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Atmospheric Measurement Techniques Discussions

Two-dimensional monitoring of air pollution in Madrid using a MAXDOAS-2D instrument

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Abstract

Trace gases play a key role in the chemistry of urban atmospheres. Therefore, knowledge about their spatial distribution is needed to fully characterize the air quality in urban areas. Using a new Multi-AXis Differential Optical Absorption Spectroscopy (MAXDOAS)-2D instrument, along with inversion algorithms, we report for the first time two-dimensional maps of NO_2 concentrations in the city of Madrid, Spain. We found good agreement between the MAXDOAS-2D mesoscale observations and the in-situ measurements provided by Madrid´s air quality monitoring stations. In addition to vertical profiles, we studied the horizontal gradients of NO_2 in the surface layer by applying the different horizontal light path lengths in the two spectral regions included in the NO_2 spectral analysis: ultraviolet (UV, at 360 nm) and visible (VIS, 477 nm). Finally, we also investigate the sensitivity of the instrument to infer vertically-distributed information on aerosol extinction coefficients and discuss possible future ways to improve the retrievals.

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1 Introduction

Air pollution in urban areas has become a concern in our society because it represents a major risk to human health and the environment (WHO, 2019). Air quality is often expressed as the state of air pollution in terms of gaseous pollutants concentrations as well as size and number of particulate matter that may affect human health, ecosystems and climate (Monks et al., 2009). Integral understanding of air pollution requires knowledge about the sources, pollutants, chemical composition and spatial distribution, and their transport phenomena in the atmosphere (EEA, 2019).

Madrid, Spain, has suffered from severe air pollution in recent years, with episodes of large nitrogen dioxide (NO_2) and ozone (O_3) concentrations. In an effort to control and reduce high pollution events, the local government has enforced some traffic restriction measures (Izquierdo et al., 2020) and has set up several in-situ air quality monitoring stations over the city's metropolitan area. These in-situ instruments -as of today- cannot measure some important trace gases present in the atmosphere and their values are only representative of the immediate surrounding of the instruments and at surface level. There is therefore a need for mesoscale analysis (both in horizontal and vertical) of urban air pollution that could complement the in-situ measurements. With this aim, we have deployed Multi AXis Differential Optical Absorption Spectroscopy (MAXDOAS) instruments for air pollution measurements in Madrid. MAXDOAS is a widely used technique for the detection of trace gases in the atmosphere and it is based on the wavelength dependent absorption of scattered sunlight by atmospheric constituents (Platt and Stutz, 2008). In addition to routinely monitored, regulated species such as NO_2 and O_3, MAXDOAS provides mesoscale measurements of other trace gases that are relevant to understand atmospheric chemistry, such as nitrous acid (HONO), formaldehyde (HCHO) or glyoxal (CHOCHO). Over the past few years, we have reported trace gas measurements in Madrid using the MAXDOAS technique (Wang et al., 2016; Garcia-Nieto et al., 2018; Benavent et al., 2019) as well as pollutants trend analysis and chemical transport modelling (Borge et al., 2018; Cuevas et al., 2014; Saiz-Lopez et al., 2017).

For this work, a new two-dimensional MAXDOAS instrument (which will be described in Sect. 3 and will be hereafter referred to as MAXDOAS-2D) has been built, tested and set up to take continuous measurements in Madrid. This instrument represents a follow-up

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development to our previous one-dimensional instrument (MAXDOAS-1D, see Wang et al., 2016) that incorporates the capability of moving in the azimuthal dimension, therefore allowing the collection of spectra pointing at any desired angular direction. This additional capability allows the measurement of both the horizontal and vertical trace gas (e.g. NO_2) distribution throughout the city and in turn the generation of two-dimensional maps of trace gas composition.

Here we present two months of MAXDOAS-2D measurements of scattered sunlight spectra. The measurements were taken from May 6, 2019 to July 5, 2019, with focus on the evaluation of NO_2 vertical concentration profiles and the characterization of horizontal light paths lengths. This represents the first two-dimensional MAXDOAS measurements in Madrid. An assessment of the relation between the MAXDOAS analysis and the in-situ instruments in the city was carried out. Sect. 2 provides details of the DOAS technique while Sect. 3 describes the experimental setup. The inversion methods and the atmospheric parameters chosen for the analysis is detailed in Sect. 4. The two-dimensional NO_2 distributions, an evaluation of the light path geometries, along with their relative probabilities, and an assessment of horizontal mixing ratio gradients near the surface are discussed in Sect. 5. Finally, Sect. 6 contains conclusions and possible future work.

2 Brief introduction to the DOAS method

The absorption spectroscopy field has been developed for several decades within different research disciplines (such as remote sensing, astronomy or atomic and molecular physics). Its foundation relies on the absorption of radiation when interacting with a certain sample. The basic idea is described by the Beer-Lambert law, which models the exponential attenuation of spectral irradiance when it traverses a certain sample that contains some absorber species:

$$I(\lambda, L) = I_0(\lambda)\, exp\left(-\sum_i \int_0^L \sigma_i(\lambda)\, \rho_i(\lambda) ds\right) \quad (1)$$

where λ is the radiation wavelength, σ_i and ρ_i stand for -respectively- the absorption cross section and concentration of a given absorber i along the path, while the pair I_0 and I

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represent the spectral irradiances at the beginning and end of the process at study. The absorption processes are integrated over the photon paths (with infinitesimal path ds) and summed over every present absorber (Platt and Stutz, 2008).

Specifically, the MAXDOAS technique is based on the study of the differential spectral absorption structures that are produced in the measured scattered sunlight spectra (Plane and Saiz-Lopez, 2006; Platt and Stutz, 2008). The main principle is based on identifying the narrowband absorption features within the measured optical density taking out the broadband optical density, mainly generated by Rayleigh and Mie scattering, as well as by instrumental effects. On the other hand, an analogous process is done on the trace gases absorption cross sections by means of filtering out the broadband spectral features, hence producing the so-called differential absorption cross sections, which are unique for each trace gas, acting as their "fingerprints" and therefore enabling their specific detection.

