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# Vertical distribution characteristics and potential sources of atmospheric pollutants in the North China Plain basing on the MAX-DOAS measurement

Guohua Liu<sup>1</sup> and Yu Wang<sup>1,2\*</sup>

## Abstract

The mechanism for the generation of atmospheric pollution sources can be further investigated through the examination of atmospheric evolution and diffusion characteristics. The authors of this study conducted a 3-month MAX-DOAS (multi-axis differential optical absorption spectroscopy) vertical observation in Shijiazhuang City, North China Plain, in the summer of 2020 in response to the long-standing air pollution issues in the region. The vertical distribution profiles of aerosol, NO<sub>2</sub>, HCHO, and CHOCHO were generated, and the inversion findings showed good agreement with the TROPOMI (tropospheric monitoring instrument) satellite remote sensing validation, demonstrating the validity and accuracy of the observations. The near-surface boundary layer is home to the majority of the NO<sub>2</sub>, HCHO, and CHOCHO species. The species' daytime evolution trends varied, with the highest NO<sub>2</sub> peaks occurring in the morning and evening commute, the highest HCHO peaks occurring in the morning at 10:00 a.m., and CHOCHO's concentration during the day declined. Two minor aerosol pollution processes took place in Shijiazhuang City during the summer observation period. The elevated concentrations of NO<sub>2</sub>, CO, and the PM2.5/PM10 ratio during the pollution processes suggest that anthropogenic emissions, particularly biomass burning, were responsible for the large number of fine particles generated during the pollution events. Based on the examination of pollutant concentration profiles and meteorological data, it was determined that local emissions and north wind transport were the primary causes of Shijiazhuang's high NO<sub>2</sub> values. Meanwhile, the southern region of Shijiazhuang was primarily responsible for the majority of the potential sources of atmospheric HCHO, and local emissions were also a major factor affecting the high CHOCHO values. Shijiazhuang's local near-surface volatile organic compounds (VOCs) are mostly caused by human emissions, although biomass burning and its regional transportation have a greater influence on the middle and upper boundary layers. This study systematically sorted the evolution characteristics and potential sources of pollutants in Shijiazhuang City during the summer based on the joint observations of various pollutants, including NO<sub>2</sub>, HCHO, and CHOCHO. These results can be used to support the development of appropriate policies for the prevention and control of pollutants in the Shijiazhuang local area of the North China Plain.

**Keywords** MAX-DOAS, Air pollutants, Pollution processes, Vertical profiles, Possible sources

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## Introduction

People who are exposed to polluted air for an extended period of time face serious risk to their health from the environment [1–3]. This risk includes respiratory and related cardiovascular diseases. Elevated levels of pollutants have the potential to damage urban structures, impair visibility in the atmosphere, and even lower agricultural productivity [4]. Over the last few decades, China's major urban agglomerations have seen a significant increase in primary pollutant emissions due to rapid urban development and rising motor vehicle ownership [5]. The North China Plain and the Beijing–Tianjin–Hebei (BJH) region have seen particularly high levels of fine particulate matter (PM<sub>2.5</sub>) and Ozone (O<sub>3</sub>) pollution events [5–7]. Situated in the northern part of the North China Plain, the Beijing–Tianjin–Hebei region is a populous political and economic hub of China [8]. This area has always been the core region for research on environmental pollution [9, 10].

High concentrations of PM<sub>2.5</sub>, or fine particles suspended in the atmosphere with a diameter of less than 2.5 μm, are the primary cause of haze [11, 12]. Along with being the main source of direct emissions, PM<sub>2.5</sub> and O<sub>3</sub> are significant atmospheric secondary pollutants [13–15]. Because of the intricacy of the secondary reaction production, these are mainly generated by a variety of air pollutants (such as sulfur dioxide, nitrogen oxides (NO<sub>x</sub>), volatile organic compounds (VOCs), and so on). [16]. The evidence of air haze, O<sub>3</sub> pollution, secondary pollution generation, and regional pollution characteristics has been mounting in recent years [17–19]. The pollution levels of PM<sub>2.5</sub> and O<sub>3</sub> resulting from gaseous precursors in the secondary generation of a progressively higher percentage of the regional transmission flux have experienced a notable increase [20]. Research indicates that nitrate, sulfate, and other secondary aerosol concentrations in the Beijing–Tianjin–Hebei region will experience explosive growth during PM<sub>2.5</sub> pollution events. Their contribution to PM<sub>2.5</sub> will rise from 37.3% on weekdays to 56.9% during the pollution period, significantly raising the concentration of PM<sub>2.5</sub> in the atmosphere [21, 22]. Furthermore, one of the main causes of pollution outbreaks is the horizontal and vertical transfer of pollutants [23]. Over the past 2 years, a number of studies have shown that the horizontal and vertical transfer of precursors and ozone may be the primary cause of the North China Plain's recurring summer pollution disasters [24]. Therefore, for the study of pollution causes and mechanisms, it is crucial to comprehend the spatial and temporal evolution characteristics of air pollutants and their precursors. In addition to the dearth of observational studies on the vertical distribution characteristics of these pollutants, prior research on air pollution

has primarily concentrated on the evolutionary mechanisms of near-surface PM<sub>2.5</sub> or O<sub>3</sub>, with fewer reports on the observation of their common precursors.

An emerging ground-based optical remote sensing technique called ground-based multi-axis differential absorption spectroscopy (MAX-DOAS) allows one to simultaneously observe the concentration distribution of several air pollutants, including sulfur dioxide (SO<sub>2</sub>), nitrogen dioxide (NO<sub>2</sub>), formaldehyde (HCHO), nitrous acid (HONO), glyoxal (CHOCHO), and others [13, 25–28]. The sun's scattered light is gathered by the MAX-DOAS instrument from various elevation angles, resulting in a series of observations [29]. MAX-DOAS is an inexpensive device that can be used for long-term field observations and supports unattended field observations [30]. The gathered spectra can be quantitatively analyzed using the Lambert–Beer law to ascertain the integral concentrations of various pollutant components along the optical path. When paired with the best estimation technique, it is possible to invert several pollutants' vertical profiles at once.

MAX-DOAS has been widely used in the study of atmospheric pollution and the calibration of satellite observation, because it can simultaneously obtain the vertical profiles of pollutants and the total amount of tropospheric columns [31–34]. The characteristics of the vertical distributions of HCHO and NO<sub>2</sub> in the Huaihe River Basin were simultaneously obtained by Ren et al. [35], through an outfield observation conducted in September 2020 in Hefei, a key city in the Huaihe River Basin, based on MAX-DOAS observations. Subsequently, the authors examined the contribution law of the precursors' evolution to the production of ozone. An investigation of the effects of open burning of straw on the quality of the air near the Yangtze River was conducted by Tian et al. in June 2021 through observation experiments in three major cities in the Yangtze River Delta: Hefei, Nanjing, and Shanghai [36]. Between December 2018 and January 2019, Li et al. conducted aerosol observations in Sanmenxia. They looked into the vertical distribution of aerosols, source contribution, and the characterization of the different types of aerosols as well as the impact of PM<sub>2.5</sub>'s chemical composition on aerosol extinction (AE) [33].

