A high spatial resolution retrieval of NO$_2$ column densities from OMI: method and evaluation

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Abstract

We present a new retrieval of tropospheric NO$_2$ vertical column density from the Ozone Monitoring Instrument (OMI) based on high spatial and temporal resolution terrain and profile inputs. We find non-negligible impacts on the retrieved NO$_2$ column for terrain pressure ($\pm 20\%$), albedo ($\pm 40\%$), and NO$_2$ vertical profile ($-75\%$–$+10\%$). We compare our NO$_2$ product, the Berkeley High-Resolution (BEHR) product, with operational retrievals and find that the operational retrievals are biased high (30%) over remote areas and biased low (8%) over urban regions. We validate the operational and BEHR products using boundary layer aircraft observations from the Arctic Research of the Composition of the Troposphere from Aircraft and Satellites (ARCTAS-CA) field campaign which occurred in June 2008 in California. Results indicate that columns derived using our boundary layer extrapolation method show good agreement with satellite observations ($R^2 = 0.65$–0.83; $N = 68$) and provide a more robust validation of satellite-observed NO$_2$ column than those determined using full vertical spirals ($R^2 = 0.26$; $N = 5$) as in previous work. Agreement between aircraft observations and the BEHR product ($R^2 = 0.83$) is better than agreement with the operational products ($R^2 = 0.65$–0.72). We also show that agreement between satellite and aircraft observations for all products can be further improved (e.g. BEHR: $R^2 = 0.91$) using cloud information from the Moderate Resolution Imaging Spectroradiometer (MODIS) instrument instead of the OMI cloud product. These results indicate that much of the variance in the operational products can be attributed to coarse resolution terrain and profile parameters.

1 Introduction

Nitrogen oxides (NO$_x \equiv$ NO + NO$_2$) play a major role in determining atmospheric composition. NO$_x$ affects the rate of tropospheric ozone production and influences the oxidative capacity of the atmosphere through regulation of OH, thereby acting as a
feedback on its own chemical lifetime. Further, oxidation products of NO\textsubscript{x} are contributors to atmospheric aerosol. Until recently, routine observation of NO\textsubscript{x} was restricted to sparse surface networks concentrated in urban regions. The introduction of satellite remote-sensing instruments over the past decade, however, has provided global, routine observation of NO\textsubscript{2} leading to new insights into the spatial patterns of NO\textsubscript{x} emissions and chemistry, and into the factors influencing NO\textsubscript{x} sources. Satellite observations have provided exquisite evidence for spatial and temporal patterns in anthropogenic NO\textsubscript{x} emissions (e.g. Kim et al., 2006, 2009; Martin et al., 2006; Mijling et al., 2009; Franke et al., 2009; Russell et al., 2010; Lin and McElroy, 2011; Valin et al., 2011), agricultural NO\textsubscript{x} emissions (Bertram et al., 2005; Jaegle et al., 2005; Hudman et al., 2010), lightning NO\textsubscript{x} emissions (Beirle et al., 2004, 2006; Boersma et al., 2005; Martin et al.; 2007; Beirle et al., 2009; Bucsela et al., 2010), and fire NO\textsubscript{x} emissions (Mebust et al., 2011).

With a spatial footprint of 13 × 24 km\textsuperscript{2} at nadir, the Ozone Monitoring Instrument (OMI) has the highest spatial resolution of all the current space-based, NO\textsubscript{2}-observing instruments. Operational retrieval of NO\textsubscript{2} vertical column density performed by the National Aeronautics and Space Administration Goddard Space Flight Center (NASA-GSFC) and the Netherlands Royal Meteorological Institute (KNMI) relies on coarsely resolved databases for terrain height, albedo, and NO\textsubscript{2} vertical profile shape. These inputs all have coarser spatial and temporal resolutions than the OMI observation. There is evidence that higher resolution albedo and surface pressure would improve the retrieval products (Schaub et al., 2007; Zhou et al., 2009; Hains et al., 2010; Heckel et al., 2011). There is also evidence that higher temporal resolution in the assumed profile will change the retrieval by as much as 74% seasonally (Lamsal et al., 2010). However, a retrieval utilizing parameters that are all as spatially resolved as the OMI observation, as well as highly temporally resolved, has not been implemented and tested against in situ observations.