For MAXDOAS, I_0 stands for the solar spectrum (known as the Fraunhofer spectrum, with no Earth atmospheric absorptions), while I represents the recorded ground-based spectrum, which includes all the absorption and scattering processes. However, and since the actual photon path is difficult to determine with accuracy (see Sect. 4), the MAXDOAS calculations are done using relative absorptions between two different optical paths: a zenith spectrum -that contains less absorptions and is assumed as a reference spectrum- and other spectrum pointing to a given elevation angle. Therefore, the direct product of the method is the Differential Slant Column Density (DSCD), which can be defined as the difference in the integrated concentration of a given absorber between the two selected pointing directions (more details about the numerical procedure that lies behind can be found in Honninger et al., 2004, Plane and Saiz-Lopez, 2006 and Platt and Stutz, 2008). Finally, these DSCDs are used as the main input for the profile retrieval algorithms, which try to reconstruct the photon paths that result in the measured DSCDs. This final step produces the vertical concentration profiles (Sect. 4).

3 Experimental

Briefly, MAXDOAS-1D instruments consist of a light collector attached to a stepper motor that scans the atmosphere at different Viewing Elevation Angles (VEA, see Fig. 1). The main feature added to the MAXDOAS-2D instrument is an additional stepper motor for the

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azimuthal movement, hence allowing the light collector to freely point to any angular direction in the atmosphere. This allows the evaluation of trace gases absorptions for different Viewing Azimuth Angles (VAAs) (Fig. 1).

3.1 MAXDOAS-2D description

A new MAXDOAS-2D instrument (Fig. 2) was built by the Atmospheric Chemistry and Climate group at the Institute of Physical Chemistry Rocasolano (IQFR, CSIC). Its main elements are based on our previous MAXDOAS-1D instrument: a light collector attached to a stepper motor, along with a focusing lens (80 mm focal length) are responsible for collecting the scattered sunlight. An Ocean Optics, SMA 905 optical fiber of 1-meter length conducts the light through an Ocean Optics, HR4000 spectrometer (which incorporates a linear silicon CCD array as detector). The spectrometer wavelength ranges roughly from 300 nm to 500 nm and offers an estimated spectral resolution (full width at half maximum) of about 0.5 nm. As explained before, an additional stepper motor was included to make the azimuthal movement possible. The instrument incorporates all its components in an outdoor unit. Therefore, to maintain the spectrometer temperature as steady as possible -for both mechanical and wavelength calibration purposes- a Peltier cell was included. Additionally, an UPS device provides the power supply and eliminates possible strong power peaks. Two webcams take pictures of the cloud cover at each VAA, and monitor the instrument itself. The instrument is quite autonomous and it runs on a homemade Java software. This software controls the movement, the spectra collection and recording, the surrounding accessories and automatically keeps it continuously measuring as long as the Sun is over the horizon.

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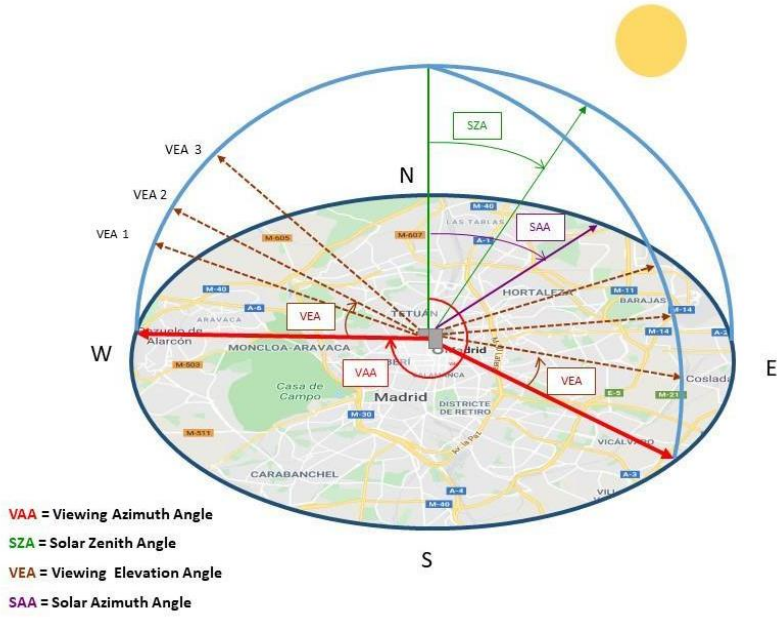

Figure 1. MAXDOAS-2D geometry diagram, the background of this picture represents the Madrid city center taken by © Google Maps.

3.2 Location

The MAXDOAS-2D instrument is located at the main campus of the Spanish National Research Council (CSIC) in Madrid (Spain). It is placed on the roof of the Instituto de Ciencias Agrarias (ICA) at a latitude of 40.4419° N and a longitude of 3.6875° W. The height of the building is approximately 70 m above ground level. This location in downtown Madrid can be classified as an urban site, with the usual weather of continental areas at mid-latitudes (i.e. hot and dry summers and cold winters), with prevalence of clear sky days during the year.

Due to some obstacles that blocked a clear view in some of the VAAs, a small aluminum tower was built to overcome the viewing obstacles and the MAXDOAS-2D instrument was fixed on top of it (see Fig. 2). Once the instrument was set up, we aligned it for both angular movements -azimuthal and zenithal- with respect to the geographical north and the local horizontal (i.e. perpendicular to the gravitational plumb), respectively. This process was performed in two steps: first, the light collector was coarsely oriented using levels and a compass. Then, the alignment was refined doing a vertical scan of the Sun (which has a very

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well-known position vector) and its angular surroundings at several different times of a clear sky day. The angular differences between the measurements and the center of intensity of the registered spectra (a similar approach was done in Ortega et al., 2015) were estimated and the associated correction applied to the instrument.