In Shijiazhuang, in the Beijing–Tianjin–Hebei region, we conducted ground-based MAX-DOAS observations for this study. In the summer of 2020, we concurrently acquired the total tropospheric columns (TTCs) and vertical column densities (VCDs) of aerosol extinction, NO<sub>2</sub>, HCHO, and CHOCHO. Among them, the HCHO and NO<sub>2</sub> tropospheric column totals VCDs were validated with satellite observations; the results show good agreement, suggesting the accuracy and dependability of

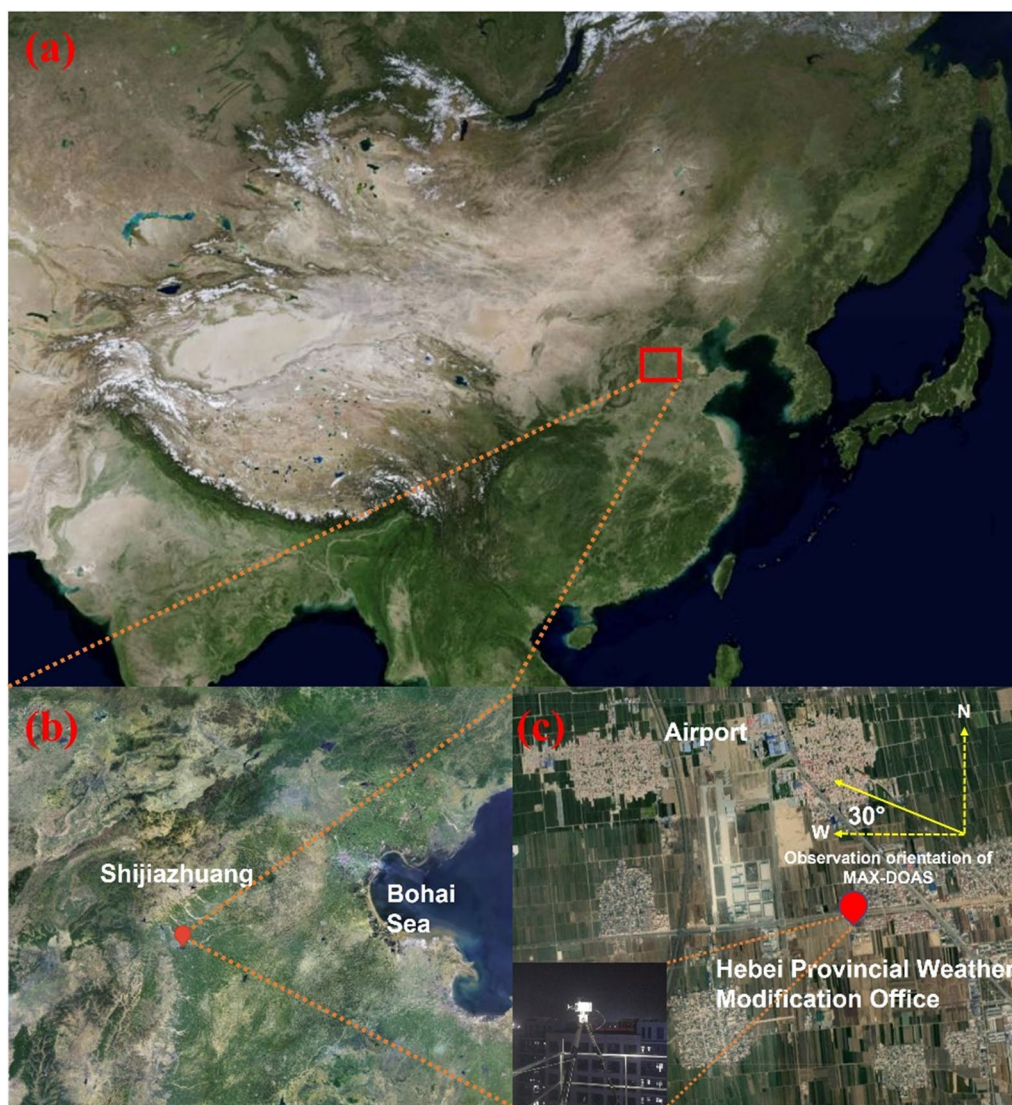
the MAX-DOAS observations. In addition to analyzing the development and emission properties of these contaminants at different elevations, we also investigated the potential origins of NO<sub>2</sub>, HCHO, and CHOCHO in the Shijiazhuang region by integrating our results with data on the regional wind patterns.

## Materials and methods

### Introduction to observation experiments

To investigate the features of the vertical distribution of pollutants in the North China Plain during the summer, as well as the temporal evolution pattern and potential source areas, field observations were conducted in

Shijiazhuang City, Hebei Province. Included in the observation period was MAX-DOAS, and it spanned the whole summer of 2020, from June 1 to August 31, 2020. The MAX-DOAS instrument was used for the outfield observation. It is situated approximately 15 m above the ground on the roof of the Hebei Artificial Weather Office (114.62° E, 37.91° N). The Hebei Provincial Weather Modification Office is situated in the southeast of Shijiazhuang, which is a city in Hebei Province. Shijiazhuang is situated in the southwest transmission corridor of Beijing. The site's southern portion is a sizable rural area, while the site's northern portion is a typical urban area. The location of Shijiazhuang in China is



**Fig. 1** Relative geographic location of observation sites [subfigure **a** shows the location of Shijiazhuang City in China, subfigure **b** shows the location of the sites relative to the North China Plain, and subfigure **c** shows the location of Shijiazhuang City, where the Hebei Provincial Weather Modification Office is located]

shown in Fig. 1a. The location of Shijiazhuang in China's North China Plain is shown in Fig. 1b, along with a satellite image map of the area in Fig. 1c. The scattered light from the sun in this direction is continuously collected at all elevation angles, with the instrument observation direction being 10° north by west.

### Introduction to MAX-DOAS observation and data processing

The two main components of the MAX-DOAS instrument used in the observation experiments are the telescope outboard and the spectrometer inboard. The telescope outboard is equipped with two step motors to control the azimuth and elevation angles of the telescope, with an accuracy of less than 0.1° for the elevation motors. The telescope has a convex lens to converge the scattered light from the sun, and its field of view is less than 0.3°. The converged sunlight is directed by an optical fiber to the spectrometer inside the instrument, which is made up of two spectrometers (model AvaSpec-ULS2048L-USB2). The spectrometers cover the bands of 296–408 nm and 420–565 nm, respectively, and they have a spectral resolution of 0.60 nm. A 2048-pixel charge-coupled device (CCD) within the spectrometer transforms the optical signals into electrical signals. A bolometer regulates the spectrometer's temperature, and it maintains a steady 20 °C inside during the observation period, which can significantly lower the spectrometer's thermal noise. Using optical fibers, the sun-scattered light collected by the hyperspectral remote sensing instrument's outboard unit is fed into the spectrometer, where the sun-scattered spectra are left unsupervised for storage.

During the outfield observation, the azimuth of MAX-DOAS is set to 350°. The instrument automatically

collects the scattered light from the sun during the day and the dark current and bias spectra during the night, and the entire process can be automatically controlled by a script on the industrial computer in unattended mode. The full measurement sequence of MAX-DOAS consists of 11 elevation angles of 1°, 2°, 3°, 4°, 5°, 6°, 8°, 10°, 15°, 30°, and 90°. The entire process can be automated by a script on the industrial computer in unattended mode.

