect tropospheric NO₂ was the Global Ozone Monitoring Experiment (GOME) which was launched on board the second European Remote Sensing satellite (ERS-2) in 1995 (Burrows et al., 1999). Successor instruments to GOME (GOME-2) are payload on the MetOp satellites used for operational meteorology (Callies et al., 2000). In 2006, the Scanning Imaging Absorption Spectrometer for Atmospheric Cartography (**SCIMACHY**) was launched on board **ENVISAT (ENVIRONMENTAL SATellite)** (Bovensmann et al., 1999) and in 2004, the Ozone Monitoring Instrument (OMI) was launched on board the EOS (Earth Observation System) Aura (Levelt et al., 2006). Since the launch of GOME, the spatial resolution of the instruments increased rapidly. While GOME had a **smallest** ground pixel size of 40 km × 320 km, OMI has a ground pixel size of 13 km × 24 km. The higher spatial resolution makes OMI **feasible for** the study of **trace gases** in large metropolitan areas.

The two OMI NO₂ standard products are the NASA standard product (SP) (Bucsela et al., 2006, 2013) and the the **Dutch OMI NO₂** product (DOMINO) (Boersma et al.,

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2007, 2011) which are both available in their second version (SP2 and DOMINO-2). In this paper, we use the term “global” products for this two products because they provide global coverage. In contrast, “regional” products provide regional coverage. Examples of regional OMI NO₂ products are the Empa product for Europe (Boersma et al., 2007; Zhou et al., 2009, 2010) and the Berkeley High-Resolution (BEHR) product for North America (Russell et al., 2011). It should be noted that in literature the term “global” is often used as a synonym for “level 3” data that has had orbit-level data (“level 2”) combined onto a global grid. This terminology can be misleading, because “level 3” data can also be provided on a local or regional grid. For example, the grid can be the domain of a regional CTM. A second difference between regional and global products is the spatiotemporal resolution of the ancillary parameters used in their retrieval algorithms. Ancillary parameters are information about surface reflectance, NO₂ profile shapes, aerosols and clouds which are used to calculate air mass factors (AMF) which convert the retrieved slant column densities (SCD) to vertical column densities (VCD). In the first version of SP and DOMINO, the ancillary parameters were mainly monthly or annual averages with spatial resolutions between 50 and 300 km. In contrast, regional products use ancillary parameters with a higher spatial and temporal resolution. For example, Zhou et al. (2010) used surface reflectance with 1 km spatial resolution to improve the NO₂ retrieval in Europe and Russell et al. (2011) replaced the profile shapes from a global CTM with profiles from a regional CTM with a spatial resolution of 4 km. Thus, we use the terms “regional” and “global” for products which use ancillary parameters which have a spatial and temporal resolution typical for a regional or global CTM, respectively.

Russell et al. (2011) compared the BEHR product with the first version of the DOMINO and the NASA product and showed that the retrieved NO₂ VCDs are strongly impacted by terrain pressure ($\pm 20\%$), surface reflectance ($\pm 40\%$) and the NO₂ profile shape ($-75 \pm 10\%$). Lin et al. (2014) showed that different ancillary parameters can have a strong impact on the NO₂ VCDs. Furthermore, the global NO₂ products have been compared with regional CTMs. Since the OMI NO₂ VCDs depend on the NO₂

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profile shapes, the **global profile shapes** can and should be replaced with the profiles of the regional model (Eskes and Boersma, 2003; Boersma et al., 2005). The **global OMI NO₂ products** provide data for this update. Several studies evaluated regional CTMs with the **global NO₂ products using updated NO₂ profiles**. Herron-Thorpe et al. (2010) validated the regional air quality model AIRPACT-3 (12 km × 12 km spatial resolution) over the Pacific Northwest with the first versions of DOMINO and the NASA product. Their simulations correlate well with the monthly averaged satellite measurements for cloud free data ($r = 0.75$) as long as no wildfires are present in the model domain. Han et al. (2011) compared CMAQ simulation (30 km × 30 km) with the first DOMINO version over the Korean peninsula and found that simulated VCDs are about 50 % larger than satellite measurements. Zyrichidou et al. (2013) evaluated the Comprehensive Air Quality Model (CAMx) (10 km × 10 km) over Southeastern Europe with the second DOMINO version. They found good agreement between model and OMI VCDs ($r = 0.6$), but the model overestimated VCDs over urban areas.

In SP2 and DOMINO-2, the **spatial and temporal** resolutions of several ancillary parameters have been increased. For example, the products are using the OMI reflectance climatology (0.5° spatial resolution) and NO₂ profile shapes are corrected using a high-resolution topography (3 km). **Nevertheless, the global products still depend on a global CTM which have limited spatial resolution.** As a consequence, the **global products can be biased, if NO₂ VCDs are studied on regional scale.** 

In this study, we evaluate a regional CTM (3 km × 3 km spatial resolution) with a **regional OMI NO₂ retrieval**. For this purpose, we simulated three-dimensional atmospheric chemistry with the Models-3 Community Multiscale Air Quality (CMAQ) modelling system (Byun and Schere, 2006) in the Pearl River Delta (PRD) region in southern China from October 2006 to January 2007. **Furthermore, we developed a new regional NO₂ retrieval for the PRD region.** In the Hong Kong (HK) NO₂ retrieval, we recalculated tropospheric AMFs using high-resolution ancillary parameters which were taken mainly from the CMAQ simulation. Thus, the retrieval does not depend on **other models**. Cloud height and fraction were taken from the OMI cloud product (Acar-

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reta et al., 2004) and surface reflectance was calculated from the MODIS (Moderate-resolution Imaging Spectroradiometer) black-sky albedo (BSA) product (Wanner et al., 1997; Lucht et al., 2000). We tested different aerosol parametrizations for our new product. Aerosol extinction and absorption coefficients were computed from the model output. As additional and independent observations, ground level measurements were used from 16 stations of the PRD Regional Air Quality Monitoring (RAQM) network. To the best of our knowledge, this is the first study in which a regional OMI NO₂ product is compared with a regional CTM.

This paper is organised as follows: OMI and the retrieval of tropospheric NO₂ including the AMF calculations using the SCIATRAN radiative transfer model are described briefly in Sect. 2. The RAQM network, the CMAQ model run, the HK NO₂ retrieval are described in Sect. 3. The results are presented and discussed in Sect. 4. Finally, Sect. 5 contains further discussions and concludes this paper.

2 Background

2.1 Ozone Monitoring Instrument (OMI)

OMI is a nadir-viewing imaging spectrometer measuring Earth's reflectance spectra in the near-ultraviolet and visible wavelength range with two CCD (charge-coupled device) arrays. It was launched aboard NASA's EOS Aura satellite on 15 July 2004 (Levell et al., 2006). The instrument provides daily global coverage at an overpass time of 13:45 ± 15 min LT. Earth reflectance spectra are measured during the sunlit part of about 14.5 sun-synchronous orbits per day. Trace gases, such as ozone (O₃), sulfur dioxide (SO₂) and nitrogen dioxide (NO₂), are retrieved from the reflectance spectra as well as cloud and aerosol properties.

The measurement principle is an along-track (push-broom) scanner with a swath width of 2600 km which is divided in 60 pixels. The ground pixel size varies between 13 km × 24 km at nadir and 40 km × 160 km at the swath edge. The spatial sensitivity

within a ground pixel is nearly constant in across-track direction but decreases in along-track direction.

2.2 Retrieval of tropospheric NO₂ column densities

The standard product (SP2) (Bucsela et al., 2006, 2013) is the basis for the HK NO₂ retrieval. Therefore, we give a brief introduction to their algorithm. The SP2 retrieval algorithm has three major steps:

1. The total slant column densities S are obtained from the reflectance spectra using the differential optical absorption spectroscopy (DOAS) technique (Platt and Stutz, 2008).
2. The stratospheric slant column densities S_{strat} are subtracted from the total column S using a stratosphere–troposphere separation (STS) algorithm (Bucsela et al., 2013).
3. The tropospheric slant column densities S_{trop} are converted to vertical column density V_{trop} using a tropospheric air mass factors (AMF) A_{trop} (Palmer et al., 2001).

The AMF is defined as the ratio of slant and vertical column density (Solomon et al., 1987). Thus the tropospheric column density V_{trop} is calculated by

$$V_{\text{trop}} = \frac{S - S_{\text{strat}}}{A_{\text{trop}}} = \frac{S_{\text{trop}}}{A_{\text{trop}}}. \quad (1)$$

The tropospheric AMF depends on parameters such as sun position, satellite position, surface reflectance, atmospheric scattering properties due to air molecules, aerosols and clouds, and the NO₂ profile shape. It is related to the vertical sensitiv-

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ity of the satellite instrument and can be computed for N vertical layers by

$$A_{\text{trop}} = \frac{\sum_{k=1}^N \alpha_k m_k V_k}{\sum_{k=1}^N V_k} \quad (2)$$

with:

- α_k : an empirical temperature correction coefficient accounting for the temperature dependency of the NO_2 absorption cross section,
- m_k : the differential or box air mass factor which describes the instrument sensitivity for layer k ,
- V_k : the partial NO_2 VCD of layer k .

