

Vertical observations of the atmospheric boundary layer structure over Beijing urban area during air pollution episodes

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Received: 12 November 2018 – Discussion started: 15 January 2019 Revised: 15 April 2019 – Accepted: 17 April 2019 – Published: 23 May 2019

Abstract. We investigated the interactions between the air pollutants and the structure of the urban boundary layer (UBL) over Beijing by using the data mainly obtained from the 325 m meteorological tower and a Doppler wind lidar during 1-4 December 2016. Results showed that the pollution episodes in this period could be characterized by low surface pressure, high relative humidity, weak wind, and temperature inversion. Compared with a clean daytime episode that took place on 1 December, results also showed that the attenuation ratio of downward shortwave radiation was about 5 %, 24 % and 63 % in afternoon hours (from 12:00 to 14:00 local standard time, LST) on 2-4 December, respectively, while for the net radiation (R_n) attenuation ratio at the 140 m level of the 325 m tower was 3 %, 27 % and 68 %. The large reduction in R_n on 4 December was not only the result of the aerosols, but also clouds. Based on analysis of the surface energy balance at the 140 m level, we found that the sensible heat flux was remarkably diminished during daytime on polluted days and even negative after sunrise (about 07:20 LST) till 14:00 LST on 4 December. We also found that heat storage in the urban surface layer played an important role in the exchange of the sensible heat flux. Owing to the advantages of the wind lidar having superior spatial and temporal resolution, the vertical velocity variance could capture the evolution of the UBL well. It clearly showed that vertical mixing was negatively related to the concentrating of pollutants, and that vertical mixing would also be weakened by a certain quantity of pollutants, and then in turn worsened the pollution further. Compared to the clean daytime on 1 December, the maximums of the boundary layer height (BLH) decreased about 44 % and 56 % on 2–3 December, when the average $PM_{2.5}$ (PM_1) concentrations in afternoon hours (from 12:00 to 14:00 LST) were 44 (48) µg m⁻³ and 150 (120) µg m⁻³. Part of these reductions of the BLH was also contributed by the effect of the heat storage in the urban canopy.

1 Introduction

In recent years, fine particulate matter (PM) pollution events in the atmospheric boundary layer (ABL), i.e., involving particles with diameters $\leq 2.5 \,\mu m$ (PM_{2.5}), have occurred frequently in urban areas, thus emerging as a serious environmental issue in China. The Beijing–Tianjin–Hebei (BTH) metroplex region is one of the most seriously affected areas in China with respect to air pollution. The main hazards or negative effects of air pollution generally fall into two categories: human health and traffic. Thus, it is an issue that has attracted considerable public attention and, accordingly, numerous studies have focused on investigating the sources and formation mechanisms of air pollution in the BTH region, through numerical simulation and field observational methods (e.g., L. T. Wang et al., 2013; Sun et al., 2014; Ye et al., 2016; X. Li et al., 2017; Han et al., 2018).

Beijing, the main city of the BTH region, has experienced several high-impact, persistent, and severe air pollution episodes in recent years, with notable examples having taken place in January 2013, October and November 2014, December 2015 and 2016, and January 2017. Beijing is located in the North China Plain (NCP), and is surrounded by the Yan and Taihang mountains from north to west. Therefore, Beijing is frequently affected by thermally induced mountain-plain wind circulation over the NCP, which contributes to the transportation of air pollution in Beijing (Liu et al., 2009; Hu et al., 2014; Chen et al., 2017; Zheng et al., 2018). In addition, it is well recognized that high levels of anthropogenic emissions and rapid formation of secondary aerosol are key factors leading to the frequent occurrence of severe haze episodes (Z. Li et al., 2017). More importantly, these interactions on local and large scales are associated with the meteorological conditions (Sun et al., 2013; Yang et al., 2018). Previous studies have reported that heavy pollution in Beijing is highly related to unfavorable local weather conditions, such as weak wind, strong temperature inversion, high relative humidity (RH) and low surface pressures (Zhang et al., 2014; Liu et al., 2017; Li et al., 2018).