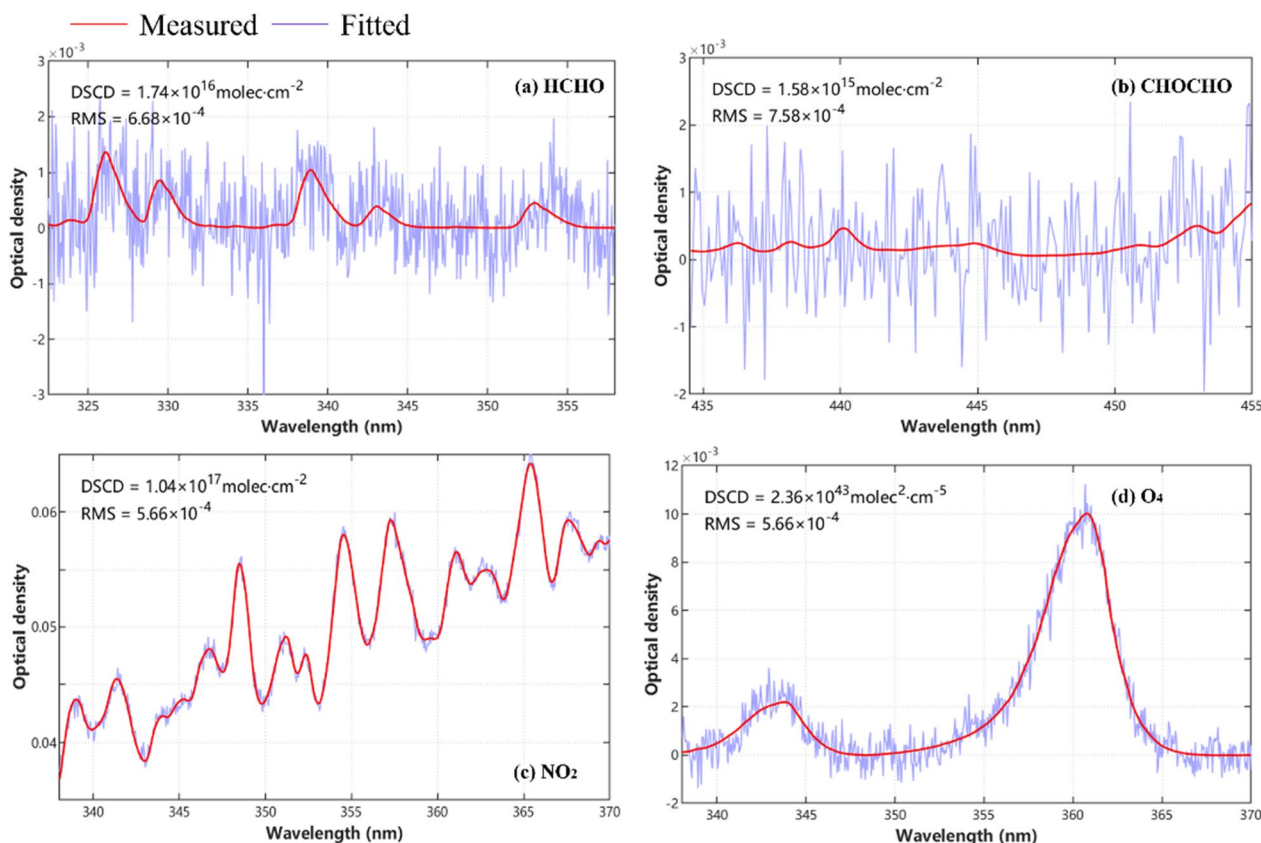
### MAX-DOAS spectral analysis

First, the solar spectra acquired by MAX-DOAS must be spectrally analyzed using the Lamb–Beer law. BIRA-IASB developed QDOAS software, which processes the data. The differential slant column densities (DSCDs), or the difference between the slant column densities (SCDs) on the observation path at the observation elevation angle and zenith angle, was obtained following spectral analysis. The specific parameters for the spectral analysis of oxygen dimer ( $O_4$ ),  $NO_2$ , HCHO, and CHOCHO in this investigation are displayed in Table 1, with reference to earlier comparable studies. Among them, the spectral analysis bands of HCHO and CHOCHO were 336.5–359 nm and 431–460 nm, respectively, the spectral analysis bands of  $O_4$  and  $NO_2$  were 338–370 nm, and the spectral analysis bands of  $O_4$  and oxygen ( $O_2$ ) is a dimer of atmospheric oxygen O, which is frequently utilized in MAX-DOAS observations to invert aerosol extinction coefficient profiles.

Figure 2 illustrates typical cases of spectral analysis fittings for these four trace gases. The black line represents the sum of the trace gas signals and the spectral fitting noise, while the red line represents the fitting results for the corresponding trace gases. The findings demonstrate that the signal-to-noise ratios of all four gases are good, and the spectral analysis is rational

**Table 1** DOAS retrievals settings used for  $NO_2$ ,  $O_4$ , HCHO, and CHOCHO DOAS spectral analysis

parameter	Data source	Fitting internal (nm)			
		$O_4$	$NO_2$	HCHO	Glyoxal
Wavelength range		338–370	338–370	322.5–358	431–461
$NO_2$	298K, I0 correction (SCDs of 1017 molecules $cm^{-2}$ ) Vandaele et al. [37]	√	√	√	√
$NO_2$	220K, I0 correction (SCDs of 1017 molecules $cm^{-2}$ ), pre-orthogonalized; Vandaele et al. [37]	√	√	×	√
$O_4$	293K; Thalman and Volkamer [38]	√	√	√	√
HCHO	297K; Meller and Moortgat [39]	√	√	√	×
CHOCHO	296K; Volkamer et al. [40]	×	×	×	√
Ring	Ring spectra calculated with QDOAS according to Chance and Spurr [41]	√	√	√	√
Polynomial degree		Order 3	Order 3	Order 5	Order 5
Intensity offset		Constant	Constant	Constant	Constant
Wavelength calibration	Based on a high-resolution solar reference spectrum (SAO2010 solar spectra); Chance and Kurucz [41]				



**Fig. 2** Typical spectral analysis results for  $O_4$ ,  $NO_2$ ,  $HCHO$ , and  $CHOCHO$  (this spectrum is the  $x^\circ$  solar scattering spectrum, taken at  $x$  time  $xx$  minutes)

and efficient enough to invert and produce the DSCDs signals in the spectra. To mitigate the impact of clouds on remote sensing accuracy, this study employed the color index method in conjunction with a first screening step that removed DSCDs with spectral analysis residual RMS greater than  $2 \times 10^{-3}$  before proceeding with further profile inversion (CI), in which the light intensity ratio at 330 nm to 390 nm was chosen as the indicator factor to determine the cloudy periods. To reduce analytical error, profile data were filtered out during the cloudy periods.

**MAX-DOAS profile inversion**

The DSCDs were inverted as a vertical contour of pollutant concentration as part of the MAX-DOAS further data analysis. This contour inversion was made possible by a profile inversion algorithm, which is based on the optimal estimation method (OEM) and uses SCIATRAN as the forward model for radiative transfer models [26, 42]. Using DSCDs observations and simulated values, the algorithm builds an iterative objective value function, which is displayed in Eq. 1.