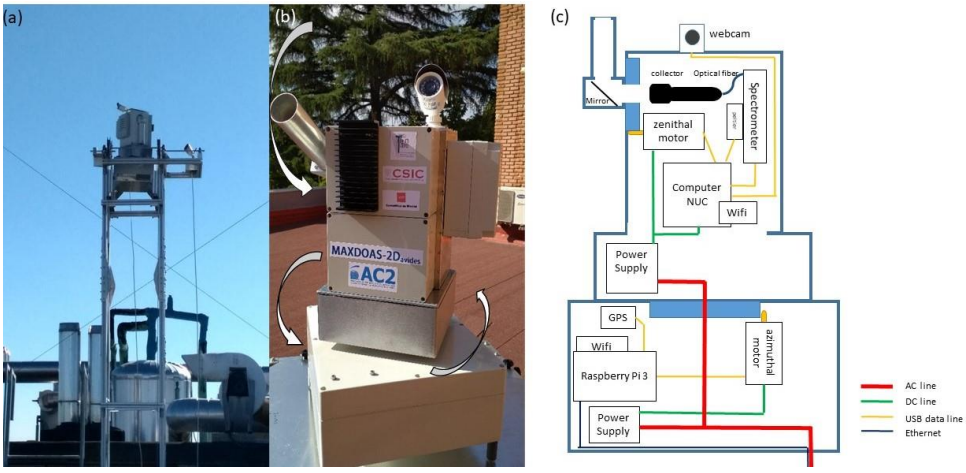

Figure 2. a) aluminum tower with the instrument installed on top of it; b) MAXDOAS-2D instrument; c) MAXDOAS-2D scheme.

3.3 Measurements set up

In order to sample and analyze a representative portion of the atmosphere over Madrid, selected angular directions were chosen. Starting at a VAA of 0º (pointing to the north), the MAXDOAS-2D rotated clockwise using steps of 20º in azimuth. In each azimuth direction, the ensuing VEA vector was used: 1, 2, 3, 5, 10, 30 and 90 degrees. Therefore, an entire azimuthal lap was completed when the light collector was back again at VAA of 0 degrees.

For every measured spectrum, the spectrometer was able to correct for both electronic offset and dark current effects. Other important parameters for the measurements such as the integration time and the number of scans taken in each angular direction were automatically calculated by the software. More specifically, for this study we set the goal of completing an azimuthal lap in approximately one hour (mainly for an easier interpretation of the results and for the subsequent comparison with in-situ instruments of Madrid´s air quality monitoring

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network). Hence, we chose 24 seconds as the maximum exposure time in each angular combination.

4 Analysis methods

Using the DOAS technique, the absorptions of the molecular oxygen dimer (O_4) and NO_2 were measured for the entire campaign and for two spectral windows: 352-387 nm (UV region) and 438-487 nm (VIS region). The analysis settings applied for the UV and VIS regions are summarized in Tables 1 and 2, respectively. These configurations follow those used in Wagner et al., 2019.

Table 1. DOAS spectral settings for the retrieval of O_4 and NO_2 in the UV.

Parameter	Value
Fitting window	352-387 nm
Wavelength calibration	Based on reference solar atlas (Chance and Kurucz, 2010)
Zenith reference	Scan
Polynomial Order	5
Intensity Offset	Order 2
Shift	All spectra and the Ring cross section were allowed to shift and stretch (order 1) in wavelength.
Molecule	**Cross section**
O_4	293 K (Thalman and Volkamer, 2013)
NO_2	298 K (Vandaele et al., 1998)
O_3 a	273 K (Serdyuchenko et al., 2014)

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O_3 b	223 K (Serdyuchenko et al., 2014)
HCHO	297 K (Meller and Moortgat, 2000)
HONO	296 K (Stutz et al., 2000)
Ring_a	Calculated by QDOAS
Ring_b	Ring_a spectrum multiplied by λ^{-4}

Table 2. DOAS spectral settings for the retrieval of O_4 and NO_2 in the VIS.

Parameter	Value
Fitting window	438-487 nm
Wavelength calibration	Based on reference solar atlas (Chance and Kurucz, 2010)
Zenith reference	Scan
Polynomial order	5
Intensity offset	Order 2
Shift	All spectra and the Ring cross sections were allowed to shift and stretch (order 1) in wavelength.
Molecule	**Cross section**
O_4	293 K (Thalman and Volkamer, 2013)
NO_2	298 K (Vandaele et al., 1998)
O_3 a	273 K (Serdyuchenko et al., 2014)
O_3 b	223 K (Serdyuchenko et al., 2014)
H_2O	296 K (Rothman et al., 2010)
Glyoxal	296 K (Volkamer et al., 2005)
Ring a	Calculated by QDOAS

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Ring b	Ring a spectrum multiplied by λ^{-4}

The selected differential absorption cross sections -along with the spectral window and parameters included in Tables 1 and 2- were adjusted to the measured differential optical density using the QDOAS spectral fitting software (developed at BIRA-IASB, http://uv-vis.aeronomie.be/software/QDOAS/). When the measured DSCD (using QDOAS) accurately matches the differential optical density for a given trace gas -i.e. yielding a relatively low residual- there is positive detection of that trace gas. Figure 3 shows examples of spectral detection of O_4 and NO_2 for both the UV and VIS regions. Once the DSCDs are obtained, they are used as input for the profile retrieval algorithm, as explained in Sect. 4.2.