The correction coefficient α_k can be computed by the empirical formula

$$\alpha_k = 1 - 0.003 \text{ K}^{-1} (T_k - T_{\text{ref}}) \quad (3)$$

where T_k is the temperature in layer k and T_{ref} is reference temperature of the NO_2 absorption cross section ($T_{\text{ref}} = 220 \text{ K}$) (Bucsela et al., 2013).

The box air mass factors m_k can be computed with a radiative transfer model. The SP2 algorithm uses the TOMRAD radiative transfer model (Dave, 1965). The AMF formulation used in SP2 is based on a AMF formulation by Palmer et al. (2001). In partly cloudy scenes, SP2 computes the box AMFs using the independent pixel approximation (IPA). The approximation calculates AMFs as weighted sums of a cloudy m_k^{cloudy} and a clear m_k^{clear} component:

$$m_k = w \cdot m_k^{\text{cloudy}} + (1 - w) \cdot m_k^{\text{clear}}, \quad (4)$$

where w is the aerosol/cloud radiance fraction (CRF), that is the fraction of measured radiation that results from clouds and aerosols (Acarreta et al., 2004).

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The products $\alpha_k m_k$ are called scattering weights. They can be used to recalculate the AMF with different profile shapes which could be taken from a regional CTM.

In SP2, the partial VCD V_k are taken from the Global Modeling Initiative (GMI) CTM (Duncan et al., 2007; Strahan et al., 2007) which combines stratospheric chemistry described by Douglass et al. (2004) and tropospheric O₃-NO_x-hydrocarbon chemistry from the GEOS-Chem model (Bey et al., 2001). It should be noted that only the relative shape of the profile $n_k = V_k/V_{\text{trop}}$ is required for the AMF calculation.

Bucsela et al. (2013) estimated tropospheric NO₂ VCD uncertainties to be $1 \times 10^{15} \text{ cm}^{-2}$ for clear skies and up to $3 \times 10^{15} \text{ cm}^{-2}$ for large cloud radiance fractions. In polluted regions, the main uncertainties are **in** the DOAS fit (10 % relative error) and **in** the tropospheric AMFs (20–80 %).

2.3 SCIATRAN radiative transfer model

SCIATRAN is a one-dimensional RTM which can be used for the calculation of box AMFs (Rozanov et al., 2005). The model is designed as a forward model for the retrieval of atmospheric constituents from measurements of scattered light by satellite, ground or airborne instruments. The wavelength range goes from 175 to 2380 nm which includes the ultra violet, visible and near infra red part of the spectrum.

SCIATRAN solves the integro-differential radiative transfer equation using the discrete-ordinates method (DOM) in the plane-parallel or pseudo-spherical mode to calculate box AMF profiles. Box AMFs m_k are derived from weighting functions which describe the sensitivity of the reflectance spectrum R to a perturbation of a model parameter Δn in layer z_k . In SCIATRAN, weighting functions are computed by a quasi-analytic approach (Rozanov et al., 1998). If Δn is a perturbation of the NO₂ number density n_k , the box AMF m_k is the negative weighting function (Rozanov and Rozanov, 2010).

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3 Methodology

In this section, we describe the RAQM network, the regional CTM run and the HK NO₂ retrieval. Our study period is from October 2006 to January 2007. This period was chosen because cloud fractions in the PRD region are lowest in this season and OMI measurements in later years are affected by a row anomaly which reduces the number of valid measurements. Details about the row anomaly can be found on <http://www.knmi.nl/omi/research/product/rowanomaly-background.php>.

3.1 Ground network

3.1.1 Meteorological observations

Meteorological observations were used for the evaluation of the simulated meteorological fields which were used to drive the CTM. The data were measured by three automatic weather stations in Hong Kong. The stations are at the Hong Kong Observatory (HKO) headquarters, at the Hong Kong International Airport (HKIA) near Tung Chung and on Waglan Island (WGL). The locations of the stations are shown by square markers in Fig. 1. The Hong Kong Observatory is in the city centre of Kowloon and surrounded by high buildings. The airport is located on an artificial island to the north of mountainous Lantau Island. Waglan Island is a small island located to the east of Hong Kong Island. The island is too small to be resolved by the model grid. The WGL station is located 56 m a.s.l. and used as background station by the Hong Kong Observatory. The meteorological parameters are hourly measurements of temperature (T), humidity (q), sea surface pressure (p) and wind (v). Temperature and humidity are measured at 2 m above ground level (a.g.l.).

3.1.2 Pearl River Delta Regional Air Quality Monitoring Network

Ground-level NO₂ mixing ratios were provided by the RAQM network. The network was established by the governments of the Guangdong province and Hong Kong to monitor

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the air quality in the PRD region and has been in operation since 30 November 2005. It consists of sixteen automatic air quality monitoring stations (see Fig. 1, round markers). The network measures hourly NO₂, SO₂, O₃ and PM₁₀. The monitoring network was used to validate the NO₂ mixing ratios of the OMI NO₂ products and the CMAQ simulation. In the network, NO₂ was measured by chemiluminescence and DOAS technique with an accuracy and precision of about 10 % (GDEMC and HKEPD, 2006).

3.2 CMAQ model simulation

3.2.1 Model run

Three dimensional atmospheric chemistry was simulated in the PRD region for the study period. The simulations were performed with the CMAQ modelling system version 4.7.1 (Byun and Schere, 2006).

Three model domains were defined using a Lambert conformal conic projection (Fig. 1). The coarse domain (D1) covers East Asia with a spatial resolution of 27km × 27km. The nested domains have grid resolutions of 9km × 9km (D2) and 3km × 3km (D3), **receptively**.

Meteorological fields were provided by the Weather Research and Forecasting (WRF) modelling system (Skamarock et al., 2008) driven by NCEP Final Analysis (FNL) data (NCEP et. al., 1997). Horizontal advection was modelled **by** the mass-conserving YAMO scheme (Yamartino, 1993). **The default vertical advection scheme was replaced with the WRF omega calculation with the piecewise parabolic method. The new scheme is the default scheme in CMAQ version 5 and is assumed to provide better vertical profiles.** Accurate vertical profiles are important for satellite **measurements** of air pollutants.

The gas-phase chemistry was modelled **by** the Euler backward iterative solver optimized for the Carbon Bond-05 mechanism with chlorine (Yarwood et al., 2005). Aerosol chemistry was modelled **by** the fifth-generation CMAQ aerosol model (aero5) **and** the impact of clouds on deposition, mixing, photolysis, and aqueous chemistry was **de-**

scribed by the ACM cloud processor (Pleim and Chang, 1992). Three-dimensional extinction coefficients were computed by the empirical IMPROVE formula (Malm et al., 1994).

The emission inventory used in this simulation was compiled by Du (2008). The inventory combines monthly anthropogenic emission from INTEX-B (Zhang et al., 2009) with biogenic emissions from GEIA (Global Emissions Inventory Activity, Guenther et al., 1995), and biomass burning and ship emissions from TRACE-P (Streets et al., 2003). The INTEX-B emissions were updated with regional emissions for Hong Kong provide by the Hong Kong Environmental Protection Department (Du, 2008). The low-resolution emissions were spatially allocated to each grid cell based on geographic and socio-economic information as well as updated road network and land cover data. Furthermore, weekly and daily cycles were included to the emission inventory (Du, 2008).

3.2.2 Data processing

Model outputs are hourly ground level values and three-dimensional fields averaged from 13:00 to 15:00 LT (OMI overpass time).

In addition, at each ground stations, time series of hourly meteorological parameters and NO₂ mixing ratios were extracted from the model output. The surface pressure in the model was converted to sea level pressure using the simulated temperature. The wind vector in the model was taken at the height of the measurement stations to account for the elevation of the stations above averaged surface height.

Since OMI has a lower spatial resolution than CMAQ, the satellite instrument cannot resolve high-frequency features in the simulated NO₂ distribution. Therefore, the two datasets were made comparable by averaging the CMAQ data for each OMI ground pixel in an orbit. The pixel boundaries were provided by the overlapping ground pixel product. Within the boundaries, each grid point was weighted based on the instrument's spatial sensitivity (Dobber et al., 2006; Kurosu and Celarier, 2010). Since the set of averaged data is not conveniently visualisable, the CMAQ data were pro-

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jected back onto a $0.01^\circ \times 0.01^\circ$ longitude–latitude grid using a recently developed gridding algorithm (Kuhlmann et al., 2014). The gridding algorithm is available at: <https://github.com/gkuhl/omi>. In this step, missing OMI pixels were also removed from the CMAQ data. Using this approach, the NO_2 distributions of OMI and CMAQ are directly comparable.