Many studies have also suggested that the structure of the urban boundary layer (UBL), in particular wind, turbulence and stability, had strong influence on the occurrence, maintenance and vertical diffusivity of air pollutants (Han et al., 2009; Zhao et al., 2013). For instance, emissions of air pollution in urban areas lead to a buildup of pollutant concentrations due to reduced mixing and dispersion in the UBL (Holmes et al., 2015). An analysis of the dramatic development of a severe air pollution event on November 2014 in the Beijing area revealed that turbulent mixing played an important role in transporting the heavily polluted air and $PM_{2.5}$ oscillations (Li et al., 2018). The vertical profiles of wind and temperature along with the BLH are the main factors affecting turbulence diffusion. Moreover, the BLH is also a key variable in describing the structure of UBL and in predicting air pollution (Stull, 1988; Miao et al., 2011; Barlage et al., 2016). Miao et al. (2018) found that the concentration of PM_{2.5} anticorrelates with the BLH. In addition, air pollutants can also modulate radiative transfer processes through the scattering, reflection and absorption of shortwave radiation and reflection and absorption and emission of longwave radiation (Dickerson et al., 1997; Stone et al., 2008; Wang et al., 2017). In response to reduced solar radiation, the cooling of surface air temperature can lead to strong temperature inversion in the near-surface layer, which can increase the atmospheric stability and prolong the accumulation of pollution because of the existence of this stable boundary layer (Barbaro et al., 2013; Che et al., 2014; Gao et al., 2015). A positive feedback loop in which more aerosol loading leads to a more stable atmospheric boundary layer (ABL), enhanced accumulation of pollutants within the ABL and a more polluted and hazier atmosphere was described by Zhang et al. (2013, 2018). It is also found that the further worsened meteorological conditions caused by cumulated aerosol pollution subsequently occurred "explosive growth" of $PM_{2.5}$ mass, which often appears in the late stage of a heavy aerosol pollution episode in Beijing–Tianjin–Hebei area in China (Zhong et al., 2017).

Although many studies have provided various interesting findings, consensus has not been reached on the pollutant transport mechanism and the nature of the interactions between the air pollution and the structure of the UBL, mainly due to a lack of reliable and detailed field measurements and the complex properties of the UBL. Additionally, as mentioned above, there are several factors that affect the occurrence of urban air pollution, which can lead to different pollutant transporting mechanism characteristics for different pollution events. Therefore, taking a severe heavy pollution event that occurred during 1-4 December 2016 in the Beijing as an example, we will aim to investigate evolution characteristics of ABL structure and further explore the interaction between the structure of the UBL and the air pollution by using the field data collected from a 325 m meteorology tower in Beijing urban area, as well as from a Doppler wind lidar and a dual-wavelength (1064 and 532 nm) depolarization lidar. During this pollution episode, the PM_{2.5} concentration rapidly increased from about $100 \,\mu g \,m^{-3}$ to approximately $500 \,\mu g \,m^{-3}$ at 12:00 LST on 4 December, which can be considered a typical case to achieve a better understanding of the formation, transportation and dispersion mechanisms of the similar pollution event, as well as the interactions between the air pollution and the structure of the UBL.

The paper is organized as follows: Sect. 2 describes the field site, data and methods. The overall characteristics of the synoptic pattern and the meteorological factors related to the development of the pollution event are investigated in Sect. 3. The impacts of the vertical UBL structure evolution on this pollution episode, and vice versa – especially the turbulence due to the radiative forcing of aerosols – are also explored in Sect. 3. Lastly, the results of the study are summarized in Sect. 4.

2 Materials

2.1 Site and data

The main data used in this study were from a tall tower in Beijing, officially known as "the Beijing 325 m meteorological tower", which is located at an urban site in the city $(39.97^{\circ} \text{ N}, 116.37^{\circ} \text{ E}; \text{ the Beijing "inner-city" site})$. Within a radius of 5 km of the tower, buildings of different heights are distributed irregularly in all directions, and the area is surrounded by four-story to 20-story buildings with heights of 10-60 m (Liu et al., 2017). The surrounding buildings can be seen in Fig. 1a. This tall tower conducts turbulent flux measurements using sonic anemometers (WindMaster Pro, Gill, UK) at three different levels (i.e., 47, 140 and 280 m). Note that CSAT3 three-dimensional sonic anemometers designed by Campbell Scientific Inc. (USA) at these three levels have been replaced by the WindMaster Pro since 2015, so the turbulence measurements before 2015 used in previous papers were collected using the CSAT3 sonic anemometers. The new sonic anemometer experimental setup has been reported by Cheng et al. (2018). Downward-pointing and upward-pointing pyrgeometers and pyranometers (CNR1, Kipp & Zonen) are maintained at the same heights as the sonic anemometers to measure four-component radiation (i.e., incoming shortwave and longwave radiation and outgoing shortwave and longwave radiation). Meteorological elements, including wind speed, wind direction (010C cup anemometers and 020C wind vanes, Met One, USA), RH and temperature (HC2S3, Rotronic, Switzerland) are measured at 15 levels (i.e., 8, 15, 32, 47, 65, 80, 100, 120, 140, 160, 180, 200, 240, 280 and 320 m) above ground level. An Aerodyne aerosol chemical speciation monitor and a high-resolution time-of-flight aerosol mass spectrometer were deployed at 260 m and ground level, repetitively to measure PM₁ mass concentrations at 5 min intervals (Sun et al., 2016).