Nonlinear iterative inversion is then used to obtain the pollutant concentration contours [42]:

$$x^2 = (y - F(x, b))^T S_\epsilon^{-1} (y - F(x, b)) + (x - x_a)^T S_a^{-1} (x - x_a) \tag{1}$$

where  $F(x, b)$  is the simulated value for the forward model of DSCDs,  $x$  is the vertical profile vector,  $b$  is the atmospheric parameters (such as temperature profile, surface albedo, a prior information, and atmospheric pressure) required for the forward model operation,  $y$  is the measured DSCDs, and  $x_a$  is the simulated value of the forward model DSCDs;  $S_\epsilon$  and  $S_a$  are the covariance matrices of the measured value of the DSCDs,  $y$ , and the vertical profile vector,  $x_a$ , respectively. The process of inverting the aerosol and trace gas profiles involves two steps: first, the inversion yields the aerosol extinction coefficient profiles and the parameters of the aerosol optical thickness (AOD) based on the measured values of  $O_4$  DSCDs at various observation elevation angles as inputs; second, the inversion of  $NO_2$  is carried out using the aerosol extinction coefficient profiles and measured values of DSCDs for the trace gases as inputs and  $HCHO$  and

CHOCHO as inputs to invert the vertical profiles of trace gases, such as NO, HCHO, and CHOCHO.

The prior aerosol and trace gas profiles were set as profiles with a decreasing height  $e$ -index in the profile inversion. The near-surface 4 km altitude contours had a height resolution of 200 m from 2 to 4 km, and they were separated into 30 concentration-averaged layers within 2 km of the boundary layer. The near-surface concentrations of aerosols, NO<sub>2</sub>, HCHO, and CHOCHO, were set at 0.2 km<sup>-1</sup>, 5 ppbv, 2 ppbv, and 0.2 ppbv, respectively, and the scale height of a priori profile was 1 km. The aerosol optical parameters that were selected for the optimal estimation algorithm's parameterization were those that are typically found in urban areas: an asymmetry factor of 0.68, a single scattering albedo of 0.92, and a surface albedo of 0.05.

#### Presentation of other observational data

Meteorological data were used in this study to help analyze the possible sources of contribution of different pollutants in the presence of meteorological wind fields. The National Weather Service Science Data Center (<http://data.cma.cn/>) provided meteorological data for the following parameters: temperature, relative humidity, wind direction, and surface wind speed. The study utilized the meteorological data site number 536980, which is situated roughly 5 km away from the ground-based MAX-DOAS observation site.

#### Total HCHO, CHOCHO tropospheric columns observed by TROPOMI satellite

For a range of worldwide atmospheric pollutants (e.g., NO<sub>2</sub>, HCHO, etc.), daily tropospheric pollutant level distribution results can be obtained from TROPOMI satellite observations [43–45]. The differential slant column concentration (DSCD) of a pollutant in the atmosphere is determined by spectral analysis using data from the TROPOMI satellite, which also computes the atmospheric mass factor (AMF) through forward radiative transfer simulation. The VCDs are obtained by dividing the DSCDs by the AMF. The observation angle of the satellite with respect to the sun and the data on atmospheric aerosols are input during the SCIATRAN forward simulation, from which the AMF is computed. Every day at 13:30 (Beijing time), the TROPOMI satellite transits, offering validation for ground-based MAX-DOAS observations with a horizontal resolution of 3.5 × 7 km.

## Results

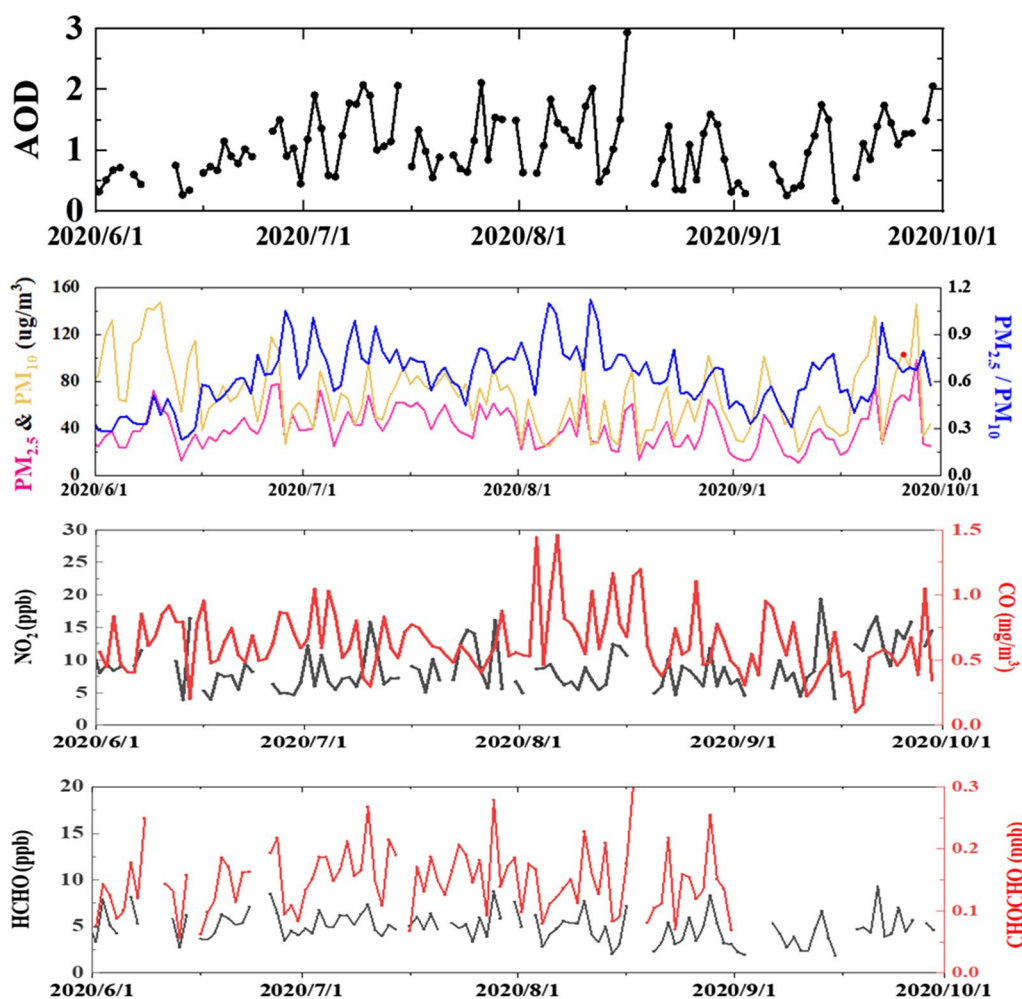
### Observation results overview

Figure 3 shows the time series of aerosol optical thickness, PM<sub>2.5</sub>, PM<sub>10</sub>, and PM<sub>2.5</sub>/PM<sub>10</sub>, NO<sub>2</sub>, carbon monoxide (CO), HCHO, CHOCHO, and the

meteorological parameters of wind speed and direction, temperature, and humidity during the 3-month outfield observation period, which ran from June 1 to August 31, 2020. The average mass concentration of PM<sub>2.5</sub> was 41.47 μg/m<sup>3</sup>, PM<sub>10</sub> was 69.21 μg/m<sup>3</sup>, and the average aerosol optical thickness in Shijiazhuang, the observation site, was 1.06 in the summer. The trend of the aerosol optical thickness evolution process during the observation period was essentially the same as that of PM<sub>2.5</sub> or PM<sub>10</sub>. Two major processes of aerosol pollution occurred throughout the summer observation period, from June 28 to July 5 and from August 4 to 13, respectively. The PM<sub>2.5</sub>/PM<sub>10</sub> ratio increased in tandem with these two pollution processes, suggesting that fine particle generation was occurring concurrently with these processes, with PM<sub>2.5</sub> accounting for the majority of aerosol extinction [26]. Higher CO concentrations were detected from the state control site during the second pollution process; these emissions could be linked to nearby fires or other primary combustion sources. With a near-surface mean concentration of 5.11 ppb, the observed atmospheric HCHO concentration was generally consistent throughout the summer observation period.