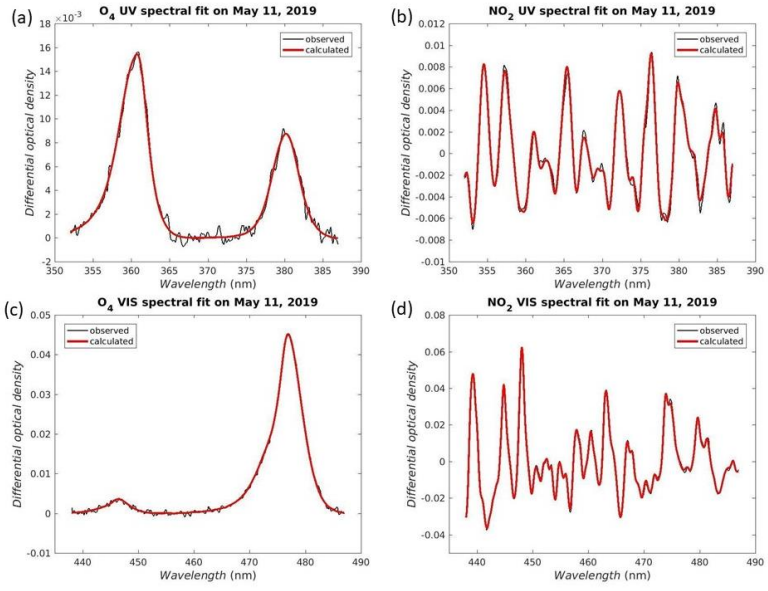

Figure 3. Spectral detection of O_4 (a) and (c) and NO_2 (b) and (d), red lines represent the calculated optical densities and black lines are the measured optical densities.

4.1 Cloud-screening and quality filtering

The algorithms for MAXDOAS retrievals of trace gas vertical profiles are based on estimating the light paths (along with their corresponding scattering probability) for a clear sky

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day. A significant cloud cover could noticeably impact the calculations, mainly because of multiple scattering effects, adding large uncertainties to the retrieval process. For this reason, the set of measured spectra has to be cloud-screened, filtering out those spectra affected by clouds. In order to achieve that, the cloud-free AERONET database was used. The AERONET (AErosol RObotic NETwork) project is a global network of ground-based remote sensing instruments established by NASA and PHOTONS (https://aeronet.gsfc.nasa.gov/new_web/index.html) which measure aerosols and their optical, microphysical and radiative properties. The AERONET instruments provide a long-term, continuous and readily accessible public domain database of aerosol measurements worldwide. These databases are reported with three quality levels, in particular, we used the Level 2.0 (cloud-screened and quality-assured) database provided by the AERONET instrument placed in Madrid to flag the cloudy atmosphere and discard the related measured spectra. After that, the remaining spectra can be regarded as cloud-free.

Since we are dealing with a non-linear, least-squares system of equations, there is a notable gradient concerning the quality and uncertainties in the results. Hence, before proceeding with the profiling algorithm, several quality filters were applied to the DSCDs: firstly, every DSCD that yielded either a relative uncertainty larger than 1 or a residual Root Mean Square (RMS) higher than 0.01 (in optical density units) was rejected. After that, we estimated the DSCDs detection limit for a given trace gas as the ratio of the residual RMS (in optical density units) associated to each DSCD and the maximum value of the differential cross section of that trace gas. Then, we discarded the DSCDs that had an absolute value lower than twice the derived detection limit (a similar approach was carried out in Peters et al., 2012). Finally, we used the daily plus/minus three standard deviation criterion that AERONET applies for its cloud-filtered data, keeping the DSCD that fall within plus/minus three standard deviations from each daily mean.

4.2 Inversion algorithm and vertical profiles

We apply inversion algorithm methods to the measured DSCDs to estimate the light paths and subsequently derive the trace gas vertical concentration profile. The main idea behind these inversion algorithms is based on the fact that each VEA has different scattering heights and light paths (Solomon et al., 1987). Therefore, a given set of measured DSCDs contains

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information about the vertical distribution of a certain trace gas. Since higher VEAs are generally related to higher scattering heights, different layers within the atmosphere can be sampled, especially in the lower troposphere.

The algorithms that calculate these scattering events are called Radiative Transfer Models (RTMs), and they study the transport of radiation as well as its interaction with matter. There are several RTMs for atmospheric applications, but for this work we have used the bePRO inversion algorithm, developed at BIRA-IASB (Clémer et al., 2010). The original calculation was built based on the Optimal Estimation Method (OEM; Rodgers, 2000) and it comprises two steps: first, the light paths and the vertical profiles of irradiance extinction are calculated using the O_4 DSCDs; then, the target trace gas vertical concentration profile is retrieved using the corresponding light paths and measured absorption. In order to do that, bePRO simulates the atmospheric state characterizing several different physical phenomena including pressure and temperature vertical profiles, Rayleigh and Mie scattering events (along with their respective phase functions), the effect of the surface albedo, the light path geometries or the irradiance extinction processes. Once the atmospheric vector state is defined, its combination with a certain vertical concentration profile results in the simulated DSCDs. This vertical profile is iterated until the generated set of simulated DSCDs is optimized with respect to the measured DSCDs so that the residual is minimized. As a result, an optimal vertical profile is obtained when the iteration is finished for each MAXDOAS cycle.

The measured O_4 DSCDs are used to estimate the light paths for each VEA since they are related to the square of the atmospheric O_2 profiles, which are well-known. This profile is fairly steady during the day and does not heavily depend on chemistry factors. Therefore, the measured O_4 DSCDs can provide information on the irradiance extinction in the atmosphere. This extinction profile, retrieved using bePRO, is usually associated with the aerosol extinction coefficients and thus, its vertical integration yields the Aerosol Optical Depth (AOD). These aerosol extinction profiles are required to subsequently evaluate trace gas profiles since they strongly affect the relative light paths and hence the concentration profiles derived from them.