3.3 The Hong Kong (HK) OMI NO_2 retrieval

For the HK NO_2 retrieval, we recalculated tropospheric AMFs by Eq. (2) with new ancillary parameters. The new AMFs were used to compute the tropospheric VCDs by Eq. (1).

For the AMF calculation, a set of ancillary parameters was put together for each OMI ground pixel. The parameters were taken mainly from the WRF/CMAQ simulation. Thus, the retrieval does not depend on any other CTM model which makes the model evaluation easier. The ancillary parameters are surface elevations, temperature, pressure and NO_2 profiles, and aerosol extinction coefficients. The model domain (D3, Fig. 1) has a spatial resolution of $3 \text{ km} \times 3 \text{ km}$. The WRF/CMAQ data were temporally averaged to the OMI overpass time. Further ancillary parameters are cloud height and aerosol/cloud radiance fraction (CRF), which were taken from the OMI $\text{O}_2\text{--O}_2$ cloud product (Acarreta et al., 2004), and surface reflectance, which was taken from the MODIS MCD43C2 black-sky albedo (BSA) product (Wanner et al., 1997; Lucht et al., 2000). Table 1 compares the updated parameters with the ancillary parameters used in SP2.

All ancillary parameters were projected to a $0.01^\circ \times 0.01^\circ$ grid and then averaged to each OMI ground pixel. The grid points were weighted based on the instrument's spatial sensitivity within the pixel boundaries, in contrast to other regional retrievals, where each grid point was given equal weight (Russell et al., 2011; Lin et al., 2014).

We recalculated temperature correction coefficients $\alpha_k(T_k)$, box AMFs m_k and partial VCDs V_k . The temperature correction coefficients $\alpha_k(T_k)$ were calculated by the empirical Eq. (3) from the WRF/CMAQ output. The box AMFs were computed with the

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SCIATRAN radiative transfer model. The partial VCDs were also calculated from the WRF/CMAQ output. As an example, two NO₂ profiles are shown in Fig. 2. In contrast to other regional retrievals, we used three-hour means instead of monthly means.

3.3.1 Surface reflectance

The surface reflectance was calculated from the MODIS MCD43C2 BSA product. The product is available every eight days compiled from 16 days of measurements. The spatial resolution is 0.05° × 0.05° (Wanner et al., 1997; Lucht et al., 2000). We calculated the BSAs from the polynomial representation of the bidirectional reflectance distribution function (BRDF) using solar zenith angle (SZA) and model parameters for MODIS Band 3 (Lucht et al., 2000). MODIS Band 3 has a wavelength range from 459 to 479 nm and a centre wavelength of 470 nm. This band is closest to the DOAS fitting window used in the NO₂ retrieval (405–465 nm). Systematic errors due to the wavelength inconsistency are expected to be small. Over water, Lambertian equivalent reflectance (LER) has been reported to decrease from 440 to 470 nm (Kleipool et al., 2008; Zhou et al., 2010). We actually find increased BSA over water surfaces in the PRD region. The MODIS BSA has been used in other regional OMI NO₂ products (Zhou et al., 2010; Russell et al., 2011; Lin et al., 2014).

Since the BSA model parameters have missing values due to cloud contamination, Zhou et al. (2010) filled the data gaps by applying a series of spatial and temporal interpolations. They also reduced measurement noise by applying a smoothing filter. In this work, we combined their steps by using normalised convolution which is a useful algorithm for filling missing values (Knutsson and Westin, 1993). We used a three-dimensional, uniform kernel of size 5 to fill the gaps in the model parameters. To calculate the BSA for each OMI ground pixel, the interpolated BSA model parameters were also projected on the longitude–latitude grid.

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3.3.2 Aerosols and clouds

Scattering by aerosols and clouds affects the AMF (Boersma et al., 2004; Lin et al., 2014). Aerosol scattering enhances the AMF, if aerosols are located below or at the same height as the NO₂ layer. On the other hand, aerosols scattering reduces the AMF, if aerosols are located above the NO₂ layer. In addition, aerosol optics affect the retrieval of cloud properties.

Clouds are typically handled by the independent pixel approximation (Eq. 4), while aerosols are treated only implicitly in all global and most regional NO₂ products. In SP2, cloud fraction and pressure are from the OMI O₂-O₂ cloud product which is sensitive to weakly absorbing aerosols (Boersma et al., 2011). Aerosols are also included by the OMI LER climatology which includes ground haze and persistent cloud features (Kleipool et al., 2008). Lin et al. (2014) included aerosols from a regional GEOS-Chem simulation. They used aerosol optical thickness (AOT) and assumed different profiles of aerosol extinction and absorption coefficients. They also recalculated the OMI cloud product to remove the aerosol component from the product. In a different study, Boersma et al. (2011) derived an empirical relationship between MODIS AOT and OMI aerosol/cloud fraction w :

$$w = 0.21 \cdot \text{AOT}. \quad (5)$$

The formula was derived from cloud free observations over North America.

In our study, we treated clouds as in SP2 using the independent pixel approximation. In SCIATRAN, clouds were implemented as an opaque surface at the height of the OMI cloud pressure product with a surface reflectance of 0.8 and the box AMF was calculated with Eq. (4).

Aerosol extinction coefficients can be calculated from the CMAQ output using the empirical IMPROVE formula (Malm et al., 1994). By default, CMAQ calculates the ground level extinction coefficients. In the HK retrieval, we tested four different aerosol parametrizations:

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Case 1: No explicit aerosol treatment, i.e. aerosols were only included implicitly through the OMI cloud product.

Case 2: Aerosols were described by the LOWTRAN aerosol parametrization which requires only very limited information about season, aerosols type, visibility and relative humidity at four different layers: planet boundary layer (PBL) (0–2 km), troposphere (2–10 km), stratosphere and mesosphere. We set the season to autumn/winter and the aerosol type to urban. The PBL visibility was calculated from the CMAQ ground extinction coefficients β using the definition of the meteorological optical range (MOR) (World Meteorological Organization, 2008):

$$\text{MOR} = -\frac{\log 0.05}{\beta}. \quad (6)$$

The visibility in the free troposphere was set to 23 km. Furthermore, we assumed that no volcanic aerosols were in the stratosphere or mesosphere. The relative humidity in the PBL and the free troposphere were taken from WRF. Visibility and relative humidity were set to the nearest predefined value in the LOWTRAN parametrisation.

Case 3: Vertical profiles of extinction coefficients β were computed from CMAQ output using the IMPROVE formula. The formula includes a constant Rayleigh extinction coefficient of 0.01 which is subtracted to obtain the aerosol extinction coefficient β_{ext} . Since the IMPROVE formula calculates β_{ext} at 550 nm, an Ångström exponent α for urban aerosols is used to calculate extinction coefficients at 435 nm (Hess et al., 1998). Furthermore, a single scattering albedo ω_0 of 0.82 (urban aerosol) in PBL (below 2 km) and 0.93 in free troposphere is used to calculate aerosol absorption coefficients β_{abs} . The phase function is modelled by Henyey–Greenstein parametrisation with an asymmetry factor g of 0.689 (Hess et al., 1998). As examples, two β_{ext} profiles are shown in Fig. 2.

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Case 4: Since **this** three parametrisations include aerosols implicitly through the cloud product, aerosol might be counted twice. Therefore, the CRF was corrected by Eq. (5) using the AOT in CMAQ. This was done mainly because recalculation of the OMI cloud product was outside the scope of our study. Since this formula was derived from cloud free observations over North America, generalisation to cloudy pixels in other regions should be considered with great caution. Otherwise, aerosols were treated as in Case 3.

3.3.3 Application to OMI SP2

The ancillary parameters were used to calculate new AMFs for all OMI measurements within the PRD region. We created four NO₂ datasets (**PRD-1 to PRD-4**) for the four aerosol/cloud cases.

While OMI provides daily global coverage, the number of sufficient measurements, which allows for the study of the NO₂ distribution, is limited due to two factors. Firstly, the ground pixel size at the end of the swath is very large and thus not suitable for studying the local spatial distribution. Therefore, only the inner fifty out of sixty rows were used in this study. Secondly, the presence of clouds increases the retrieval uncertainty. Therefore, only ground pixels were used with **aerosol/cloud radiance fractions** smaller than 50 %. Since the CRF is also sensitive **aerosol**, this filter criterion is likely to remove heavily polluted days as well.

Based on these filtering constraints, **orbits were picked which have** a sufficient number of **ground pixels** to study the spatial distribution of NO₂ in PRD region. The orbits were projected onto a longitude–latitude grid using the same gridding algorithm which has been used to grid the CMAQ data (Kuhlmann et al., 2014).