### Validations of NO<sub>2</sub> and HCHO VCDs between MAX-DOAS and TROPOMI observation

To verify the accuracy of the NO<sub>2</sub> and HCHO results from the ground-based MAX-DOAS observations, here, the total tropospheric columns were obtained by integrating the NO<sub>2</sub> and HCHO contour concentrations from the ground-based MAX-DOAS observations in the summer of 2020 within the boundary layer along the height, and the correlation was verified with the VCDs at the Shijiazhuang site observed by TROPOMI satellite. Ground-based MAX-DOAS remote sensing inversion was used to obtain the NO<sub>2</sub> and HCHO vertical profiles, and the total NO<sub>2</sub> and HCHO columns in the boundary layer were obtained by integrating them along the height in the 0–3 km range of the profiles. Here, the MAX-DOAS contours were screened using the color index (CI) to make sure that clouds were not interfering with the data; previous research is cited for the screening procedure [46–48]. Meanwhile, only 1 h before and after the daily satellite transit moment (12:30 to 14:30 local time) of VCDs averaging was chosen for MAX-DOAS data to participate in the comparison validation to guarantee the consistency of the temporal representativeness of the ground-based and satellite observations. To obtain the VCDs, the satellite data were averaged over the four most adjacent observation grids centered on the latitude and longitude of the station.



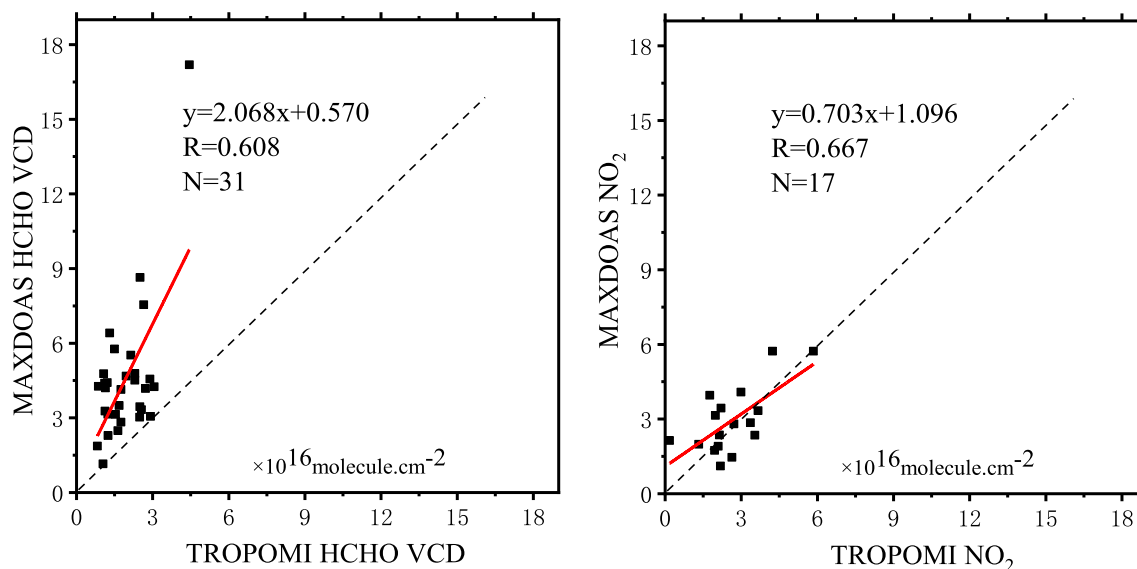
**Fig. 3** Time series of pollutants and meteorological parameters from June to August 2020 (pollutants include: aerosols, PM<sub>2.5</sub>, PM<sub>10</sub>, NO<sub>2</sub>, CO, HCHO, CHOCHO; meteorological parameters include: wind speed, temperature)

This ensured consistency between the spatial area of satellite observations and the ground-based MAX-DOAS observations.

Figure 4 displays the validation findings of the comparison between the MAX-DOAS and satellite remote sensing HCHO and NO<sub>2</sub> boundary layer column totals at the Shijiazhuang observation site during the summer of 2020. The tropospheric column total of HCHO in the two observations has a correlation validation coefficient  $R$  of 0.6, while the relevance of NO<sub>2</sub>'s VCDs reaches 0.667. These results show that, in the summer of 2020, there was good correlation between the satellite remote sensing tropospheric VCDs and ground-based MAX-DOAS observations, and there was consistency in the VCDs evolution trends of the monitored NO<sub>2</sub> and HCHO. The monitored NO<sub>2</sub> and HCHO VCD evolution trend consistency was good, and there was good correlation between the DOAS

observation and satellite remote sensing tropospheric VCDs. These two observations can effectively track the evolution of pollutant concentrations. Furthermore, based on the correlation validation results' slope, it can be inferred that the total HCHO VCDs measured by TROPOMI were lower than those measured by MAX-DOAS. This discrepancy is primarily caused by the different sensitivity of MAX-DOAS observations and satellite remote sensing when it comes to measuring the vertical distribution of pollutants within the boundary layer. Because satellite observations primarily receive sunlight scattered upward from the atmosphere or the surface, ground-based MAX-DOAS observations primarily receive scattered light transmitted downward from the zenith.

The TROPOMI satellite primarily captures emissions from the sky to the ground, rendering it less sensitive to emissions in close proximity to the ground. Conversely,



**Fig. 4** Total tropospheric columns of HCHO and  $\text{NO}_2$  observed by ground-based MAX-DOAS during the observation period, validated with TROPOMI satellite observations

the MAX-DOAS instrument observes emissions from the ground to the sky, making it more attuned to emissions near the ground level. This distinction has been highlighted in various scholarly articles [45, 49]. In addition, the study site for data collection is situated in a relatively remote area, encompassed by farmland and significant plant emissions. Consequently, there is a prevalence of primary sources of HCHO concentrated near the ground, while  $\text{NO}_2$  primarily originates from vehicular and industrial emissions. The  $\text{NO}_2$  levels observed in this study are predominantly influenced by regional high-altitude dispersion and emissions from elevated sources, resulting in a distribution at elevated altitudes. Consequently, the levels of HCHO observed by MAX-DOAS tend to be higher than those detected by TROPOMI, whereas the  $\text{NO}_2$  levels observed by MAX-DOAS are lower than those recorded by TROPOMI. This pattern has also been noted in other research studies [50, 51].