Once the light paths are computed in the previous step, an analogous process is repeated for the measured DSCDs of the target trace gas, yielding the optimal vertical concentration profile. The vertical integration of this concentration profile is called the Vertical Column Density (VCD).

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The retrieval consists of an iterative, nonlinear system of equations, and hence there is no unique solution. This means that an a priori profile is needed, both for starting the iterations and to avoid the final solution to be non-realistic (i.e. with no physical meaning). In order to construct these a priori profiles we used exponentially decreasing curves as follows:

$$ap\ (z) = \frac{VC_i}{sh} exp\ \left(\frac{-z}{sh}\right) \qquad (2)$$

where $ap\ (z)$ is the a priori vertical profile at a certain altitude z, VC_i is the vertical integration of the profile for the MAXDOAS cycle i and sh is the scaling height constant. We used 0.5 km as the scaling height constant for all the a priori profiles (Hendrick et al., 2014). Regarding the VC, we assumed an AOD of 0.05 for the O_4 retrieval, while for NO_2 we applied the geometrical approximation followed in Hönninger et al., 2004, taking the measured DSCD at VEA 30º for every MAXDOAS cycle. This approximation assumes that most of the absorption events are located below the scattering height.

With respect to the remaining atmospheric parameters, we chose typical values for urban environments: surface albedo of 0.07, correlation length of 0.4 km and an a priori covariance factor of 1 (see Hendrick et al., 2014). However, the most important set of parameters are the atmospheric profiles such as the air number density vertical profile since it is directly related to the number of O_4 absorptions, and therefore to the O_4 DSCDs. Hence the relative differences, particularly for lower VEAs, between the measured and simulated O_4 DSCDs are usually assigned to aerosol extinction. Note however, as shown below, that uncertainties in the air number density profiles -arising from uncertainties in the values or shape of the temperature and pressure profiles- could also explain such differences (Fig. 4).

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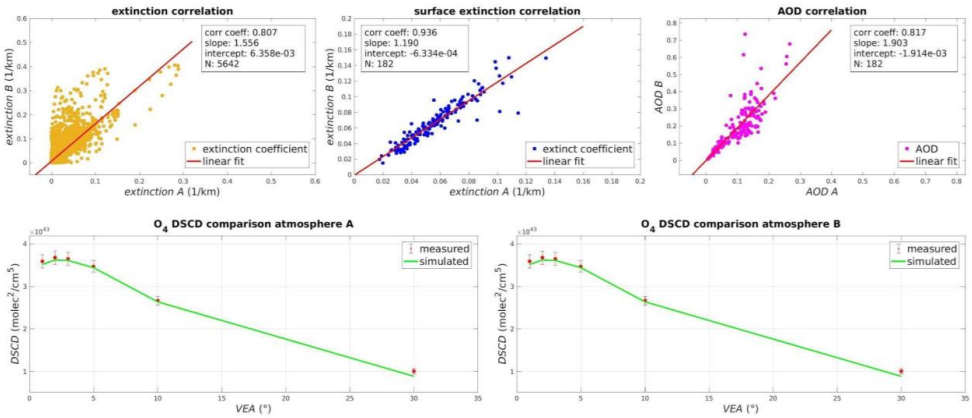

Figure 4. Comparison of retrieved aerosols using two different atmospheric profiles: the US Standard (atmosphere A) and the US Standard adapted to the altitude above sea level of Madrid (atmosphere B).

Here we compare the simulation of O_4 DSCDs using two different sets of atmospheric profiles: i) the US Standard, and ii) the same profile but interpolating the pressure profile to Madrid´s height above sea level (mean value of 667 m). This means that the temperature profile is assumed to be the same but the pressure profile is shifted less than 10%, so there are no major variations within the profiles. The lower row in Fig. 4 shows that both atmospheric profiles result in almost the same set of simulated O_4 DSCDs, however the aerosol extinction coefficients differ significantly (although less for the surface layer coefficients), and consequently, the AOD also varies. From this we infer that:

i) the retrieval is mainly driven by the measured DSCDs, which leaves a relatively low weight for the chosen atmospheric profiles (pressure and temperature). Therefore, we can achieve very consistent, solid correlations between the measured and simulated O_4 DSCDs.

ii) we cannot reliably assign the extinction coefficients at each layer to particulate aerosol (especially for atmospheric layers above the surface layer), but rather consider them as irradiance extinction coefficients.

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Furthermore, we have assessed the impact of the pressure and temperature profiles choice on the trace gas retrieval. As can be noted in Fig. 5, there is no significant effect coming from this choice on the simulated NO_2 DSCDs. These are basically the same (and with very good agreement with the measured DSCDs), as well as the derived concentration coefficients and their integration (VCD). Consequently, we have decided to use the US Standard atmospheric profiles for the NO_2 retrievals in this study.

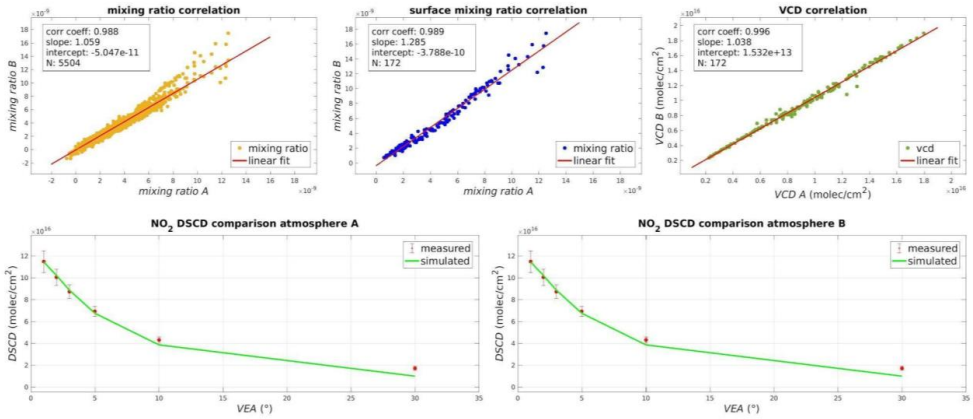

Figure 5. NO_2 retrieval comparison using two different atmospheric profiles: the US Standard (atmosphere A) and the US Standard adapted to the altitude above sea level of Madrid (atmosphere B).