In addition, wind speed (05103-L, R. M. Young) and temperature (HMP45C, Vaisala) at the 2.2 m level are measured at a surface station about 20 m south of the tower. We also used wind data collected above 100 m by a Doppler wind lidar (Windcube 200, Leosphere, Orsay, France) situated on the rooftop of a 8m high building. Furthermore, a dualwavelength (1064, and 532 nm) depolarization lidar developed by the National Institute for Environmental Studies, Japan, sits on the rooftop of a 28 m high building (Yang et al., 2017), which provided us with information on aerosols at a higher layer. The mass concentrations of PM_{2.5} measured at the Beijing Olympic Sports Center (Aoti surface station) of the National Air Quality Monitoring Network of China using tapered element oscillating microbalance analyzers with hourly monitored readings were obtained from the website of the China National Environmental Monitoring Center (http: //106.37.208.233:20035/, last access: 8 May 2019).

The three-dimensional sonic anemometers' original records (10 Hz) were processed prior to analysis using the methods of double rotation (i.e., yaw and pitch rotations) and linear detrending. L. L. Wang et al. (2014) tested a few averaging periods and found that a 1 h averaging period is reasonable at this urban site. The processing of turbulence data in our study followed the method described by L. L. Wang et al. (2014).

The criterion of threshold carrier-to-noise ratio (CNR) was used to reduce the effects of invalid data on profiles derived from the Doppler velocities. The data control process was described in detail by Huang et al. (2017). We calculated the vertical velocity variance and stream-wise wind speed and wind direction over a 30 min segment.

The dual-wavelength depolarization lidar was used to retrieve the aerosol vertical structure at a spatially resolved resolution of 6 m and temporally resolved resolution of 10 s, but only for altitudes in excess of 100 m because of an incomplete overlap between the telescopic field of view and the laser beam. For this study the raw temporal resolution of the retrieved aerosol profiles was set at 30 min. More details on the lidar instruments and various data processing techniques were provided by Yang et al. (2017).

The NCEP FNL (Final) Operational Global Analysis data collected every 6 h, at 02:00, 08:00, 14:00 and 20:00 LST, on $1^{\circ} \times 1^{\circ}$ grids were used to analyze the synoptic-scale weather conditions.

2.2 Methods

2.2.1 Turbulent flux and radiation calculation

The sensible heat and latent heat fluxes were calculated using the eddy-covariance method:

$$H = \rho C_{\rm p} \overline{w'T'},\tag{1}$$

$$LE = L_v \overline{w'q'},\tag{2}$$

where ρ is the air density (kg m⁻³), C_p is the specific heat capacity at constant pressure (J kg⁻¹ K⁻¹), w is the vertical velocities (m s⁻¹) from the sonic anemometers, T is the air temperature (K), L_v is the latent heat of vaporization of water (J kg⁻¹) and q is the specific humidity (kg kg⁻¹). The overbar denotes time averages and an averaging period of 60 min was used in this study.

The surface energy budget (SEB) without consideration of horizontal advection is usually formulated as

$$R_{\rm n} + Q_{\rm F} = H + \rm LE + G, \tag{3}$$

where *H* is the sensible heat flux from the surface to the adjacent air, LE is the latent heat flux into the atmosphere associated with evapotranspiration, and *G* is the ground and urban canopy heat storage. R_n is the net radiation, which can be described as

$$R_{\rm n} = \rm{DSR} - \rm{USR} + \rm{DLR} - \rm{ULR}. \tag{4}$$

DSR stands for downward shortwave radiation, USR for upwelling short-wave radiation, DLR for downward incoming long-wave radiation and ULR for upwelling long-wave radiation. The anthropogenic heat flux (Q_F) is a significant term in urban areas, which is the additional energy released by human activities; however its estimation is difficult due to the absence of accurate energy consumption and traffic flow data. In this study, the heat storage term minus the anthropogenic heat flux, $G - Q_F = R_n - H - LE$, will be analyzed



Figure 1. (a) Three-dimensional graph of the underlying surface around the 325 m tower in Beijing. Photographs of the buildings looking north from the 280 m level of the 325 m tower at 13:58 LST: (b) 1 December and (c) 3 December 2016.