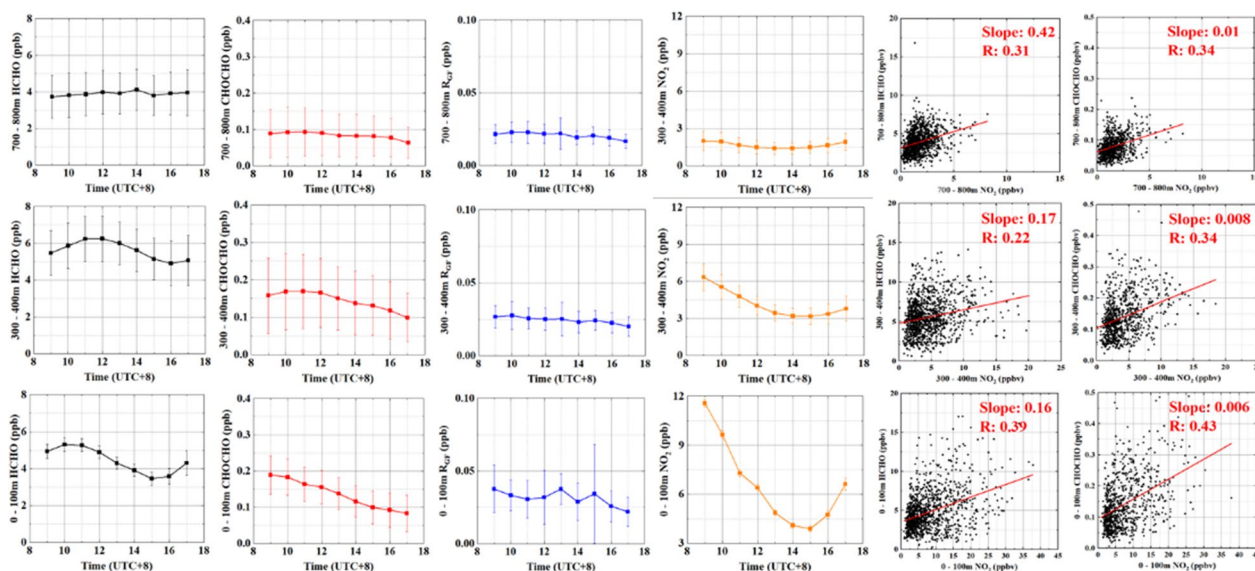
As a result, MAX-DOAS is more sensitive to the distribution of pollutant concentrations in the boundary layer, especially near the surface. The majority of atmospheric HCHO is caused by primary emissions, with only a small contribution from the oxidation of secondary VOCs [52, 53]. This results in atmospheric HCHO concentrations in the boundary layer close to the ground. The VCDs of the satellite observations were smaller than those of the ground-based MAX-DOAS observations due to the vertical distribution characteristics of HCHO and  $\text{NO}_2$ , as well as the disparity in sensitivity between the two types of observations. The discrepancy between the VCDs of the TROPOMI satellite observations and the

MAX-DOAS observations is also partially due to the differences between the two sets of observations. A contributing factor in the discrepancy between the TROPOMI and MAX-DOAS VCDs is the different effective area of the observations: the satellite observations are the average of the pollutant VCDs within the corresponding grid ( $3.5 \text{ km} \times 7 \text{ km}$ ), while the VCDs from MAX-DOAS are more representative of the average pollutant conditions around the station.

#### **Daily patterns of $\text{NO}_2$ , HCHO, and CHOCHO in vertical direction**

Clarifying the evolution patterns and possible sources of local pollutants in Shijiazhuang is made easier by analyzing the shifting patterns of pollutants like CHOCHO and HCHO. This study delved into the daily patterns of HCHO,  $\text{NO}_2$ , and CHOCHO in the boundary layer at different altitudes based on the vertical profiles of these pollutants that MAX-DOAS observed in Shijiazhuang, North China Plain, in summer 2020. In addition, the study examined the evolutionary correlations among these pollutants. To characterize the evolution of the bottom, middle, and top layers of the boundary layer, respectively, time series of the pollutant concentrations at 0–100 m, 300–400 m, and 700–800 m were chosen in the 0–3 km range contour of the boundary layer [54, 55]. The evolution of the pollutants at each height of the boundary layer was further investigated, and the daily changes in the  $\text{NO}_2$ , HCHO, and CHOCHO are displayed in Fig. 5.





**Fig. 5** Daily pattern of pollutants, such as HCHO, CHOCHO, NO<sub>2</sub> in the bottom, middle, and top layers within the boundary layer

In Shijiazhuang City, the daily change process of every pollutant in the bottom layer of the boundary layer was the most noticeable, and every pollutant displayed a clear daily change process. The summer near-surface CHOCHO concentrations in Shijiazhuang City peaked in the morning, with an average of  $0.189 \pm 0.053$  ppbv at 9:00 a.m. The concentration progressively dropped during the day to an average of  $0.083 \pm 0.050$  ppbv at 5:00 p.m. The boundary layer’s middle and lower layers held the majority of the vertical concentration of CHOCHO, while the near-surface had average daily concentrations of CHOCHO. The concentration of CHOCHO in the middle layer of the boundary layer and above decreased with altitude, and the average concentration in the layer of 700–800 m was  $0.084 \pm 0.059$  ppbv. The average daily concentration of CHOCHO in the bottom and middle layers of the near-surface was  $0.135 \pm 0.047$  ppbv and  $0.144 \pm 0.087$  ppbv. The most noticeable daily variation was observed in the bottom layer of the near-surface for another pollutant, HCHO, which represents the activity of atmospheric VOC in its total amount. This pollutant reached its average concentration at 10 a.m. The process was most noticeable, occurring at other heights in the boundary layer and reaching a daily maximum mean concentration of  $5.30 \pm 0.38$  ppbv at 10 a.m. and a minimum mean concentration of  $3.45 \pm 0.36$  ppbv at 15 p.m. The daily average concentration of HCHO in the uppermost boundary layer was  $3.90 \pm 1.16$  ppbv, and there was no discernible trend of change in this concentration. The primary source of HCHO and CHOCHO in the atmosphere is the oxidation of various VOCs. In the Shijiazhuang area, the high levels of HCHO

and CHOCHO in the morning are primarily caused by OH oxidizing atmospheric VOCs during the previous night and releasing them into the atmosphere via aerosol in the morning [56]. The most noticeable daily variation in the NO<sub>2</sub> concentration in the atmosphere was also observed in the boundary layer’s bottom 0–100 range; during the day, the NO<sub>2</sub> concentrations clearly displayed a "U" shape, with the highest concentration occurring at 9:00 a.m. The concentration progressively rose after 16:00 p.m., after which it gradually dropped in the morning and reached its lowest value of the day at around 15:00 p.m. As the altitude increased, the daily change rule of NO<sub>2</sub> progressively decreased. The evolution of NO<sub>2</sub> with time and altitude is related to the source of atmospheric NO<sub>2</sub>, which is primarily from motor vehicle emissions and fossil fuel combustion. Its peak time has a strong correlation with the daily morning and evening peaks. The daily pattern of variation decreased with altitude. Here, we simultaneously calculated the daily variation pattern of CHOCHO/HCHO ( $R_{GF}$ ) based on the simultaneous observation of two atmospheric pollutants, CHOCHO and HCHO.  $R_{GF}$  has been widely used to characterize anthropogenic emissions in several previous studies, because although HCHO and CHOCHO are produced by the oxidation of different species of VOCs in the atmosphere, the CHOCHO concentration is more derived from anthropogenic source VOCs, while HCHO is more widely sourced, with both anthropogenic and natural sources [23]. Figure 5 illustrates a general trend of the gradual decrease in  $R_{GF}$  at all heights throughout the day, with the trend being more pronounced near the ground. This suggests that during the day, anthropogenic

VOC emissions, such as those from biomass burning, are more visible in Shijiazhuang. HCHO's boundary layer evolution differs greatly from CHOCHO's: in the near-surface layer, the concentration reaches a maximum value at 10 a.m., drops in the afternoon, and reaches a minimum value in the daytime at roughly 14 p.m. The reason for the high value in the morning is that the previous night's oxidation of the VOCs by OH radicals causes them to be released from the aerosol once more. In addition, significant photolytic oxidation products of VOCs, particularly isoprene, olefins, and aromatics are HCHO and CHOCHO in the near-surface layer and are linked to an increase in the concentrations of CHOCHO and HCHO after 15:00 p.m. HCHO exhibited an entirely different pattern of variation in the upper boundary layer: a "U"-shaped concentration evolution throughout the day, with the lowest concentration occurring at approximately 2.5 ppbv at 10:00 a.m. The middle boundary layer exhibited no discernible pattern of HCHO evolution. Primary emission and secondary generation are the two main sources of atmospheric HCHO, and high-altitude transport and secondary reaction generation properties largely determine how HCHO evolves in the middle and upper layers of the boundary layer.