4.3 Estimation of NO_2 horizontal gradients

Making use of the different paths that photons travel through the atmosphere for different wavelengths, we can estimate the horizontal distribution of NO_2. We use the estimated horizontal light paths at two wavelengths, 360.8 nm and 477 nm, for the surface layer (0-200 m height). The different light paths at 360.8 and 477 nm provide information about the horizontal distribution of NO_2 mixing ratios within the surface layer. In order to evaluate these horizontal paths, we have used our own MATLAB codes that implement the RTM equations based on previous pioneering work (Solomon et al., 1987). These equations yield a vector of scattering events along with their respective probabilities. If we take a VEA of 0 degrees (i.e. horizontal viewing), then the scalar product of such vectors produces the length of the

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horizontal light path. We computed this for every MAXDOAS cycle and for both wavelengths. The next step follows the "onion-peeling" approach proposed by Ortega et al. 2015 (the strong dependence of scattering with wavelength means that shorter wavelengths result in shorter light paths). Therefore, we first assign the UV (i.e. 360.8 nm) mixing ratios (mr_{uv}) and their expected horizontal paths (d_{uv}) to the first peel (mr_A, meaning zone A). Then the second peel (zone B, mr_B) can be derived as:

$$mr_B = \frac{mr_{vis} \times d_{vis} - mr_{uv} \times d_{uv}}{d_{vis}} \quad (3)$$

Thus we can derive mixing ratio values (mr_a and mr_b) representative of two different horizontal distances for each VAA.

5 Results

5.1 O_4 and NO_2 DSCDs assessment

Once the vertical profiles are retrieved using the RTM explained in Sect. 4, we compare the set of simulated DSCDs predicted by the model with the measured DSCDs coming from the absorption analysis. An estimation of the overall goodness of the profile retrieval comes from the correlation between the measured and simulated DSCDs for the entire campaign (Fig. 6).

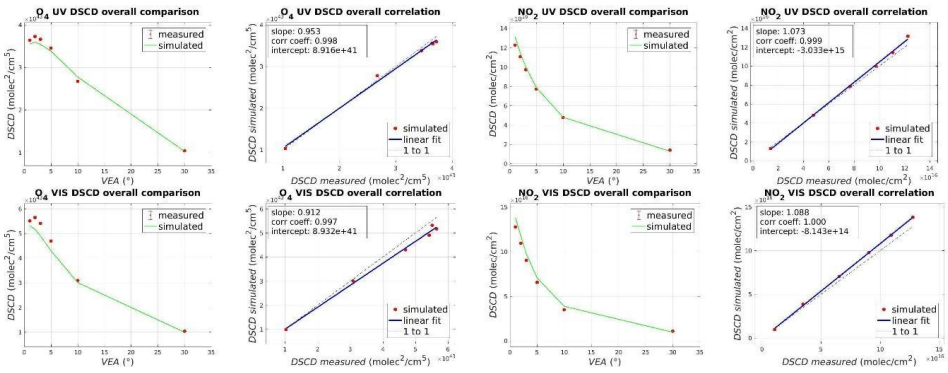

Figure 6. Comparison between simulated and measured DSCDs of O_4 and NO_2.

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The fit between the measured and the simulated DSCDs show correlations (r^2) very close to 1 for both O_4 and NO_2 in the UV and VIS regions. As mentioned before, the inverse retrieval finds the optimal solution of the vertical concentration profile that generates the best set of simulated DSCDs so that they match the measured ones.

5.2 Two-dimensional maps

We now combine the VAA and height for each azimuthal cycle of the MAXDOAS-2D to generate a two-dimensional concentration map. Fig. 7 shows an example of the O_4 retrieval in the UV for a given azimuthal cycle. In addition to the profiles, Fig. 7 also shows the comparison and correlation of measured and simulated DSCDs for that azimuthal cycle, along with the evolution of retrieved AOD. The AOD varies between 0.05 and 0.18 within this azimuthal cycle (Fig. 7, upper panel). The contour plot shows the irradiance extinction coefficient profiles with maximum values of 0.14 km^{-1} (near the ground and at around 40º VAA) associated with aerosol extinction (see discussion in Sect. 4.2).

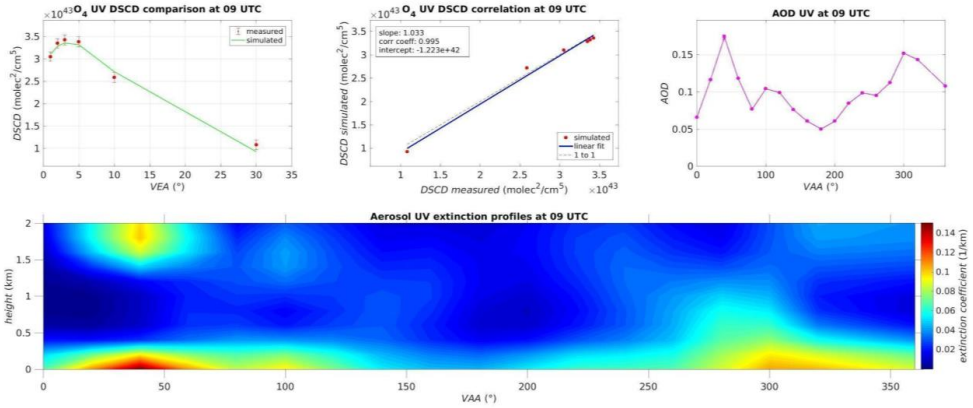

Figure 7. Example of O_4 and AOD retrievals in the UV region at 9 UTC on May 11, 2019. These contour plots are smoothed from adjacent VAA data points separated by 20º in order to estimate the azimuthal distribution of the irradiance extinction coefficients over Madrid.