Here we develop a new retrieval of tropospheric NO\textsubscript{2} column, compare it to operational products, and finally, validate it with a robust in situ dataset from the California
portion of the Arctic Research of the Composition of the Troposphere from Aircraft and Satellites (ARCTAS-CA) field campaign. Our new retrieval – hereafter referred to as the Berkeley High Resolution (BEHR) retrieval – uses much higher spatial and temporal resolution terrain and profile inputs than the operational retrievals. We examine aspects of the BEHR retrieval to show that it is an improvement over the low resolution products available, particularly in regions where terrain or albedo are varying on spatial scales comparable to the dimensions of the satellite pixel. We then evaluate the BEHR and operational retrievals using aircraft observations collected within the planetary boundary layer. We show that a large ensemble of observations collected in the boundary layer provide a statistically more robust evaluation of the retrieval than if we relied on aircraft profiles spanning the troposphere. Finally, we evaluate the use of the OMI and MODIS cloud products for excluding cloud-contaminated observations from the comparisons.

2 Tropospheric NO$_2$ columns from OMI

The Ozone Monitoring Instrument (OMI) aboard the Aura satellite (launched in July 2004) is a 0.5 nm resolution UV/Visible spectrometer observing reflected sunlight from the Earth in the 270–500 nm range that can be used to derive NO$_2$ vertical column densities using a DOAS algorithm (Levelt et al., 2006). The instrument has a 2600 km wide swath and a spatial footprint of $13 \times 24$ km$^2$ at nadir. Algorithm development and validation has been carried out by both NASA-GSFC and KNMI. The two institutions have developed different retrieval algorithms for determining vertical column densities of NO$_2$, namely NASA’s Standard Product and KNMI’s DOMINO product (referred to as “operational retrievals” in the remainder of this paper). These two products use the same modified Differential Optical Absorption Spectroscopy (DOAS) spectral analysis technique to determine NO$_2$ slant column densities but differ in their determination of stratospheric portion of the column and the air mass factor (AMF) – a multiplicative factor that is used to covert the slant column into a vertical column. Brief descriptions of each algorithm and their differences are included below.
2.1 NASA Standard Product

Details concerning the Standard Product retrieval (Level 2, Version 1.0.5, Collection 3) algorithm are provided in Bucsela et al. (2006) and Celarier et al. (2008). Briefly, the stratospheric contribution to the column is estimated by masking polluted regions and applying a zonal planetary wave smoothing. AMFs are computed as a function of viewing parameters, terrain pressure, albedo, and NO$_2$ profile shape and stored in a look-up table. AMFs are calculated under both clear and cloudy conditions and a radiance-weighted sum is computed to derive the final AMF using cloud height and effective cloud fraction from the OMI O$_3$-O$_2$ cloud algorithm (Acarreta et al., 2004). Albedo is derived from observations from the Global Ozone Monitoring Experiment (GOME) satellite instrument averaged monthly to $1^\circ \times 1^\circ$ resolution until February 2009 when reflectivity was modified to OMI surface albedo climatology at $0.5^\circ \times 0.5^\circ$ (Koelemeijer et al., 2003; Kleipool et al., 2008). NO$_2$ profiles are from a geographically gridded set of annual mean tropospheric NO$_2$ profiles from the GEOS-Chem model at $2^\circ \times 2.5^\circ$ resolution.

2.2 DOMINO product

The DOMINO retrieval algorithm (Level 2, Version 1.0.2, Collection 3) is described in detail in Boersma et al. (2007). In the DOMINO product, stratospheric columns are determined by assimilating slant columns in the TM4 global chemistry and transport model. As in the Standard Product, AMF’s are determined by using output from a radiative transfer model, albedo at $1^\circ \times 1^\circ$ is from Koelemeijer et al. (2003) until February 2009 when the OMI surface albedo climatology at $0.5^\circ \times 0.5^\circ$ began to be used (Kleipool et al., 2008), and cloud properties are from Acarreta et al. (2004). Daily surface pressure and NO$_2$ profile shape are determined by interpolating the four adjacent cells from a TM4 model output (at $3^\circ \times 2^\circ$ resolution) to the center of the OMI pixel.
2.3 The BEHR product

The Berkeley High Resolution (BEHR) retrieval uses the same method of stratospheric subtraction as that outlined for the Standard Product and AMFs are similarly determined using a lookup table that depends on viewing parameters and terrain and profile information. Table 1 compares terrain and profile parameters implemented in the Standard Product, the DOMINO product, and our BEHR retrieval. We recalculate AMFs using the GLOBE (Global Land One-kilometer Base Elevation) 1 × 1 km² topographical database, MODIS (Moderate Resolution Imaging Spectroradiometer) 0.05° × 0.05° 16-day average albedo (produced every 8 days), and WRF-Chem monthly-averaged, 4 × 4 km² simulated NO₂ profiles. The following sections describe the estimated uncertainties associated with each parameter in the two publicly available retrievals and the differences we observe between our improved NO₂ product and the operational retrievals.