At each ground stations, time series of **NO₂ VCDs** were **extracted from the data.** To study the additive and proportional differences, the OMI VCDs were converted to mixing ratios using the CMAQ NO₂ profile shapes. Since many stations are located on top of buildings, the mixing ratios were calculated at the station height using nearest-neighbour interpolation.

Finally, we used a standard set of typical ancillary parameters (Table 2) to study the impact of the ancillary parameters on the AMF and thus the NO₂ column densities.

4 Results and discussions

In this section, we demonstrate and discuss the results of our study. Firstly, we compare briefly the HK retrieval with SP2 to discuss the influence of the updated ancillary parameters. Secondly, we validate the WRF/CMAQ simulation using the RAQM network. Then, we validate the OMI datasets using the RAQM network. Finally, the OMI NO₂ datasets and CMAQ were compared to evaluate the regional chemistry transport model using the HK OMI NO₂ datasets.

4.1 OMI regional NO₂ product

In this subsection, we compare the global product (SP2) with our HK retrieval. Only difference relevant for the later discussion in this paper are described here. For a detailed discussion on the different ancillary parameters, we like to refer the reader to earlier studies and reference therein (Zhou et al., 2010; Russell et al., 2011; Lin et al., 2014).

In our study period, 56 days (46 % of all days) with sufficient OMI data were available. Two examples of ungridded NO₂ VCDs are shown in Fig. 3. The spatial distributions are similar for all products but differences can be seen in a pixel-by-pixel comparison. Particularly evident is that the NO₂ VCDs in the HK retrieval have larger maximum values than in the standard product.

The four-month mean NO₂ distributions are shown in Fig. 4c and e. The SP2 has a mean value of $0.4 \times 10^{16} \text{ cm}^{-2}$. The mean values in the four datasets range from 0.6 to $0.7 \times 10^{16} \text{ cm}^{-2}$. The smallest mean value has PRD-1 and the largest has PRD-2. PRD-3 and PRD-4 lie in between these extreme cases. The maximum value in the distribution of SP2 is about $3.5 \times 10^{16} \text{ cm}^{-2}$ while the HK retrieval datasets have maximum values ranging from 4.5 – $5.5 \times 10^{16} \text{ cm}^{-2}$.

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To study the difference without explicit aerosol treatment we compare SP2 and PRD-1. For this dataset, the VCDs are increased by $(27 \pm 39) \%$. The difference are due to the updated ancillary parameters, mainly surface reflectance and profile shapes, and thus due to the recalculated AMFs. For SP2, the mean AMF of all available pixels is 1.01 while the mean AMF of PRD-1 is about 17 % smaller ($\text{AMF} = 0.83$).

To quantify the impact of the high-resolution NO₂ profile shapes on the AMF calculation, we compare the CMAQ profiles with an annual GEOS-Chem profile ($2^\circ \times 2.5^\circ$ spatial resolution) which was used for a satellite validation study in Hong Kong (Chan et al., 2012). The profile was linearly interpolated and extrapolated to the CMAQ vertical levels. The three profiles (see Fig. 2) have been used to compute AMF for the standard case without aerosols (Table 2). The “polluted” CMAQ NO₂ profile has an AMF of 0.82 and is about 3 % smaller than the “clean” profile ($\text{AMF} = 0.84$). The GEOS-Chem profile has an AMF of 1.19 which is 41 % larger than the “clean” and 45 % larger than the “polluted” CMAQ profile. The difference results from the different relative profile shapes. In the CMAQ profiles, the NO₂ number density decreases with altitude, while the GEOS-Chem profile is nearly constant above 2 km. The different profile shapes are related to the different vertical advection schemes used in both models. We expect that the regional CMAQ model provides more accurate vertical distributions than the global GEOS-Chem model. The impact of uncertainties in the profile shapes is difficult to quantify because the uncertainties are not well known due to the lack of NO₂ profile measurements (Boersma et al., 2004). Therefore, we calculated a distribution of AMFs using the simulated profiles at each ground pixel using the standard case. The mean AMF is 0.89 with a SD of 0.08. The largest AMF is 1.64 as a result of an elevated NO₂ layer in the upper troposphere. The smallest AMF is 0.75 which is 16 % smaller than the mean AMF. The small AMF is the result of a heavily polluted ground layer. In summary, the AMF for the high-resolution profiles is about $(35 \pm 11) \%$ smaller than the low-resolution profile.

The profile shapes can also be used to convert VCDs to number concentrations or mixing ratios. For the standard case, the mean conversion factor ($V_0/(\Delta z_0 V_{\text{trop}})$)

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is $(1.47 \pm 0.47) \times 10^{-3} \text{ m}^{-1}$ using all available profiles. Therefore, the uncertainty is about 32 %. The conversion factor of the “clean” and “polluted” profiles are 1.44 and $1.47 \times 10^{-1} \text{ m}^{-3}$, respectively, which is a difference of about 3 %. The GEOS-Chem profile has a conversion factor $3.92 \times 10^{-3} \text{ m}^{-1}$ because of the different profile shape.

The impact of the surface reflectance can be quantified easier. The mean MODIS BSA is shown for a SZA of 48° in Fig. 5a. On average, the MODIS BSA is about 0.01 ± 0.02 smaller than the OMI LER (not shown). The BSA is smaller than LER over land but larger over water. The AMF sensitivity to uncertainties in the surface reflectance depends strongly on the surface reflectance itself (Fig. 6). For the mean surface reflectance (BSA = 0.05) the sensitivity is about 0.06. Therefore, the AMF is reduced by 5 to 10 % if the OMI LER product is replaced by MODIS BSA. To identify the improvement due to the higher spatial and temporal resolution, we averaged the BSA to the lower spatial resolution used in the global product ($0.5^\circ \times 0.5^\circ$). Then, we subtracted the high-resolution BSA used in our regional product (Fig. 5b). The distribution shows areas with large differences (up to ± 0.03) along the urbanised and likely polluted coastline. As a result, if we assume an AMF of 0.83, the retrieval error, due to a low spatial resolution, can be locally as large as 20 %.

The differences between PRD-1 to PRD-4 are due to the different aerosol treatments. Table 3 shows the AMFs for the different aerosol cases using the “clean” and “polluted” profiles in Fig. 2 and the standard parameters (Table 2). PRD-3 and PRD-4 are equal because the standard parameter assume cloud free conditions. If aerosols are included, the AMF is reduced because the aerosol is located above the NO₂ layer (Fig. 2).

In PRD-2, the ground level extinction coefficient is used as constant coefficient in the PBL (0–2 km). If PRD-2 is compared to PRD-1, the AMF is reduced by 19 % for the “clean” and by 57 % for the “polluted” aerosol profile (Table 3). The β_{ext} profiles in Fig. 2 show that using the ground level extinction coefficient is reasonable for a “clean” b_{ext} profile but not for a “polluted” profile. In the latter case, β_{ext} would be overestimated between 1 and 2 km and thus reduce the AMF because these aerosols are located

above the NO₂ layer. As consequence, the ground level extinction coefficient should not be used as PBL mean value for “polluted” cases, because this assumption can severely overestimate the NO₂ column densities.

PRD-3 and PRD-4 use a b_{ext} profile calculated with the IMPROVE formula. The b_{ext} profiles have a maximum value at about 500 m above ground which correlates with the maximum relative humidity. The shape of the profiles is in reasonable agreement with LIDAR measurements in Hong Kong (He et al., 2008). However, the formula was not developed to calculate profiles in an urban environment and thus should be treated with caution. If PRD-3 is compared to PRD-1, the AMF is reduced between 8 and 14 % (Table 3).

If aerosols are included, PRD-4 is likely to be the most reasonable assumption. The mean difference between NO₂ VCDs in SP2 and PRD-4 is (+31 ± 38) %. The difference between PRD-1 and PRD-4 is (+4 ± 11) % showing a large impact due to aerosols. The difference between PRD-4 and PRD-3 is (+1 ± 7) %.

To conclude, our regional datasets have higher NO₂ VCDs than the global product (SP2) because of updated ancillary parameters. On the local scale, systematic errors should be reduced because of the higher spatial resolution.

4.2 WRF/CMAQ validation with ground measurements

In this section, the WRF/CMAQ model is evaluated with ground measurements of meteorological observations and the PRD RAQM network. The errors measures used on the validation are summarised in the appendix.

4.2.1 Temperature, humidity, pressure and wind

The results of the validation are shown in the Supplement. The index of agreement (IOA, see Appendix A) between observed and simulated sea level pressure is high (IOA = 0.99) at all stations. Simulated temperature and humidity also agree well with the observations. The model slightly underestimates temperature and humidity over

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land (HKO and HKIA). The model also overestimates humidity on Waglan Island where the model data are at the sea surface while measurements were taken at station height of 56 m over the sea surface.