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Figure 8 presents a two-dimensional representation of NO_2 on May 11, 2019 at two different hours (6 UTC and 12 UTC, respectively). Both contour plots show maximum NO_2 values of 12 ppbv at 6 UTC and 8 ppbv at 12 UTC, when the instrument is pointing south (i.e. VAA of 180º). These values are found in the layer near the ground and are in good agreement with our previous MAXDOAS observations in Madrid (Garcia-Nieto et al., 2018). The retrieved azimuthal distribution of NO_2 agrees with previous reports that show higher pollution levels in the southern section of Madrid (Picornell et al., 2019). NO_2 VCDs range from $5x10^{15}$ molecules cm^{-2} (at 12 UTC and pointing at 300 º VAA) up to $15x10^{15}$ molecules cm^{-2} (at 12 UTC and pointing at 200º VAA), with an average value of $1x10^{16}$ molecules cm^{-2}. Although there can be different NO_X emission rates at both times of the day (6 and 12 UTC), the increase in the boundary layer height during the day could explain the similar values of VCDs at both hours but generally lower surface mixing ratios at 12 UTC. Note that NO_2 is efficiently mixed within the boundary layer as it develops during the day (i.e. boundary layer height usually lags the solar zenith angle) (Fig. 8) (de la Paz et al., 2016).

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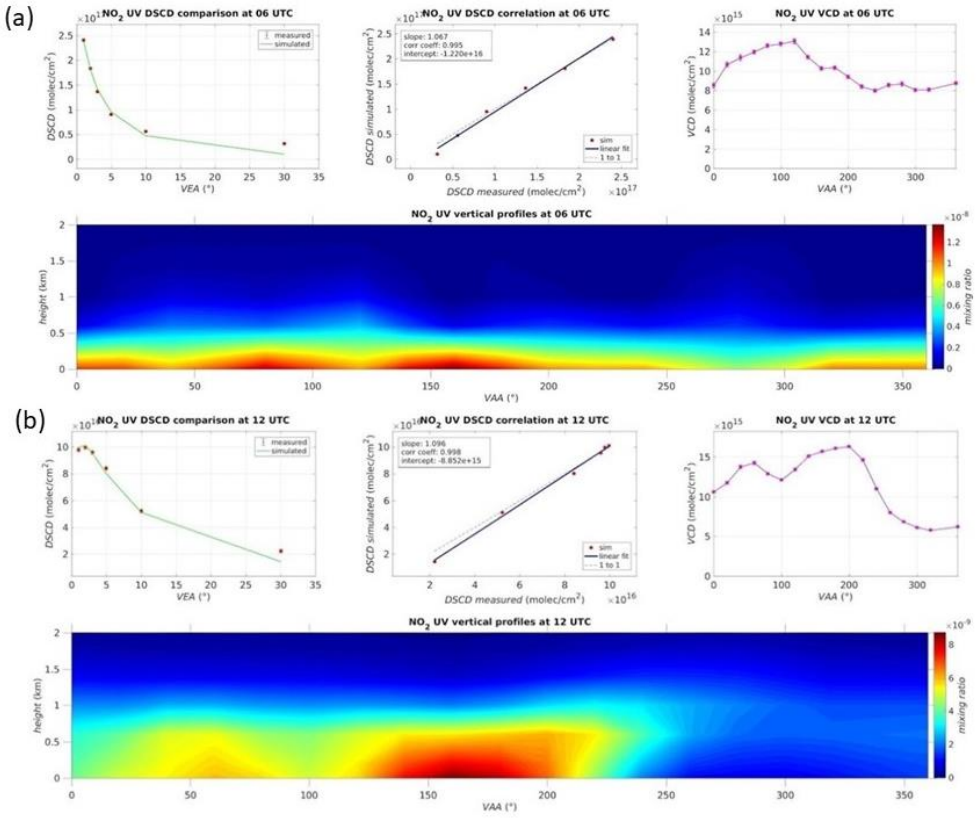

Figure 8. NO_2 vertical distribution retrieved in the UV region at 6 UTC (a) and at 12 UTC (b) on May 11, 2019. These contour plots are smoothed from adjacent VAA data points separated by 20º in order to estimate the azimuthal distribution of NO_2 over Madrid.

5.3 Horizontal distribution of NO_2

Based on Eq. (3), we derive the horizontal distribution of NO_2 in the surface layer (0-200 m height). Figure 9 shows an example of surface layer NO_2 mixing ratios over horizontal distances from the MAXDOAS-2D instrument, located at the center of the plot. The highest mixing ratios occur during the first sunlit hours (7-8 UTC), coincident with the peak in NO_X emissions in Madrid (Quassdorff et al., 2016). This early mooring peak is followed by a gradual

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decrease in surface layer NO_2 mixing ratios during the day. Note that NO_2 is predominantly located in the southern part of the semisphere (VAA from 90º to 270º).