3 Evaluation of the BEHR retrieval

3.1 Terrain pressure effects

Recent studies have shown that inaccurate terrain pressure can have a significant effect on the retrieved NO₂ vertical column density. A systematic topography bias in the DOMINO product of ~80 hPa was reported by Zhou et al. (2009). They attributed the bias to the coarse resolution of the TM4 modeled terrain pressures. Hains et al. (2010) also found that terrain pressures estimated by TM4 were 72–99 hPa larger than those they estimated. These pressure errors cause a 5–20% systematic error in the retrieved NO₂ vertical column densities. The accuracy of the pressure database used in the Standard Product has not been rigorously evaluated.

Here, we use the GLOBE topographical database to estimate terrain height for OMI NO₂ retrieval (Hastings et al., 1999). We average the high resolution dataset over the
area of the satellite pixel to derive effective terrain pressure while NASA and KNMI choose the terrain pressure at the center of the pixel. Figure 1a shows a map of the difference between terrain pressures utilized in the Standard Product and those used in the BEHR retrieval for a single day, 18 June 2008. Little change is observed where the terrain is flat (e.g. California’s central valley), while larger differences are observed in the mountains. Differences on the order of ±10% are observed, with pressures from the Standard Product generally larger than those in the BEHR retrieval. A comparison with the DOMINO product (not shown) revealed similar results. This bias is in agreement with that observed for the DOMINO product by both Zhou et al. (2009) and Hains et al. (2010). Figure 1d shows the percent change in tropospheric NO\textsubscript{2} column as a function of the percent change in terrain pressure and Fig. 1f shows a histogram of the percent change in tropospheric NO\textsubscript{2} column. Differences in column are of the order 10–20%.

### 3.2 Albedo effects

We use a 16-day average albedo product, taken every 8 days, from the MODIS instrument aboard the Aqua satellite (MCD43C3; http://modis.gsfc.nasa.gov/) which provides a much-improved spatial (0.05° × 0.05°; ∼5 × 5 km\textsuperscript{2}) and temporal resolution when compared with the monthly averaged 1° × 1° GOME product and 0.5° × 0.5° OMI product currently employed in the operational retrievals. Since both OMI and MODIS instruments are part of the A-train constellation and observe the earth within 15 min of one another, terrain reflectivity is captured at similar viewing and solar geometries as OMI observations of NO\textsubscript{2}. Changes in reflectivity are better captured by the improved temporal resolution, and the higher spatial resolution observations allow better representation of reflectivity over the OMI footprint. The two instruments have different spectral bandwidths (OMI at 405–465 nm and MODIS at 459–479 nm), however, the error associated with this is expected to be much smaller than that induced by the coarse spatial resolution of the current albedo products. We note that the MODIS albedo product does not provide information over the ocean so all comparisons here are for observations over land.
Figure 1b shows a map of the difference between the albedo products used in the Standard and BEHR retrievals for 18 June 2008. Differences exceeding ±100% are observed. The percent change in tropospheric column NO$_2$ between the Standard Product and the BEHR NO$_2$ product versus the percent change in the albedo used in the two products is shown in Fig. 1e. Differences in tropospheric column NO$_2$ due to the effects of albedo are on the order of ±40% (Fig. 1g).

To examine the effects of albedo on the tropospheric NO$_2$ product in further detail, we evaluate a small region in northwestern Nevada where reflectivity is highly variable. Figure 2a shows an image of a salt flat as observed by MODIS. This region is isolated with no significant sources of NO$_x$. A summertime average (June–August, 2008) of the OMI Standard Product tropospheric NO$_2$ column, however, shows enhanced NO$_2$ in a spatial pattern resembling the reflectivity over the region (Fig. 2e). This feature arises because the coarse albedo used in the operational products ($1 \degree \times 1 \degree$) is unable to capture contrasts at this spatial scale (Fig. 2b). Coarse averaging of the reflectivity with less reflective, surrounding terrain yields a lower albedo. As surface albedo decreases, OMI is less sensitive to NO$_2$, the AMF decreases, and the retrieved NO$_2$ is enhanced (Fig. 2e). By employing a more resolved albedo in the BEHR product (Fig. 2d), however, this false signal is almost fully diminished (Fig. 2f), a reduction of approximately 33% relative to the operational products. We find that 67% of the decrease is due to the improved albedo while the remainder is from using our improved terrain pressures and WRF-Chem profiles. The remaining enhancement may be due to the presence of clouds or aerosols, or to errors in the MODIS albedo.