The  $\text{NO}_2$  concentration changes in a "U" shape on a daily basis. High values of the  $\text{NO}_2$  concentration were primarily observed in the morning and evening peaks, close to the ground at 8:00 a.m. The maximum concentration was 10 ppbv. Because motor vehicle traffic volume and  $\text{NO}_2$  concentration are clearly correlated, the concentration of  $\text{NO}_2$  during the day was higher in the morning and evening.  $\text{NO}_2$  is primarily produced by motor vehicle emissions near the ground, and the morning and evening concentrations are higher. The  $\text{NO}_2$  concentration in the boundary layer decreases with height, because the majority of  $\text{NO}_2$  emission sources are located close to the ground, and the evolution of the concentration is more noticeable the closer to the ground.

## Discussion

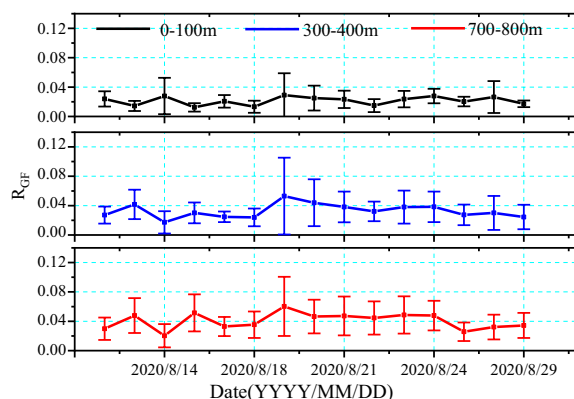
### RGF estimation

The concentration states of VOCs are influenced by various factors, including atmospheric VOCs concentration levels and pollutants, such as nitrogen oxides ( $\text{NO}_x$ ). These factors also determine the concentration levels and yields of HCHO and CHOCHO in the atmosphere. As a result, it is common practice to deduce the possible sources of atmospheric VOCs using the concentration ratio of CHOCHO to HCHO ( $R_{\text{GF}}$ ) [26, 57, 58]. Prior research employing the  $R_{\text{GF}}$  factor has primarily examined the near-surface to ascertain the concentration ranges and plausible origins of HCHO and CHOCHO

across various areas during varying seasons. This section examines the concentration levels and possible sources of VOCs at various elevations in the Shijiazhuang area of the North China Plain in the summer of 2020, based on the HCHO and CHOCHO concentration profiles.

Layer by layer and day by day, the concentration ratio was computed as  $R_{\text{GF}}$  based on the summer HCHO and CHOCHO concentration profiles in Shijiazhuang. The daily average sequences of  $R_{\text{GF}}$  and the range of evolution at different heights of the boundary layer in August 2020 are shown in Fig. 6. The daily mean values of  $R_{\text{GF}}$  at the bottom, middle, and upper levels of the boundary layer were  $0.0205 \pm 0.0077$ ,  $0.0864 \pm 0.0296$ , and  $0.0746 \pm 0.0263$ , respectively. In August 2020, Shijiazhuang City's total near-surface  $R_{\text{GF}}$  was less than 0.04, indicating a changing process over time, with high values primarily occurring on August 14th, 19th, and 26th. Compared to the remaining days, which are more stable, these 3 days have a larger evolution range of  $R_{\text{GF}}$ .  $R_{\text{GF}}$  within the boundary layer increased gradually with altitude in a vertical direction, and the range of day-to-day variation also increased significantly. This suggests that the sources of VOCs in the upper and middle parts of the boundary layer are more complex and diverse as the altitude increases.

The amount of solar radiation, atmospheric OH radical concentrations, and atmospheric VOCs composition all have a direct impact on  $R_{\text{GF}}$  variation. Previous research has demonstrated that, even though thresholds for various VOCs sources may differ among locations, local sources of VOCs can still be inferred from factors with high or low levels. Broadly speaking, anthropogenic emissions dominate atmospheric VOCs when  $R_{\text{GF}}$  is small (i.e., less than 0.03); biomass dominates atmospheric VOCs emissions when  $R_{\text{GF}}$  is between 0.04



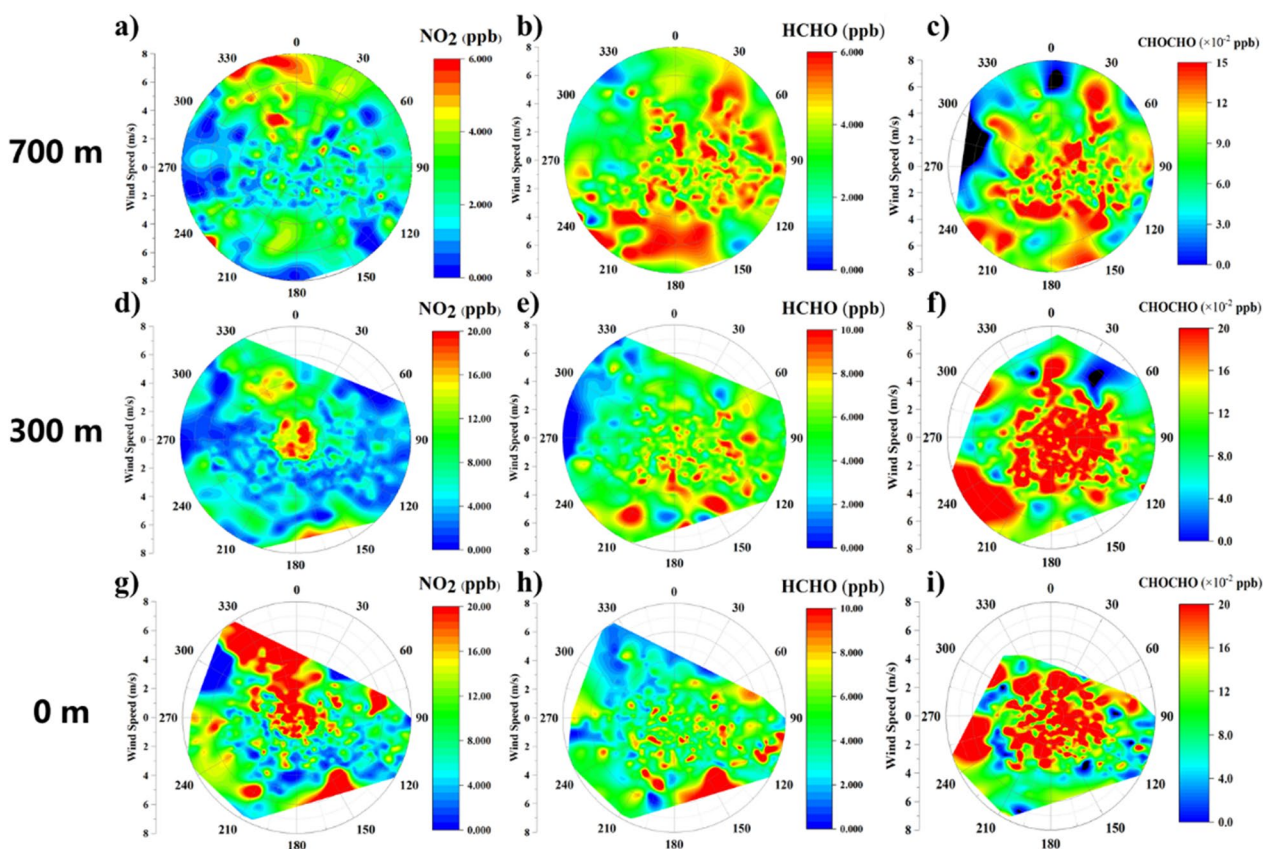
**Fig. 6** Time series of  $R_{\text{GF}}$  at different heights of the boundary layer in the summer of 2020 in the Shijiazhuang area (at 0–100 m, 300–400 m, and 700–800 m height layers, respectively)