2.2.2 Determination of UBL depths

Lidar techniques have become one of the most valuable and popular systems to detect the atmosphere because of their higher spatiotemporal resolution. As a result, many techniques have been developed to determine the BLH by using remote-sensing instruments, such as radar wind profilers, aerosol lidars and ground-based microwave radiometers (Flamant et al., 1997; Emeis et al., 2004; Haman et al., 2012). Remote sensing is particularly useful in analyzing vertical profiles of turbulence mixing in UBL, and is generally easier to deploy than radiosondes (Georgoulias et al., 2009).

Recently, a turbulence method to define the BLH has been proposed by using the Doppler lidar, which can obtain threedimensional wind. The vertical velocity variance σ_w^2 can be used to describe the density of the turbulence; hence the height of the layer in which vertical velocity variance σ_w^2 exceeds a given threshold is considered the BLH. Previous investigators have given different values of σ_w^2 for different underlying surfaces (Tucker et al., 2009; Pearson et al., 2010). Barlow et al. (2015) defined the mixing height as the height over London, UK, up to which $\sigma_w^2 > 0.1 \text{ m}^2 \text{ s}^{-2}$. Here, we select this method of Barlow et al. (2011), because of the similar urban fraction between central Beijing and London.

The 30 min vertical velocity standard deviation between lidar is

$$\sigma_w = \sqrt{\frac{1}{N-1} \sum_{i=1}^{N} (w_i - \overline{w})^2},\tag{5}$$

where N is the record number every 30 min, w_i denotes the *i*th vertical velocity (m s⁻¹) and \overline{w} is the mean vertical wind speed.

3 Results and discussion

3.1 Air pollution episodes in Beijing

As shown in Fig. 1c, the visibility around the 325 m tower at about 14:00 LST on 3 December was much lower than that on 1 December. In fact, the visibility decreased rapidly from 12:00 to 16:00 LST before sunset (16:50 LST) on 3 December, accompanied by the increasing $PM_{2.5}$ concentration (from 100 to 200 µg m⁻³) at the Olympic Sports Center station and PM_1 concentration (from 100 to 190 µg m⁻³) at the



Figure 2. Temporal variation in the PM_1 observed at the surface and the 260 m level of the 325 m tower, $PM_{2.5}$ at Aoti surface station, and surface pressure at the surface station of the IAP, during 1–4 December 2016 (red box: CS).

325 m tower station (Fig. 2). After sunset, the $PM_{2.5}$ hourly maximum concentration reached 530 µg m⁻³ at 02:00 LST, 4 December. The cumulative explosive growth process of the pollution, starting at 12:00 LST, 3 December, and lasting till 02:00 LST, 4 December, is defined as the cumulative stage (CS).

The surface pressure measured at the Institute of Atmospheric Physics (IAP) surface station (Fig. 2) indicated the air quality was getting worse with decreasing surface pressure. In order to analyze the synoptic background fields for the CS, the sea level pressure and surface wind field on 3 December are shown in Fig. 3. At 08:00 LST, the Beijing region was governed by a saddle-type pressure field characterized by uniform pressure, very weak wind speed and changeable wind direction. The surface high-pressure system over the Bohai and Yellow seas was conducive to the maintenance of these stagnant meteorological conditions till 14:00 LST, which provided unfavorable meteorological conditions for the diffusion of air pollutants and contributed to the formation of CS.