### 3.3 NO$_2$ profile shape effects

The sensitivity of OMI to NO$_2$ is inversely proportional to altitude. As a result, the observed tropospheric NO$_2$ column depends on the NO$_2$ profile shape. If NO$_2$ is concentrated closer to the surface, the AMF is smaller and the NO$_2$ column is larger. The operational DOMINO and Standard products currently use daily TM4 modeled profiles and annual, mean profiles from GEOS-Chem, respectively (Table 1). Lamsal et
al. (2010) found that the OMI Standard Product is biased high in summer, which they attribute to the lack of seasonality in the Standard Product NO$_2$ profiles.

We use monthly averaged NO$_2$ profiles from a WRF-Chem simulation at 4km resolution. Briefly, WRF-Chem is a state-of-the-art, multi-scale regional 3-D air quality chemical transport model (Grell et al., 2005). The domain covers 2304 × 2304 km$^2$ centered on the state of California. Emissions are the National Emission Inventory (NEI) 2005 on-road and off-road transportation emissions for a typical June weekday. More information concerning emissions is available at: ftp://aftp.fsl.noaa.gov/divisions/taq/emissions_data_2005/Weekday_emissions/readme.txt. The model meteorology was driven by initial and boundary conditions derived from the North American Regional Reanalysis for July, 2005 (NARR – http://nomads.ncdc.noaa.gov/dods/NCEP_NARR_DAILY). We use the Regional Acid Deposition Model, version 2 chemical mechanism (Stockwell et al., 1990).

Using monthly averaged WRF-Chem profiles allows us to eliminate the seasonal bias observed in the Standard Product that results from the use of annually averaged profiles (Lamsal et al., 2010). As before, profiles are averaged over the satellite pixel area. Figure 1e shows normalized NO$_2$ profiles for a single point over an urban region in the Los Angeles area and over a rural region in coastal northern California from the GEOS-Chem and WRF-Chem models. A histogram showing the percent difference in tropospheric NO$_2$ column between the Standard Product and BEHR retrieval is shown in Fig. 1h. Implementation of WRF-Chem profiles results in a decrease in column NO$_2$ of 29% on average, compared to the Standard Product. Decreases are observed over remote areas while enhancements are observed over highly polluted, urban regions.

### 3.4 Spatial resolution and cloud effects

Retrieval of boundary layer NO$_2$ from space-based observations is highly sensitive to cloud cover. As a result, previous studies have used cloud filters in order to exclude data that has a higher uncertainty due to cloud contamination. These filters have generally been set to exclude data with a cloud fraction greater than 0.2–0.3 or data with
a cloud radiance fraction greater than 0.5–0.7 according to cloud information from the OMI O$_2$-O$_2$ cloud product.

The OMI O$_2$-O$_2$ cloud algorithm relies on the 477 nm absorption band of the O$_2$-O$_2$ collision complex to estimate cloud height and fraction. Shielding of the O$_2$-O$_2$ column by the presence of clouds allows determination of cloud parameters when radiance observations are coupled with viewing geometry and terrain information and processed in a radiative transfer model. As in the OMI NO$_2$ products, the OMI cloud algorithm also relies on the coarse 1° × 1° albedo from GOME. Consequently, over bright surfaces, the algorithm has trouble discerning whether the high reflectivity is from the ground or from a cloud. The algorithm thereby has a tendency to mistakenly identify clear-sky, highly reflective regions as cloudy. This error results primarily from a dependence on the coarsely-resolved reflectivity and terrain pressure currently used in the cloud algorithm. While use of the OMI cloud product has the advantage of providing cloud information that is perfectly co-located with NO$_2$ observations, eliminating concerns of instrumental biases, cloud retrieval from OMI is subject to large uncertainty due to the unresolved terrain parameters currently used in the product.

To illustrate this matter, Fig. 3a and Fig. 3b show maps of OMI O$_2$-O$_2$ derived cloud fraction and MODIS MCD43C3 albedo over California for 18 June 2008. The OMI product shows high cloud fractions over regions of high reflectivity in north western Utah, north western Nevada, and the California-Mexico border, east of San Diego. In contrast, no clouds are observed in these regions using the MODIS MYD06 cloud product (Fig. 3c). In light of this issue with the OMI O$_2$-O$_2$ cloud product, we perform our validation analyses by filtering according to both OMI and MODIS cloud fractions (averaged to the OMI pixel size) as a test of the impact of the two cloud products on the comparisons.