Since the wind field is impacted strongly by local topography, the agreement between model and observation is normally lower where the topography is complex and thus cannot be resolved by the model. The Hong Kong Observatory uses Waglan Island as reference station because it is not influenced by local topography. The agreement between model and observations on Waglan Island is good (IOA = 0.84). At HKIA the wind field is impacted by the mountainous Lantau Island and thus the agreement is lower (IOA = 0.68). The HKO station is located within urbanised Kowloon and surrounded by high buildings. Consequently, the agreement between model and observations is low (IOA = 0.57).

The evaluation of the meteorological fields shows good agreement between model and observations within the expected limitations due to the model resolution. The agreement is lower for the wind fields due to the impact of local topography. Unfortunately no meteorological data for the whole PRD region were available for this analysis. However, due to the high agreement in Hong Kong, similar model performance is expected in the complete model domain. The meteorological fields are sufficient to provide input for the chemistry transport simulations.

4.2.2 NO₂ mixing ratios

The results of the statistical evaluation between CMAQ and RAQM network are summarised in the Supplement. At the sixteen stations, the index of agreements vary between 0.29 and 0.75. At most stations the IOA is about 0.5. At Tap Mun, the low IOA is the result of several peaks in the simulated time series which are not found in the measurements. The peaks were traced back to NO_x emissions at the Dapend Peninsula about 15 km east of Tap Mun (not shown). Other stations in Hong Kong have IOA above average.

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There are various reasons for the disagreement between model and measurements. Firstly, the point measurement may not be representative for the grid cell because of the influence of local sources and sinks. Secondly, local topography and station height can also impact the NO₂ mixing ratios. On the other hand, the differences can arise from the model due to the limited parametrisation of the chemistry and in particular the insufficient knowledge of the strength and distribution of the emissions.

The average ground mixing ratios are shown in Fig. 7. In the observations, two major plumes can be identified at Hong Kong and Shenzhen (HK & SZ), which includes the network stations Liyuan, Tap Mun, Tung Chung and Tsuen Wan, and Foshan and Guangzhou (FS & GZ), which includes the stations Huijingcheng, Luhu Park, Shunde Dangxia and Wanqingsha. The latter plume cannot be found in the simulations. The mean bias is close to zero (−5%) at the stations in HK & SZ. The bias is larger in FS & GZ with a MB of −17.6 ppbv (−45%).

The better agreement over Hong Kong is thought to be the result of the updated emission inventory with local information from Hong Kong which are more accurate. The low agreement between model and observation is not very satisfying. In another study, Wu et al. (2012) evaluated CMAQ in the PRD region using a similar emission inventory and reported similar CVs (see Appendix A for definition) and normalised mean biases. The low model performance can impact the quality of the OMI NO₂ dataset because the low model performance might reduce the accuracy of the NO₂ profile shape and thus impact the air mass factor and the conversion factor which is used to convert VCDs to ground mixing ratios.

4.3 OMI validation with ground measurements

In this subsection, OMI NO₂ columns were compared with the RAQM network. The validation with point measurements is challenging, because OMI measures the mean value within the ground pixels (at least 13km × 24 km). Since NO₂ has a high spatial variability, area average and point measurement may not agree well; in particular in an urban area with complex NO₂ sources and sinks. Furthermore, if the VCDs are

converted to ground values with the CMAQ profile shapes, the validation depends on the modelled NO₂ profiles which can have large uncertainties.

In order to get an idea for the expected deviations, we compared the time series of the processed CMAQ data, which have been averaged to the OMI ground pixels, with the raw CMAQ data (3 km × 3 km) at the 16 stations. Table 4 shows the mean error measures for all stations and for the stations within the two plumes. The correlation coefficient is low, in particular, over HK & SZ. This lower agreement in Hong Kong could result from the complex terrain along the coastline and the strong gradient between clean and polluted air (see Fig. 7a). Against that, the NO₂ distribution in FS & GZ is smoother. Table 4 also shows that the processed data have lower mixing ratios with a mean bias between -10 and -20% which is the result of the spatial averaging. The generalisation of these results to the OMI validation should be done with caution because it requires that the model simulates the spatial distribution on a small scale accurately. Nonetheless, this analysis provides some useful information on the expected deviations between satellite and ground measurements.

To study additive and proportional differences between satellite and ground measurements, the OMI VCDs were converted to ground level mixing ratios using the CMAQ NO₂ profile shapes. As an example, the ground mixing ratio distribution for 29 January 2007 is shown in Fig. 8 using a “standard” and the newly developed gridding algorithm. The new algorithm creates continuous distributions which is helpful for the study of the spatial distribution distribution. It should be noted that the high-resolution features are the result of modelled profile shapes. Therefore, the ground mixing ratios depend strongly on the NO₂ profile shape in the model.

Table 5 shows the statistical measures for the comparison between OMI and the ground network for SP2 and datasets using the HK retrieval. The correlation coefficients are similar for all datasets. The size of the correlation coefficient is comparable to the expected values (Table 4). The correlation coefficients is slightly smaller at FS & GZ which is likely related to the low model performance in this area.

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There are large differences between the mean biases. The bias is largest for the global product (SP2). In the HK retrieval, the mean bias depends on the amount of aerosols. The bias is largest for PRD-1 and smallest for PRD-2, while PRD-3 and 4 lie in between them. The magnitude of the bias is closest to the expected value for PRD-4.

The reduced mean bias is an important improvement of the HK NO₂ retrieval.

Table 6 shows the mean values of CMAQ, OMI datasets and RAQM network at the location of the 16 stations. If the local NO₂ distribution was simulated perfectly, the raw CMAQ data would agree with the network measurements and the processed CMAQ data would agree with the OMI measurements. However, the bias between OMI PRD-4 and RAQM network at FS & GZ is larger than the expected value. The difference is likely the result of the CMAQ model bias in this area. If we compare the “clean” and “polluted” standard case (Table 2), the different profile shape (−3%), conversion factor (−3%) and the influence of the aerosols (−10%) can increase the AMF by 10 to 20% (see Sect. 4.1). As a result, the OMI NO₂ VCDs would be larger and the bias between OMI and network would become smaller.

To conclude, the correlation coefficient between all OMI datasets and ground measurements is low. The low correlation is mainly related to the OMI ground pixel size as well as to the **unsatisfactory performance of the CMAQ model**. However, the HK retrieval reduces the mean bias between satellite and ground measurements significantly. The larger bias in FS & GZ suggests that OMI VCDs might be still underestimated in the HK retrieval (PRD-4) due to the model bias in this region.

4.4 CMAQ evaluation with OMI NO₂ datasets in the model domain

In this subsection, we compare the OMI datasets with the CMAQ data. We discuss mainly PRD-4 which performed best in the validation with ground measurements. Since the correlation between OMI and RAQM network is low, only spatially or temporally averaged distribution were compared which reduces the random noise.

Figure 4a–c and e shows the four-month averaged CMAQ and OMI NO₂ VCDs. The averaged raw CMAQ data and the processed CMAQ data are shown Fig. 4a and b.

Some high-resolution features, which cannot be resolved by OMI, are smoothed in the processed NO_2 distribution. Since the OMI lattice changes with each orbit, this processing also provides an easy way to distinguish features which can and cannot be resolved by the current orbit.

The differences between CMAQ and OMI are shown in Fig. 4d and f. The two major plumes at Foshan and Guangzhou (FS & GZ) and Hong Kong and Shenzhen (HK & SZ) are marked by the left and right box, respectively. For each orbit, OMI and CMAQ VCDs were averaged within the two boxes to create a time series for each plume. The results of the time series analysis are shown in Table 7 and two scatter plots are shown in Fig. 9.

At FS & GZ, the correlation coefficient is low ($r \approx 0.4$) and the CMAQ VCDs are much smaller than the OMI PRD-4 VCDs ($\text{MB} = -40\%$). At HK & SZ, the correlation is better ($r \approx 0.6$) and the CMAQ VCDs are larger than the OMI VCDs ($+15\%$). These results confirm the CMAQ bias identified in the evaluation with the ground measurements. The model biases between OMI PRD-4 and CMAQ (processed) are consistent with the biases found between RAQM network and CMAQ (raw) (see Table 6). Since the CMAQ distribution has been processed like OMI, no area averaging effects occur in this comparison. The errors in the OMI measurements are mainly due to uncertainties in the ancillary parameters which are mainly taken from the model simulation.

The HK retrieval can be used for the study of the spatial NO_2 distribution. An example is the shape of the plume at Hong Kong. In CMAQ, the plume has an elliptic shape with a strong, south-western outflow. In the OMI datasets, this feature is less distinct. This difference might be caused by the spatial resolution of CMAQ which does not resolve the mountainous Lantau Island (south of Tung Chung, see Fig. 1).

The OMI measurements can also be used where no ground measurements are available. For example, the OMI measurements show several smaller plumes which are missing in CMAQ. For instance, in the northern and western part of the model domain.