and 0.06; biomass combustion dominates when  $R_{GF}$  is greater than 0.5; and higher  $R_{GF}$  values may be indicative of anthropogenic activities, such as burning fossil fuels. This also suggests that human activity is the primary source of Shijiazhuang’s local near-surface VOCs. The composition and concentration of local VOCs in Shijiazhuang will be influenced by the combustion of biomass, or even fossil fuels, and their regional transport, particularly in the middle and upper layers of the local boundary layer.

**Analysis of potential sources of pollutants in the Shijiazhuang area**

In addition to emissions from nearby anthropogenic sources, meteorological transport may also play a role in the local pollution in Shijiazhuang. To analyze the possible regional sources of the high local pollution values, wind rose diagrams of pollutant concentration versus wind field are investigated here. These are based on the vertical observation of pollutant profiles by MAX-DOAS in Shijiazhuang in summer 2020 and the wind speed and direction data of the local meteorological field in the same period. The link between summertime  $NO_2$ ,

HCHO, and CHOCHO concentrations and the direction and speed of the meteorological field at various elevations (0 m, 300 m, and 700 m) in the Shijiazhuang boundary layer is depicted in Fig. 7. High  $NO_2$  concentrations in Shijiazhuang were frequently observed during the dominant northerly winds, as can be seen from the relationship between the concentrations and wind speed and direction. This suggests that the two main sources of local NO pollution in Shijiazhuang are the local NO emissions and regional transport from the north. In Shijiazhuang, regional transportation from the north and  $NO_2$  emissions are the two main causes of local pollution. In Shijiazhuang, the two main sources of  $NO_2$  close to the ground are local motor vehicle emissions and the combustion of fossil fuels. The vertical dependence of high  $NO_2$  values on wind direction and speed gradually diminishes, suggesting that the regional  $NO_2$  transport in Shijiazhuang has no discernible effect on the local boundary layer altitude. This study’s observation station is southeast of Shijiazhuang City. The urban area north of the station is where the surrounding range’s  $NO_2$  values are highest, and any  $NO_2$  that is released at one point will be dispersed throughout the surrounding area due to the



**Fig. 7** Wind rose plot of  $NO_2$ , HCHO, and CHOCHO concentrations at different vertical heights in Shijiazhuang City in summer 2020 and their dependence on wind speed and wind direction

influence of the northerly wind and wind field. In the case of HCHO, the south wind is strongly correlated with the high values of HCHO at all boundary layer heights, and the southward transport contribution rises with height, suggesting that the south wind's regional transport has a greater impact on local HCHO in Shijiazhuang. HCHO is a significant intermediate product of atmospheric VOC oxidation. It can accurately characterize the total amount of VOCs in the atmosphere and has a strong correlation with the activity of the total VOCs. The wind-dependent plots of the HCHO concentration at each boundary layer height also show that regional transport between the city and the south is the primary source of VOCs in Shijiazhuang City. In the meantime, atmospheric HCHO is produced through reaction in the presence of precursors, since there are secondary sources of this gas. Consequently, compared to the near-surface bottom layer, the exogenous transport effect of high-altitude HCHO is more significant. Regarding the relationship between the high concentration of CHOCHO and the direction and speed of the wind, there does not seem to be any clear correlation. The primary emissions of anthropogenic sources account for the majority of the atmospheric CHOCHO, which is a useful indicator of anthropogenic volatile organic compounds. Consequently, it also suggests that Shijiazhuang's anthropogenic VOC sources are more uniform locally.

## Conclusions

In the southeast of Shijiazhuang City, Hebei Province, China, we conducted MAX-DOAS outfield observations from June to August 2020. We obtained NO<sub>2</sub>, HCHO, and CHOCHO profiles in the vertical range of 0–3 km. The intra-boundary layer VCDs were obtained by integrating the NO<sub>2</sub> and HCHO profiles that were recorded via MAX-DOAS. These VCDs were well-validated against the same-period observations of VCDs from the TROPOMI satellite, demonstrating the accuracy and dependability of the MAX-DOAS observations of tropospheric pollutants. The accuracy and reliability of MAX-DOAS's observation of tropospheric pollutants are demonstrated by the VCDs strong verification against the same timeframe of TROPOMI satellite observation. Two minor aerosol pollution events took place in Shijiazhuang throughout the summer observation period. The ratio of PM<sub>2.5</sub>/PM<sub>10</sub> increased in both pollution processes, suggesting that a significant number of fine particles were produced in the pollution. Elevated NO<sub>2</sub> and CO concentrations, which are markers of human emissions, were present during the second pollution process, indicating that anthropogenic source emissions—particularly those from biomass burning—had a significant role in this pollution process. It was discovered that NO<sub>2</sub>, HCHO, and CHOCHO were all

primarily distributed near the surface of the boundary layer, based on the benefits of MAX-DOAS for the simultaneous vertical observation of multiple pollutants. However, the various species displayed distinct diurnal evolution trends, with high values in the morning and evening peaks of NO<sub>2</sub>, a diurnal maximum at 10:00 a.m. and a minimum at 15:00 p.m. for HCHO, and decreasing diurnal concentrations for HCHO and CHOCHO. The primary reason for the variations in the evolution features of these three pollutants is their varying sources, and as the altitude increases, the trends of all three pollutants progressively decline. The potential sources of pollutants in Shijiazhuang during the summer were analyzed based on the pollutant concentration profiles and the meteorological wind speed and direction around the same station. The high value of NO<sub>2</sub> in Shijiazhuang was primarily caused by local emission and the influence of the north wind transmission, while the potential sources of atmospheric HCHO were primarily located in the southern region of Shijiazhuang, and the high value of CHOCHO was more due to the local emission. To assess the possible sources of VOCs at various elevations in Shijiazhuang during the summer, the R<sub>GF</sub> factor was also applied here, based on the simultaneous observation of CHOCHO and HCHO by MAX-DOAS. It was discovered that human activity emissions were the primary source of the near-surface VOCs in Shijiazhuang. The local VOC components and concentrations in Shijiazhuang are influenced by the combustion of biomass or even fossil fuels and their regional transit, with regard to the middle and upper layers of the local boundary layer. The joint observation of multiple pollutants, including NO<sub>2</sub>, HCHO, and CHOCHO by MAX-DOAS, summarizes the evolution characteristics and possible sources of summer pollutants in Shijiazhuang.

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## Author contributions

Conceptualization, G.L., and Y.W.; validation, Y.W.; writing—original draft, G.L.; writing—review and editing, Y.W.; software, G.L.; formal analysis, G.L.; resources, G.L., and Y.W.

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## Data availability

The data presented in this study are available on request from the corresponding author.

## Declarations

## Competing interests

The authors declare no competing interests.

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