3.5 Complete new retrieval of OMI NO$_2$

Figure 4 compares average tropospheric NO$_2$ columns for June 2008 from the Standard Product (Fig. 4a) and the BEHR retrieval (Fig. 4b) with all new terrain and profile
parameters implemented. The percent difference in retrieved tropospheric NO₂ column is shown in Fig. 4c. NO₂ columns determined using the BEHR retrieval are, on average, 31% lower than those observed using the Standard Product. Exceptions to this decrease occur in urban regions where we observe an average increase of 8% that is primarily due to improved NO₂ profiles, and to a lesser extent, improved albedo.

4 Validation of the BEHR retrieval

In order to validate the accuracy of the BEHR product, we use in situ boundary layer measurements of NO₂ collected during the California portion of the Arctic Research of the Composition of the Troposphere from Aircraft and Satellites (ARCTAS-CA) field campaign. The ARCTAS-CA campaign was carried out in order to improve our understanding of emissions, chemical dynamics and air quality over the state of California (Jacob et al., 2010). Aircraft observations were collected on 18, 20, 22, and 24 June 2008 and a substantial fraction of the measurements were collected within the planetary boundary layer. Previous validation efforts have extrapolated columns from surface networks, which are numerous but influenced by local sources, or full aircraft spirals which are sparse (Martin et al., 2006; Bucsela et al., 2008; Lamsal et al., 2008; Boersma et al., 2009; Hains et al., 2010). Boundary layer observations, however, have the advantage of being removed from the direct influence of sources making them more representative of the tropospheric column. Further, given that individual boundary layer aircraft observations largely outnumber full vertical profile observations, their use as a validation tool greatly enhances the robustness of validation analyses.

4.1 Inferred columns from boundary layer observations

The in situ observations of NO₂ studied here were collected throughout the troposphere using the UC-Berkeley Laser-Induced Fluorescence (LIF) instrument aboard NASA’s DC-8 aircraft. Details concerning the instrument are provided in Thornton et al. (2000)
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and Cleary et al. (2002). Briefly, the LIF system employs a Q-switched, frequency-doubled Nd$_3^+$:YAG laser to pump a tunable dye laser. Following cooling of the sample via supersonic expansion to increase the population of NO$_2$ molecules at a target rotational level, the dye laser is held at the peak of the strong resonant for 9s and then at an offline position in the continuum absorption for 3s. Fluorescence is detected at 4 Hz by a photomultiplier tube. NO$_2$ mixing ratio is proportional to the ratio of the peak to the background. A map showing flight tracks where in situ aircraft measurements took place during ARCTAS-CA is shown in Fig. 4d.

We estimate NO$_2$ vertical column densities from boundary layer aircraft observations for comparison with satellite-observed NO$_2$ columns by first co-locating aircraft segments that coincide with individual satellite observations (Fig. 5a). We require that each aircraft segment consist of at least 20 s of measurements that were collected within the boundary layer and within the spatial extent of an OMI pixel after discarding outliers. Outliers are defined as values that are more than two standard deviations away from the mean value for the set of measurements. An aircraft segment consists of measurements gathered between 12:00 p.m. and 03:00 p.m. local time, coinciding with the 01:45 p.m. OMI overpass time.

The boundary layer height for each aircraft observation is defined by identifying sharp gradients in aircraft measured NO$_2$ concentration, water vapor, and potential temperature with altitude to determine boundary layer entrance and exit points (Fig. 5b). We assume that the boundary layer height varies linearly between each entrance into and exit from the boundary layer. Observations gathered during ARCTAS-CA show small variability in NO$_2$ throughout the free troposphere and a mean free tropospheric concentration of roughly 40 ppt. We assume a constant 40 ppt NO$_2$ mixing ratio above the boundary layer for the free-tropospheric portion of the column. We further assume that the boundary layer is well-mixed in order to infer the boundary layer portion of the column from aircraft observations (Fig. 5c). This assumption generally agrees well with GEOS-Chem and WRF-Chem simulations as well as the in situ aircraft observations examined here (e.g. Fig. 1c). The segment of aircraft measurements associated with
a single satellite pixel are averaged and integrated from the terrain height to the height of the boundary layer in order to determine the vertical column density (Fig. 5d).