In summary, the HK retrieval provides a better suited dataset which can be used for the evaluation of the CMAQ model.

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5 Discussions and conclusions

In this paper, we evaluate a regional CTM (5 km × 3 km spatial resolution) with satellite measurements. We simulated three-dimensional atmospheric chemistry with the CMAQ modelling system the PRD region from October 2006 to January 2007. Furthermore, we developed a new OMI NO₂ retrieval for this region. The CMAQ model was evaluated with the global OMI NO₂ standard product (SP2), our HK NO₂ retrieval using different aerosol parametrizations (PRD-1 to PRD-4), and ground measurements of the PRD Regional Air Quality Monitoring (RAQM) network.

In the HK retrieval, we recalculated tropospheric AMFs using updated ancillary parameters of NO₂ profile shapes, surface reflectance and aerosol profiles. Our best retrieval (PRD-4) increases the NO₂ VCDs by (+31 ± 38) %, when compared to SP2, and thus reduces the mean bias between satellite and ground measurements significantly (-15 % instead of -41 %). The differences are due to changes in the ancillary parameters used for the AMF calculation. These parameters are NO₂ profile shapes (-35 ± 11) %, surface reflectance (-5 to -10 %) and aerosols (-8 to 14 %). The remaining difference between satellite and ground measurements can be explained by the area averaging due to the OMI ground pixel size and by the CMAQ model bias because the OMI NO₂ retrieval depends on the CMAQ model output. As a result, if the CMAQ model underestimates NO₂ mixing ratios or aerosols, the OMI VCDs can be underestimated as well. This relation should be considered in an evaluation study.

In a polluted environment, accurate knowledge of the vertical profiles of aerosol and cloud scattering as well as NO₂ profile shapes are important to calculate accurate column densities. Our study is limited by unquantified errors due to uncertainties in the NO₂ profile and aerosol profile. In future studies, the HK retrieval should be reviewed by validating the CMAQ NO₂ profiles. Furthermore, the aerosol optical properties were calculated by the IMPROVE formula which has not been developed to calculate profiles in an urban environment. However, the IMPROVE formula can be improved for such an application (Zhang et al., 2013) which we like to include in a future version.

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Otherwise, optical properties can be calculated by Mie theory. The aerosol information can be improved further by validating them with ground- or satellite-based products. A third aspect is the impact of clouds which need to be studied more in future. Satellite products, which provide a clean separation between aerosols, clouds and surface reflectance, are desirable, because this would allow to use different data sources for these ancillary parameters.

The performance of the model is not very satisfying. The correlation between CMAQ and RAQM network is low ($r \approx 0.3$) and the model underestimates the NO₂ concentrations in the north-western model domain (Foshan and Guangzhou). The low performance is assumed to be associated with the used emissions inventory, because the model performance is better in Hong Kong and Shenzhen where the emission inventory has been updated with local data. The model evaluation with the HK retrieval (PRD-4) gives similar results. In Hong Kong and Shenzhen, the model overestimates the NO₂ VCDs by about 15 %, while the correlation coefficient is satisfactory ($r = 0.56$). In Foshan and Guangzhou, the correlation is low ($r = 0.37$) and the model underestimates the VCDs strongly (MB = -40 %). Furthermore, we estimated that the HK retrieval also underestimated VCDs by about 10 to 20 % in Foshan and Guangzhou because of the influence of the model parameters on the AMF. The results of both model evaluations with the RAQM network and the datasets created by the HK algorithm are consistent.

To conclude, our study demonstrates that the datasets created by the HK retrieval are suitable for the evaluation of the spatial distribution and the magnitude of NO₂ concentrations in the model. We showed that a retrieval, which updates not only the profile shapes, reduces the OMI bias over urban areas. In future studies, easy-to-use tools need to be developed which allow such evaluations of CTMs with satellite measurements as easy as using ground network measurements.

Appendix A: Error measures

The following measures are used to compare observations and model:

- Index of agreement (Willmott, 1981):

$$\text{IOA} = 1 - \frac{\sum_{i=1}^N (x_i - y_i)^2}{\sum_{i=1}^N (|x_i - \langle y \rangle| + |y_i - \langle y \rangle|)^2} \quad (\text{A1})$$

where $\langle \cdot \rangle$ is the mean value.

- Pearson's correlation coefficient:

$$r = \frac{1}{n-1} \sum_{i=1}^N \left(\frac{y_i - \langle y \rangle}{\sigma_y} \right) \left(\frac{x_i - \langle x \rangle}{\sigma_x} \right) \quad (\text{A2})$$

σ_x and σ_y are sample SDs.

- Root mean square error:

$$\text{RMSE} = \sqrt{\frac{1}{N} \sum_{i=1}^N (x_i - y_i)^2}. \quad (\text{A3})$$

- Coefficient of variation of the RMSE:

$$\text{CV} = \frac{\text{RMSE}}{\langle y \rangle}. \quad (\text{A4})$$

- Mean bias:

$$\text{MB} = \frac{1}{N} \sum_{i=1}^N (x_i - y_i). \quad (\text{A5})$$

- Normalised mean bias:

$$\text{NMB} = \frac{\text{MB}}{\langle y \rangle}. \quad (\text{A6})$$

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Table 1. Ancillary parameters used for deriving tropospheric NO₂ column densities from OMI.

	Standard Product (SP2)	HK Retrieval (this work)
surface reflectance	OMI LER (5 year, monthly climatology, 0.5° × 0.5°)	MODIS MCD43C2 black-sky albedo (every 8 days, 0.05° × 0.05°)
surface pressure	GMI (2° × 2.5°, adjusted for elevation)	WRF (3 km × 3 km)
cloud pressure and fraction	OMI O ₂ –O ₂ cloud algorithm	OMI O ₂ –O ₂ cloud algorithm
aerosol optics	implicit	CMAQ (3 km × 3 km)
NO ₂ profile shapes	GMI (multi-year monthly climatology, 2° × 2.5°)	CMAQ (3 km × 3 km)
temperature profiles	GEOS-5 (monthly)	WRF (3 km × 3 km)
RTM	TOMRAD	SCIATRAN
AMF calculation	interpolated from a look-up table	pixel-specific (no look-up table)
pixel sensitivity	centre point	instrument function

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Table 2. Standard set of ancillary parameters used in the AMF sensitivity study.

Ancillary Parameter	Value
solar zenith angle (SZA)	48°
viewing zenith angle (VZA)	0° (nadir)
relative azimuth angle (RAA)	180°
terrain height	0.0 km
surface reflectance	0.05
aerosol/cloud radiance fraction	0.00
temperature and pressure profiles	WRF average
NO ₂ and aerosol profiles	CMAQ averages (see Fig. 2)

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Table 3. The AMFs for different aerosol treatment cases for the standard parameters and profiles (Fig. 2).

	PRD-1	PRD-2		PRD-3 & 4	
		clean	polluted	clean	polluted
NO ₂ clean	0.84	0.68	0.39	0.77	0.74
NO ₂ polluted	0.82	0.65	0.35	0.74	0.70

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Table 4. The difference between raw and processed CMAQ data due to the spatial resolution of the satellite instrument (area averaging error).

	IOA	r	MB ^a	NMB ^b	RMSE ^a	CV ^b
HK & SZ	0.54	+0.25	−4.6	−16	17.6	59
FS & GZ	0.77	+0.67	−1.6	−12	7.0	52
all stations	0.69	+0.56	−2.9	−17	9.3	54

^a in ppbv, ^b in percent.

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Table 5. OMI evaluation with the RAQM network.

Case	IOA	r	MB ^a	NMB ^b	RMSE ^a	CV ^b
Hong Kong and Shenzhen						
SP2	0.31	+0.19	-17.5	-54	23.4	73
PRD-1	0.43	+0.24	-8.8	-27	20.6	64
PRD-2	0.52	+0.25	-0.7	-2	21.9	68
PRD-3	0.44	+0.20	-6.3	-20	20.7	64
PRD-4	0.45	+0.24	-7.4	-23	20.1	62
Foshan and Guangzhou						
SP2	0.43	+0.47	-14.3	-48	20.9	71
PRD-1	0.48	+0.41	-10.7	-36	19.2	65
PRD-2	0.58	+0.42	-5.2	-18	17.8	60
PRD-3	0.50	+0.40	-8.5	-29	18.4	62
PRD-4	0.53	+0.46	-8.7	-29	17.9	60
All stations						
SP2	0.40	+0.35	-10.7	-41	18.7	73
PRD-1	0.46	+0.31	-5.6	-22	18.2	71
PRD-2	0.53	+0.32	+0.7	+3	19.6	76
PRD-3	0.47	+0.29	-3.3	-13	18.6	72
PRD-4	0.50	+0.35	-3.9	-15	17.6	68

^a in ppbv, ^b in percent.

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Table 6. NO₂ mean values (in ppbv) at the RAQM network stations for CMAQ, network and OMI datasets.