3.2 Meteorological parameters

As shown in Fig. 4a, RH was mostly larger than 40 % during pollution episodes, and increased along with the concentrated PM_{2.5} (PM₁). Especially during the CS, RH could reach close to 100 % at nighttime, which firstly appeared at the levels of 160–220 m and then extended to the lower levels. Meanwhile, the deeper RH (> 80 %) with higher PM concentrations during the CS was possibly caused by secondary aerosol formation. Due to aerosol cooling force, θ in the daytime on 3 December was much lower than on other days. Clearly, the wind flow played an important role in the air pollution process. The southwesterly wind transported air pollutants from Hebei Province to Beijing on the first two pollution nights (Fig. 4c). In order to investigate the characteristics of the UBL structure, the vertical gradients of potential temperature ($\Delta \theta = \theta_2 - \theta_1$) and gradient absolute values in wind speed $(|\Delta U| = |U_2 - U_1|)$ were calculated by using the adjacent two levels as the thermal and dynamic factors (Fig. 5). It was found that the vertical gradients of wind speed and potential temperature were small because of strong vertical thermal mixing during daytime, whereas they were large at nighttime due to weak vertical mixing. Temperature inversions were found during all three nights, which was negative to the dispersion of the pollutants (Li et al., 2018; Wang et al., 2019). Typically, the formation of temperature inversions in winter at night is associated with the radiative cooling effect. Zhong et al. (2019) found that the temperature reduction because of the aerosol cooling force during daytime induced or reinforced an inversion, and then these enhanced inversions further worsen the aerosol pollution. This two-way feedback mechanism between unfavorable meteorological conditions and cumulative aerosol pollution also appeared in our case. The values of $\Delta \theta$ and the duration of $\Delta \theta > 0$ increased day by day, meaning the thermal stability strengthened with worsening polluted days. Moreover, a long-term existence of temperature inversion near the surface could be found till 12:00 LST, 4 December, associated with extremely steady stability. This stable surface stratification resulted in the suppressed diffusion of air pollutants at the surface, causing a dissipation lag for PM₁ at the surface compared to the case at the 260 m level (shown in Fig. 2).

Owing to the limited height of the tower, the wind profile above several hundred meters collected by the Doppler lidar (Fig. 6) can be used to further investigate the association between the wind flow and air pollution process. On 1 December, the air quality was good before noon and there was strong northwest wind (mostly around 10 m s^{-1}) at 200–1000 m above ground level (a.g.l.). In our case, notably, a low-level jet (LLJ) established after sunset, with the



Figure 3. Distribution of surface pressure and temperature at (a) 02:00 LST, (b) 08:00 LST, (c) 14:00 LST and (d) 20:00 LST, 3 December 2016, where the green star marks the location of Beijing (BJ).

jet core at 300-500 m a.g.l., and the maximum wind speed was around $10 \,\mathrm{m\,s^{-1}}$ at about 24:00 LST. We can see the PM2.5 / PM1 concentration was starting to increase after sunset with the maximum PM_{2.5} concentration $(120 \,\mu g \, m^{-3})$ observed at 24:00 LST, and then decreased with the gradually weakened LLJ, which suggests this southwesterly LLJ transferred polluted air from the south by advection to Beijing before midnight. A previous study also reported that presence of an LLJ can increase the surface pollution through horizontal advection (Hu et al., 2013). In addition to the horizontal advection, LLJ can also generate vertical mixing due to the wind shear with large $|\Delta U|$ (> 1 m s⁻¹). Once the northern mountain flow was generated, the LLJ became weaker $(<5 \,\mathrm{m \, s^{-1}})$ in the early morning on 2 December, and then the vertical mixing generated by the weakened LLJ changed to the dominated term, which made an important contribution to the mixing of the pollutants in the dissipated period. Chen et al. (2018) also pointed out that a northerly weak LLJ noticeably reduced the PM concentration in urban Beijing. As a result, the presence of an LLJ has an indispensable effect on the process of the air pollution in the nocturnal boundary layer (NBL).

We can also see that the PM_1 concentration at the 260 m level started to decrease at 02:00 LST, 2 December, which was about 2 h later than PM₁ at the ground level. This could be explained that the gradually deep and clean northwest mountain-plain wind occurred first below 100 m a.g.l., and then reached the upper level. On 2 December, the wind below 1 km was dominated by speeds of around 2 m s^{-1} from 06:00 to 22:00 LST. The weak northerly winds did not fully disperse the air pollutants before noon. Meanwhile, after the transition time on 13:00 LST, southerly winds existed and brought polluted air from the south, and then the air quality became worsened, and the maximum PM2.5 concentration $(210 \,\mu g \, m^{-3})$ occurred at 22:00 LST. Compared to early morning on 2 December, the wind below 600 m was weaker and the vertical gradients (Fig. 6b) were much smaller, meaning mechanical turbulence (vertical mixing) was extremely weak. Thus, there is no dramatic reduction in the air pollution before sunrise on 3 December, and then the CS began at



Figure 4. Vertical evolution of (a) relative humidity, (b) virtual temperature, and (c) wind speed and wind vectors (arrows), observed at 15 levels of the 325 m tower during 1–4 December 2016.