In the analyses that follow, we exclude comparisons for which OMI pixels were flagged during the retrieval process as well as pixels with an OMI-derived cloud fraction greater than 20%. A total of sixty-eight comparisons remain following the filtering processes.

### 4.2 Satellite observations versus inferred columns

Figure 6a and b compare the in situ-derived tropospheric column NO$_2$ from aircraft observations with satellite-observed column NO$_2$ derived using the Standard Product and DOMINO product algorithms. There is good agreement between in situ and remote-sensed observations, with correlation coefficients of $R^2 = 0.72$ and $R^2 = 0.65$ for the Standard Product and DOMINO product, respectively. Slopes associated with the fits suggest there is no bias in the Standard Product for this time of year but that the DOMINO product is biased high relative to the in situ observations. A similar bias in the DOMINO product was found by Bucsela et al. (2008) using observations from the PAVE, INTEX-A, and INTEX-B aircraft validation campaigns.

Figure 6c compares tropospheric NO$_2$ columns derived from in situ aircraft observations with the columns from the BEHR product. A slope of 0.96 suggests that there is no significant bias between inferred NO$_2$ columns and the BEHR product. We further observe a dramatically improved correlation between BEHR columns and the in situ derived observations ($R^2 = 0.83$) compared to the Standard and DOMINO products. This suggests that a large contribution to the uncertainty in OMI observations arises from biases resulting from unresolved terrain and profile databases that are currently implemented in the operational retrievals.
4.3 OMI versus MODIS cloud products

Table 2 compares our results for the BEHR product when employing various cloud-filters. We observe an improved correlation between aircraft and remote-sensing observations when stricter OMI O$_2$O$_2$ cloud restrictions are imposed ranging from 20% to 5% cloud fraction, but a decrease when we impose a 0% cloud threshold due to a substantial reduction in data points at this threshold for evaluation. The MODIS 0% cloud fraction threshold, however, retains a substantial number of data points and shows a much higher correlation than all other thresholds tested here. As discussed in Sect. 3.4, differences between the 0% OMI and MODIS cloud thresholds are expected to result from artifacts in the OMI cloud algorithm.

In Table 3 we compare how the relationship between inferred columns and satellite NO$_2$ changes for each NO$_2$ product when we impose a MODIS cloud fraction threshold of 0% (Fig. 6; dark crosses) as opposed to the OMI O$_2$O$_2$ 20% cloud fraction threshold (Fig. 6; all crosses). For all three NO$_2$ products, the fits to observations with a MODIS cloud fraction of 0% have similar slopes as the fits to observations with an OMI cloud fraction less than 20%. We observe improved correlations when using the MODIS cloud threshold for all three products (Standard Product: $R^2 = 0.86$; DOMINO: $R^2 = 0.83$; BEHR: $R^2 = 0.91$).

4.4 Boundary layer versus complete spiral analyses

In Fig. 6 we compare the relationship between inferred columns from ARCTAS-CA in situ observations and the BEHR tropospheric column NO$_2$ using our boundary layer validation method (crosses) and the traditional validation method requiring measurements from full aircraft spirals spanning the troposphere as described in Hains et al. (2010; triangles). Briefly, the Hains et al. method requires that part of the aircraft segment was collected between 500 m and 2 km above the land surface, that the aircraft observations were collected within 3 h of the OMI overpass, and that the cloud radiance fraction (as observed by OMI) was less than 0.5. Aircraft observations are
extrapolated to an assumed tropopause height of 12 km and the highest (lowest) 10 altitude observations are used to extrapolate to the top (bottom) of the column.

The boundary layer and full aircraft spiral validation methods show similar variance between in situ observations and the BEHR retrieval of OMI NO\textsubscript{2} suggesting that, using our boundary layer method, we are able to capture the variation of the tropospheric column to within the same certainty as in previous work without requiring observations that span the troposphere at every point. Requiring only points within the boundary layer is an advantage because it both increases the number of data points available for evaluation of the OMI NO\textsubscript{2} retrieval and increases the spatial coverage of the sampling. We find that by requiring complete spirals, only five comparisons are possible ($R^2 = 0.26$), but by using the boundary layer method described here, we expand the number of comparisons to sixty-eight ($R^2 = 0.83$).