Stations	CMAQ (raw)	CMAQ (processed)	RAQM	SP2	PRD-1	PRD-2	PRD-3	PRD-4
HK & SZ	29.3	25.1	32.9	14.9	23.4	31.6	25.9	24.8
FS & GZ	13.7	12.0	29.5	15.2	18.9	24.4	21.0	20.8
All stations	18.6	15.7	25.3	14.5	19.4	25.6	21.6	21.0

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Table 7. Evaluation of the time series of CMAQ with OMI NO₂ VCDs in the two areas marked in Fig. 4.

Dataset	OMI Mean ^a	IOA	<i>r</i>	MB ^a	NMB ^b
Foshan and Guangzhou (area)					
SP2	2.5	0.57	0.37	−0.5	−18
PRD-1	3.1	0.55	0.35	−1.1	−35
PRD-2	4.0	0.51	0.35	−2.0	−49
PRD-3	3.5	0.56	0.43	−1.5	−42
PRD-4	3.4	0.54	0.37	−1.3	−40
Hong Kong and Shenzhen (area)					
SP2	1.7	0.51	0.57	+1.2	+73
PRD-1	2.4	0.65	0.51	+0.6	+24
PRD-2	3.2	0.66	0.45	−0.2	−8
PRD-3	2.7	0.75	0.58	+0.2	+9
PRD-4	2.6	0.71	0.56	+0.4	+15

^a in 10¹⁶ molecules cm^{−2}, ^b in percent.

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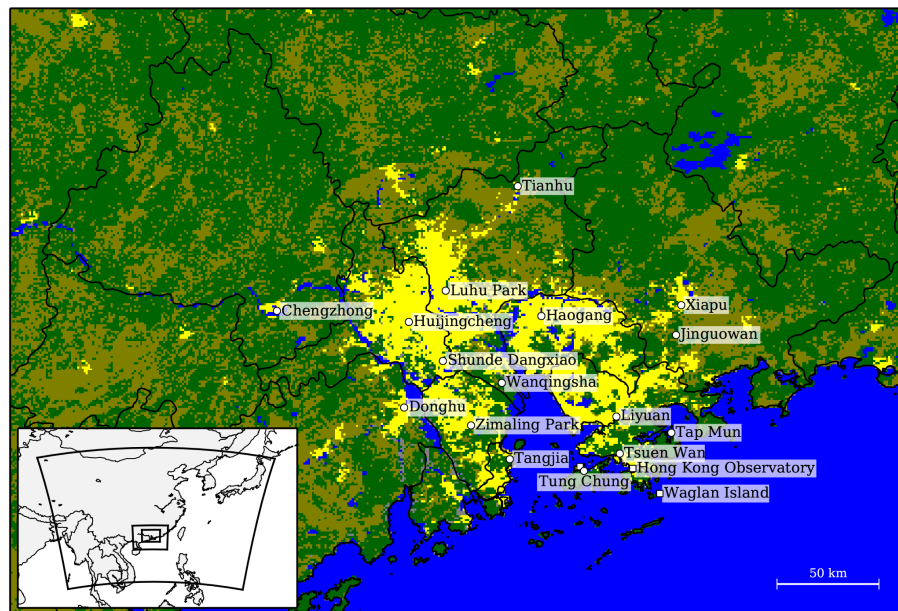


Figure 1. The large figure shows the CMAQ model domain (D3) with MODIS land categories in the Pearl River Delta (PRD) region grouped into the following categories: forest (darkgreen), crop lands (olive), bare land (grey), urban areas (yellow) and water (blue). The stations of the PRD Regional Air Quality Monitoring (RAQM) network and HKO automatic weather stations are marked by circles and squares, respectively. The **small figure** shows the three CMAQ model domains which are D1, D2 and D3 from the largest to smallest.

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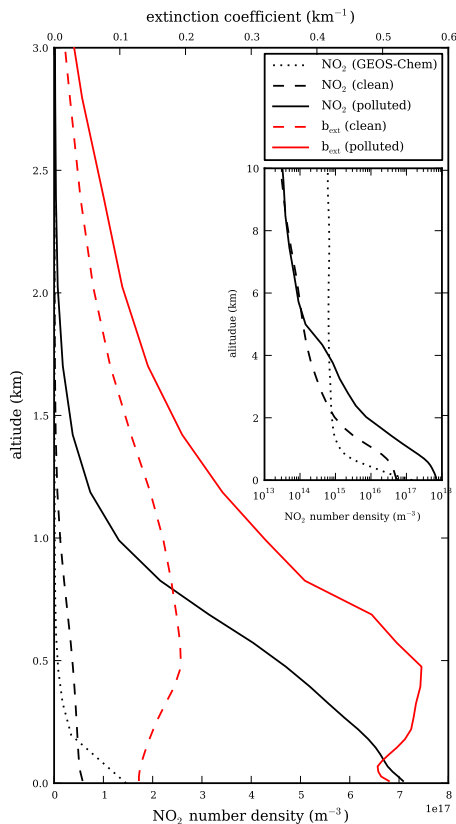


Figure 2. Averaged CMAQ NO_2 and b_{ext} profiles under “clean” and “polluted” conditions. A NO_2 profiles was categorised as polluted, if the ground number density was larger than $4.8 \times 10^{17} \text{ m}^{-3}$ (about 20 ppbv). A b_{ext} profile was categorised as polluted, if the ground extinction coefficient was larger than 0.4. The clean b_{ext} profile has an AOT of 0.3 while the polluted as an AOT of 0.6. In addition, an annual GEOS-Chem NO_2 profile is shown for Hong Kong ($2^\circ \times 2.5^\circ$ spatial resolution).

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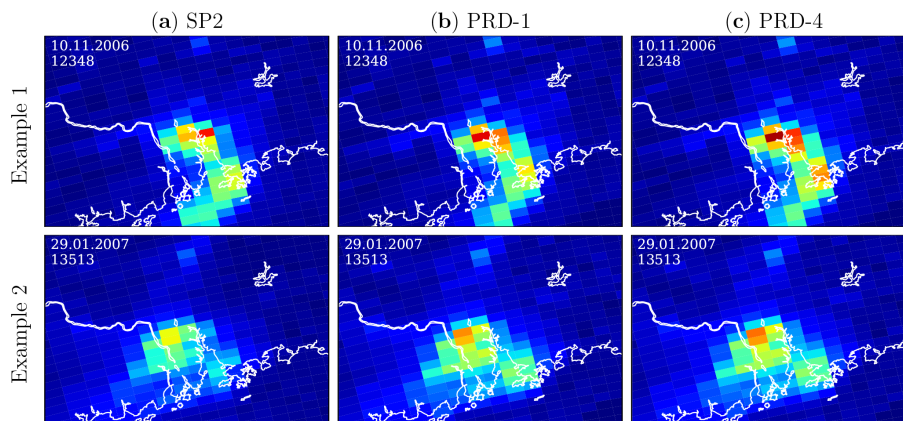


Figure 3. Two example orbits of OMI NO₂ distributions for SP2, PRD-1 and PRD-4. The overall spatial distribution is similar but different in details. The PRD-1 and PRD-4 datasets have larger NO₂ column densities than the standard product (SP2).

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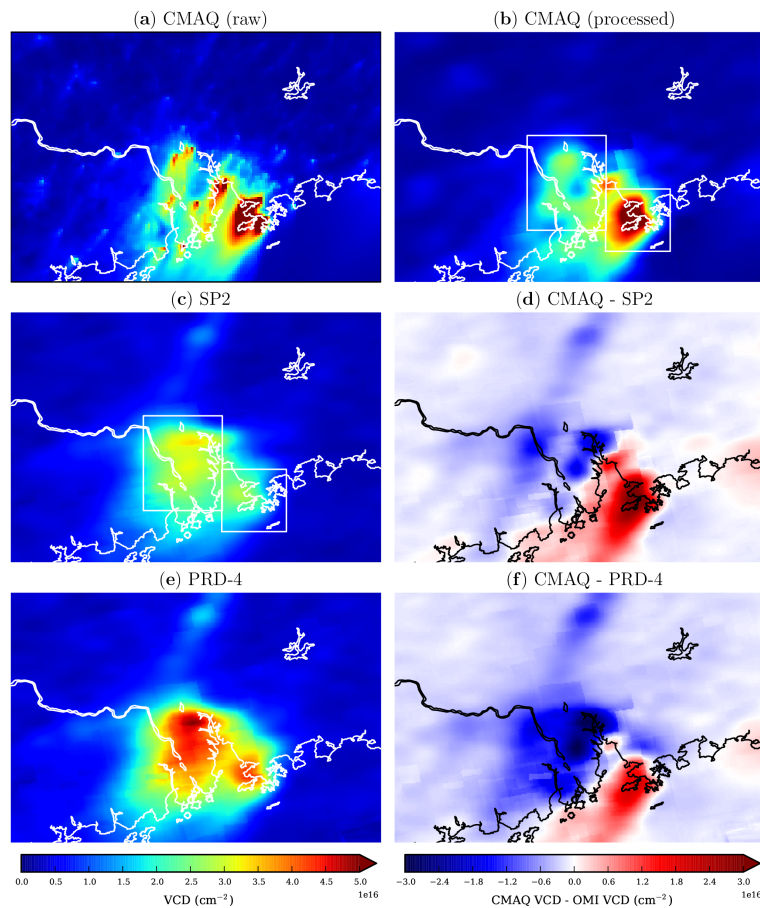


Figure 4. Four-month mean distribution of (a) raw and (b) processed CMAQ NO₂ VCDs, (c) OMI SP2 VCDs and (d) the difference to CMAQ, (e) OMI PRD-4 VCDs and (f) the difference to CMAQ.