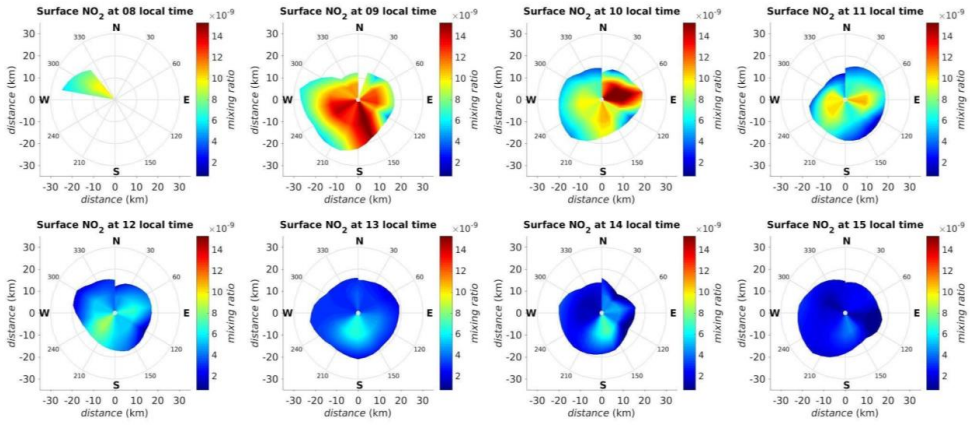

Figure 9. Polar plots of NO_2 within the surface layer (0-200 m height) for May 11, 2019. Please note that these contours extend over a direction perpendicular to those shown in Fig. 8. These contour plots are smoothed from adjacent VAA data points separated by 20º and from the two different horizontal light paths in the radial direction.

5.4 Correlation with Madrid´s in-situ air quality monitoring stations

We suggest that MAXDOAS-2D mesoscale observations may complement the information provided by the local air quality monitoring network based on reference analytical techniques (according to Directive 2008/50/EC). While air quality monitors of the reference network provide information about ambient concentrations in their specific locations (currently 24 air quality monitoring stations measure NO_2 within the city, see AM, 2019), MAXDOAS-2D observations produce near ground-level concentrations averaged over the optical path in a given direction. That prevents us from quantitatively comparing both types of observations. Nonetheless, we analyzed their correspondence using the NO_2 concentrations measured by the in-situ instruments throughout the entire city, and the NO_2 mixing ratios within the surface layer derived from our MAXDOAS-2D instrument over the 2-month period (May-June, 2019). For this comparison, we considered the in-situ stations that were within a distance from the MAXDOAS-2D that is equal or lower than the typical horizontal light path for the UV region

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(roughly of about 10 km). Strong gradients between the values measured by the in-situ instruments are typical. Therefore, and considering that we are mainly interested in their temporal correlation with respect to our MAXDOAS-2D measurements, we compare both the in-situ NO_2 and surface layer MAXDOAS-2D hourly-averaged data. Note that for the MAXDOAS-2D this approximately corresponds to averaging the surface layer values for each azimuthal lap, given that each azimuthal lap takes approximately 1 hour to complete.

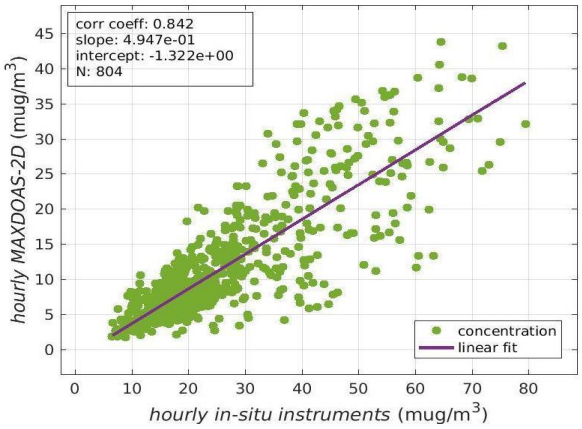

Figure 10. Correlation between in-situ observations from Madrid´s air quality monitoring network and those derived from the MAXDOAS-2D instrument for the surface layer (0-200 m height).

Despite the different spatial representativeness, Figure 10 shows a reasonably good correlation coefficient of 0.842 between both datasets for the two-month campaign. The slope is lower than 1, this can be explained by the typical NO_2 vertical profiles in urban environments. Simulations performed over Madrid with a high-resolution Eulerian air quality model (Borge et al., 2018) yielded an exponentially decreasing with height NO_2 profile. Therefore, the MAXDOAS-2D mixing ratios, which represent an average across the surface layer (0-200 m height), are not expected to quantitatively match the values of in-situ instruments, located close to the surface (between 0-10 m height). Nevertheless, there is a good temporal correlation between in-situ and MAXDOAS-2D measurements over an extended period of time.

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6 Summary and Conclusions

A complete analysis of O_4 and NO_2 vertical concentration profiles in the urban atmosphere of Madrid (Spain) has been performed over two months (from May 6 to July 5, 2019). We analyzed the absorptions and derived the corresponding DSCDs for both trace gases in the UV and VIS regions. Then, the corresponding profiles were retrieved using a RTM. In this step, we assessed the impact of different atmospheric profiles (pressure and temperature) in the retrieval results. The overall comparison of measured and simulated DSCDs showed that they were in very good agreement in all cases, supporting the reliability of the observations. This MAXDOAS-2D instrument provides a two-dimensional view (in height and VAA) of concentration profiles. We have also inferred information on the horizontal gradient of NO_2 within the surface layer making use of the strong dependence between wavelengths and light paths across the NO_2 absorption spectrum. The resulting "onion-peeling" figures indicate peak values of NO_2 in the early morning and in the southern section of the city (around 180 º VAA). We suggest that the new mesoscale information provided by the MAXDOAS-2D instrument helps in the study of pollution transport dynamics in Madrid.

Author Contribution

A.S-L. devised the research. D.G-N. and N.B. carried out the measurements and analyzed the data. D.G-N., N.B., R.G. and A.S-L. analysed and interpreted the results. D.G-N. wrote the manuscript with contributions from all co-authors.

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