5 Conclusions

We have produced an improved OMI NO\textsubscript{2} product (BEHR) that uses much finer spatial and temporal resolution terrain and profile inputs than the operational products. With the exception of the WRF-Chem profiles, these high resolution inputs are publicly available and can be easily implemented into future retrievals. We use the GLOBE 1 km topographical database, averaged to the OMI pixel size, in order to correct for terrain biases resulting from using the pressure at the center of the OMI pixel as in the current operational retrievals. We find differences of ±10% in terrain pressure, resulting differences of roughly ±20% in the retrieved tropospheric NO\textsubscript{2} column. We show that MODIS albedo at higher spatial and temporal resolution than the current reflectivity products (0.05° × 0.05°, 16 day average every 8 days) allows us to detect fine-scale variation in albedo and eliminate false detection of NO\textsubscript{2} over highly reflective regions. The large differences in albedo observed with MODIS result in tropospheric column differences of ±40%. The spatial and temporal resolution of the NO\textsubscript{2} profiles were also improved in the BEHR product (WRF-Chem; 4 km × 4 km; monthly) in order to
account for both spatial and seasonal variation. Compared with the Standard Product, the BEHR tropospheric NO$_2$ product is roughly 30% lower for relatively clean regions and 8% higher for urban regions where anthropogenic emissions account for a majority of the observed NO$_2$.

We validate tropospheric NO$_2$ columns from the Standard, DOMINO, and the BEHR products by comparing the OMI NO$_2$ columns with NO$_2$ measurements collected during the ARCTAS-CA field campaign. While previous comparisons of this kind have required observations spanning the troposphere, we have developed a new method that converts boundary layer NO$_2$ concentrations to vertical column densities. Our method vastly increases the size of the validation dataset by eliminating the need for full vertical profiles for each comparison. We find excellent agreement between in situ-derived and satellite observed NO$_2$ vertical column densities, verifying the use of the boundary layer method for validation of satellite products. We also observe largely improved agreement with the BEHR NO$_2$ product over the operational products. We interpret this to mean that much of the variance in current retrievals is due not to atmospheric parameters, but to the low spatial and temporal resolution of the geophysical assumptions used, as evidenced by the increase in the correlation coefficient, ranging from 0.65–0.72 in the operational products, to 0.83 in the BEHR retrieval. Finally, we show that MODIS cloud observations are a useful tool for filtering cloud contaminated scenes and that their use dramatically improves agreement between satellite and aircraft observations (e.g. BEHR: $R^2 = 0.91$).

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Table 1. Albedo, terrain pressure, and NO$_2$ vertical profiles in each of the three satellite column NO$_2$ retrievals studied here.

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<td>MODIS MCD43C3, 0.05° × 0.05°, 16 day average every 8 days (averaged to OMI pixel)</td>
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<tr>
<td><strong>Terrain Pressure</strong></td>
<td>SDP Toolkit 90 arcsec DEM map (pressure @ center of OMI footprint)</td>
<td>TM4 model, 3° × 2° resolution, interpolate four adjacent cells to the center of the OMI pixel</td>
<td>GLOBE 1 km × 1 km topographical database (averaged to OMI pixel)</td>
</tr>
<tr>
<td><strong>NO$_2$ Profile</strong></td>
<td>GEOS-Chem 2° × 2.5°, Annually</td>
<td>TM4 model, 3° × 2° resolution, Daily, interpolate four adjacent cells to the center of the OMI pixel</td>
<td>WRF-Chem 4 km × 4 km, Monthly (averaged to OMI pixel)</td>
</tr>
</tbody>
</table>

* Note: as of early 2009, the Standard and DOMINO products have begun to use OMI reflectivity at 0.5° × 0.5° resolution, however, the switch has not yet been retroactive and early data still uses the GOME 1° × 1° resolution reflectivity product.
Table 2. The number of data points available, equation for best fit line, and correlation coefficient when in situ NO$_2$ versus BEHR NO$_2$ is filtered according to different cloud information.

<table>
<thead>
<tr>
<th>Cloud Product</th>
<th>Cloud Fraction</th>
<th># of Data Points</th>
<th>Best Fit Line</th>
<th>$R^2$</th>
</tr>
</thead>
<tbody>
<tr>
<td>OMI</td>
<td>20%</td>
<td>68</td>
<td>$y = 0.96x - 5.01 \times 10^{14}$</td>
<td>0.83</td>
</tr>
<tr>
<td></td>
<td>10%</td>
<td>64</td>
<td>$y = 0.95x - 4.38 \times 10^{14}$</td>
<td>0.83</td>
</tr>
<tr>
<td></td>
<td>5%</td>
<td>42</td>
<td>$y = 1.00x - 4.45 \times 10^{14}$</td>
<td>0.82</td>
</tr>
<tr>
<td></td>
<td>0%</td>
<td>11</td>
<td>$y = 1.56x - 5.13 \times 10^{13}$</td>
<td>0.58</td>
</tr>
<tr>
<td>MODIS</td>
<td>0%</td>
<td>45</td>
<td>$y = 1.03x - 1.39 \times 10^{14}$</td>
<td>0.91</td>
</tr>
</tbody>
</table>
Table 3. Equation for the best fit line and correlation coefficient for satellite columns versus in situ columns when the OMI cloud fraction and MODIS cloud fraction thresholds are used.