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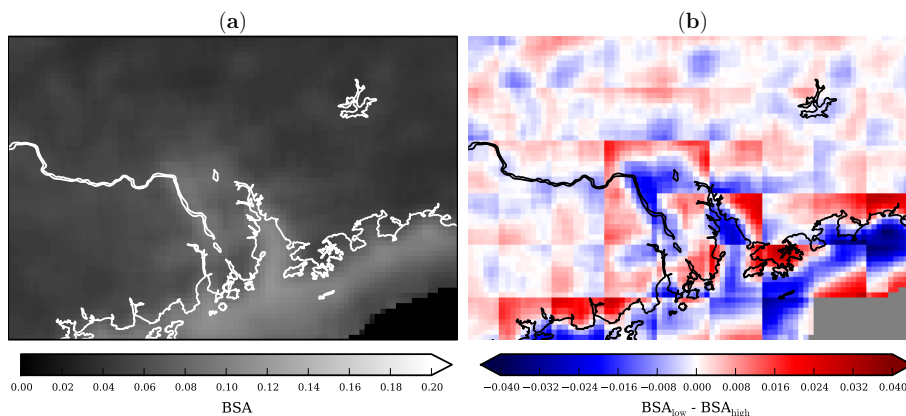


Figure 5. (a) The averaged MODIS black-sky albedo (BSA) and (b) the differences between low- and high-resolution BSAs.

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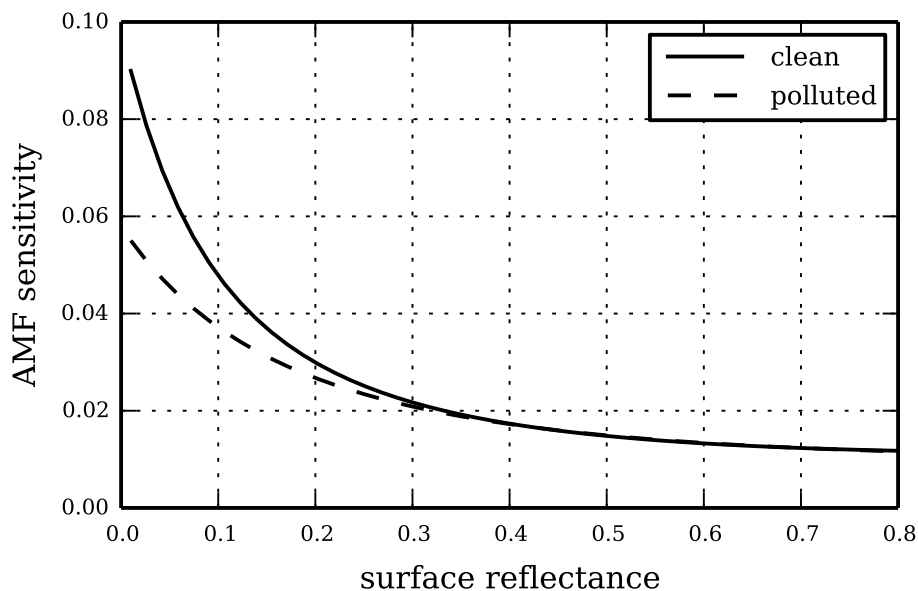


Figure 6. Sensitivity of AMF to a change of 0.01 in surface reflectance for different surface reflectance. The lines show the sensitivity for a polluted and clean aerosol profile (Fig. 2).

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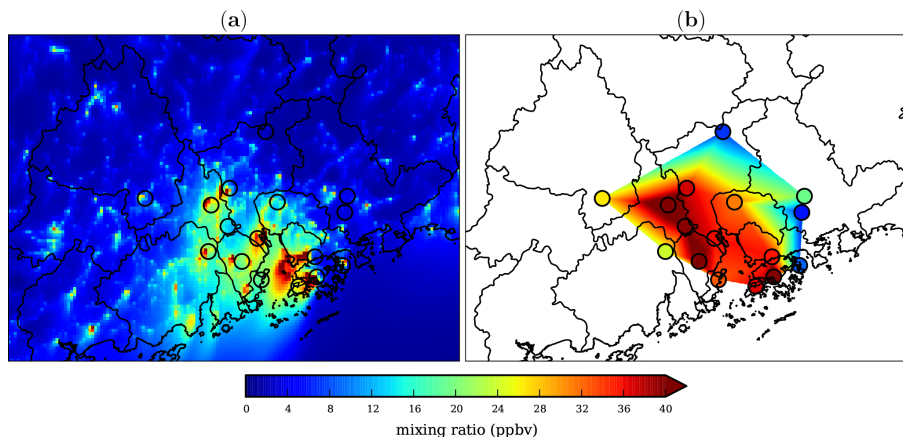


Figure 7. Ground level NO₂ mixing ratios averaged for October 2006 to January 2007: **(a)** CMAQ simulation and **(b)** RAQM network measurements. The values between stations have been estimated by linear interpolation.

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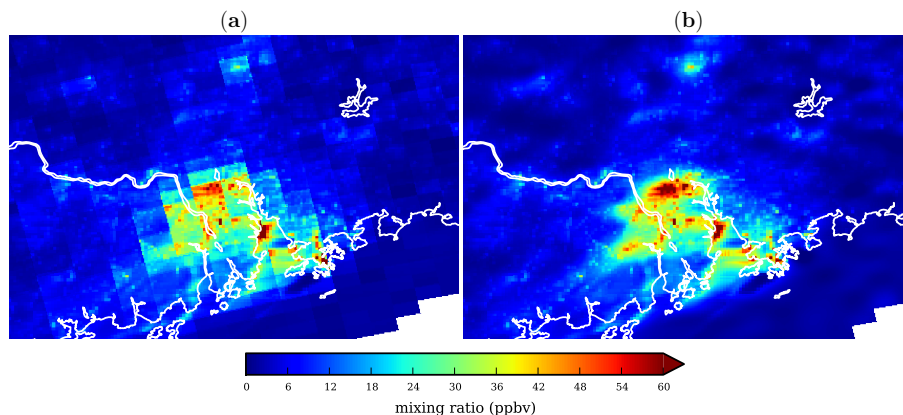


Figure 8. OMI ground mixing ratios from orbit number 13513 on 29 January 2007 comparing a **(a)** “standard” and **(b)** newly developed gridding algorithm (Kuhlmann et al., 2014). The discontinuous map created by the “standard” algorithm is difficult to interpret while the new algorithms makes an analysis of the spatial distribution easier.

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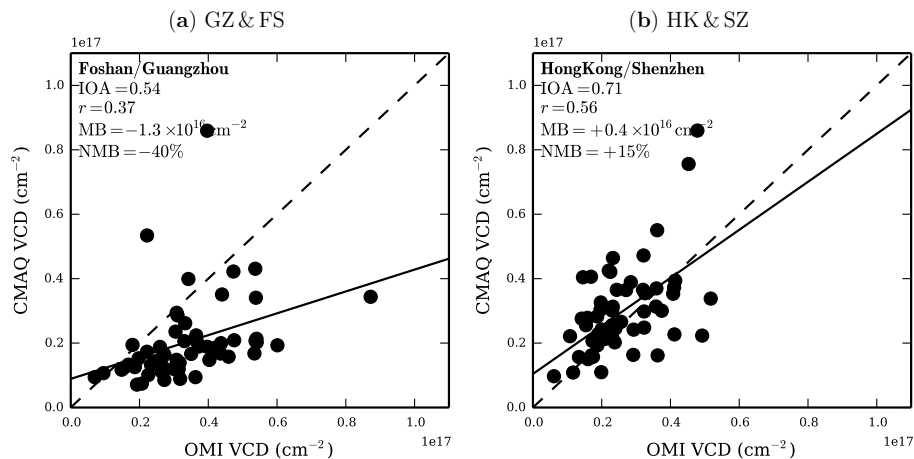


Figure 9. Scatter plot between CMAQ and PRD-4 at (a) GZ & FS and (b) HK & SZ.

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