<table>
<thead>
<tr>
<th></th>
<th>OMI cloud fraction &lt; 20%</th>
<th>MODIS cloud fraction = 0%</th>
</tr>
</thead>
<tbody>
<tr>
<td><strong>Standard Product</strong></td>
<td>$y = 0.99x + 4.51 \times 10^{14}$ \hspace{1cm} $y = 1.04x + 5.45 \times 10^{14}$</td>
<td>\hspace{1cm} $R^2 = 0.72$ \hspace{1cm} $R^2 = 0.86$</td>
</tr>
<tr>
<td><strong>DOMINO</strong></td>
<td>$y = 1.78x - 1.31 \times 10^{15}$ \hspace{1cm} $y = 1.70x - 4.67 \times 10^{13}$</td>
<td>\hspace{1cm} $R^2 = 0.65$ \hspace{1cm} $R^2 = 0.83$</td>
</tr>
<tr>
<td><strong>BEHR</strong></td>
<td>$y = 0.96x - 5.01 \times 10^{14}$ \hspace{1cm} $y = 1.03x - 1.39 \times 10^{14}$</td>
<td>\hspace{1cm} $R^2 = 0.83$ \hspace{1cm} $R^2 = 0.91$</td>
</tr>
</tbody>
</table>
Fig. 1. Retrieval inputs from the BEHR retrieval are compared with those from the Standard Product. Maps of the percent change in (a) terrain pressure and (b) and terrain reflectivity for 18 June 2008. (c) Profile shapes from GEOS-Chem and WRF-Chem for single points over urban and rural regions in California. The percent change in NO$_2$ column versus the percent change in (d) terrain pressure and (e) albedo. Histograms of the percent change in NO$_2$ column due to changes in (f) terrain pressure, (g) albedo, and (h) NO$_2$ profile shape.
Fig. 2. (a) MODIS true color image of a salt flat in north western Nevada on 18 June 2008. Albedo used in (b) the operational retrievals for October 2004–February 2009 (GOME climatology, monthly at 1° × 1°), (c) the operational retrievals for February 2009–today (OMI climatology, monthly at 0.5° × 0.5°), and (d) the BEHR retrieval (MODIS MCD43C3, 16 day average every 8 days, at 0.5° × 0.5°) for 18 June 2008. Average OMI tropospheric NO\textsubscript{2} column from (e) the Standard Product and (f) the BEHR retrieval for June–August 2008.
Fig. 3. Maps over California showing (a) OMI O$_2$-O$_2$ derived cloud fractions, (b) MODIS MCD43C3 albedo, and (c) MODIS MYD06 cloud fraction for 18 June 2008. White boxes show regions where OMI and MODIS cloud fractions do not agree due to albedo effects.
Fig. 4. Average tropospheric NO$_2$ column for June 2008 from (a) the Standard Product and (b) the BEHR product, and (c) the percent difference between the two products. (d) Flight tracks during the ARCTAS-CA campaign, 18–24 June 2008.
Fig. 5. (a) The black line shows the flight path over CA of the DC-8 aircraft on 24 June 2008. Colored squares show the column concentration and location of the center of coincident OMI pixels. (b) Aircraft altitude, H$_2$O vapor concentration, NO$_2$ concentration, potential temperature, and inferred boundary layer height versus time for the flight on 24 June. (c) Vertical profile of NO$_2$ over California inferred from the 18–24 June flights. (d) In situ derived and OMI Standard Product columns collected on 24 June.
Fig. 6. OMI tropospheric column from (a) the Standard Product, (b) the DOMINO product, and (c) BEHR product versus coincident aircraft-derived column \( \text{NO}_2 \). Observations are over land only. All observations correspond to an OMI cloud fraction of less than 20%. Dark blue points show where MODIS cloud fraction is 0%. The black line shows the fit to all data. Fits and correlations are included in Table 3. Orange triangles in (c) show the comparison of the BEHR retrieval and in-situ derived columns determined using the full vertical spiral method in Hains et al. (2010).