Figure 5. Vertical evolution of (a) vertical gradients of relative potential temperature and (b) vertical gradients of zonal wind speed, based on observations at 15 levels of the 325 m tower during 1–4 December 2016.

noon when the wind speeds were mostly lower than 3 m s^{-1} below 1 km a.g.l. because of the saddle–type pressure-field background (Fig. 3).

3.3 SEB characteristics

Solar radiation is the most important driver of the development of the UBL. Various climatic changes within the urban ABL are driven by the SEB, which distributes the energy by radiation, convection and conduction between a facet (Oke et al., 2017). Therefore, the SEB, described as Eq. (3), is a



Figure 6. Vertical evolution of (a) wind speed and (b) vertical gradients of wind speed, based on Doppler wind lidar observations during 1–4 December 2016.

fundamental aspect contributing to our understanding of the variations in the UBL.

In this study, we wanted to focus on the SEB at one level rather than the vertical difference between different levels. Moreover, measurements at 140 m are above the roughness sublayer layer and are within the surface layer (Miao et al., 2012); hence only the observations at the 140 m level were used in studying the radiative exchange. In Fig. 7, the four components show the daytime pollution received less shortwave radiation but more longwave radiation than the daytime clean episode. The DSR reduces with gradually worsening air quality on a day-to-day basis. The DSR during this 4 d period reached a peak value (482 W m^{-2}) at 12:00 LST, 1 December. The differences between the daytime clean and pollution episodes reached about 20, 110 and 376 W m^{-2} at 12:00 LST on 2–4 December, respectively. Overall, compared with the DSR during the daytime clean episode on 1 December, the attenuation ratio of the DSR was about 4%, 23% and 78% at 12:00 LST, 3-4 December, and the averaged value was 5 %, 24 % and 63 % in afternoon hours (12:00-14:00 LST), respectively. Many efforts have been made on the radiative forcing due to the increasing aerosol loading by using model simulations and field experiments (Ramanathan et al., 2001; Xia et al., 2007; Ding et al., 2016). Based on observations at the 140 m level at the 325 m tower under 8 cloudless days (3 clean days and 5 pollution days) in January 2015, Wang et al. (2016) found that the maximum attenuation of the DSR was $33.7 \,\mathrm{W}\,\mathrm{m}^{-2}$ and the attenuation ratio was 7.4 % at 12:00 LST. Due to the difference in solar angle, degree of pollution, pollutant component, cloud, etc., attenuation differences are expected in different case studies. Here, the USR on clean days was larger than on pollution days with a larger maximum difference (32 W m^{-2}) on 4 December, which was mainly caused by the lower quantity of DSR received on 4 December. For the DLR, the diurnal change in the difference between 1 and 2 December was insignificant. During the other two day times, the DLR increased with the enhancement of pollution level, and the peak values on 3 December and 4 December were respectively 51 and $56 \, \mathrm{W} \, \mathrm{m}^{-2}$.

The diurnal variation in the DSR on 4 December was discontinuous, which suggests the large attenuation of the DSR on this day was not only the impact of the higher aerosol concentrations, but also that of the cloud cover. The largest DLR on 4 December also indicated the possible existence of clouds. Information on the coverage of clouds can be seen from satellite cloud images, which in this case were provided by the products of the Himawari-8 geostationary me-



Figure 7. Diurnal cycle of (a) downward shortwave radiation, (b) upward shortwave radiation, (c) downward longwave radiation, (d) upward longwave radiation and (e) net radiation, observed at the 140 m level of the 325 m tower during 1–4 December 2016.

teorological satellite, launched by the Japan Meteorological Agency (http://www.eorc.jaxa.jp/ptree/, last access: 25 October 2018). According to these data, the first 3 d were free from clouds (figures are omitted). From the mass of grey marked by the red square in Fig. 8, it is apparent that pollutants dominated the BTH region at 08:00 LST, and then this area became partially cloudy. The area over Beijing was covered with cloud at 10:00 LST, which lasted about 3 h, and then at 15:00 LST had become cloudless. Van de Heever and Cotton (2007) found giant nuclei could lead to strong early enhancement of cloud development. Moreover, pre-

vious studies have found that cloud fraction changes with aerosol loading (Gunthe et al., 2011; Che et al., 2016). In our case, before the cloudy day, heavy pollutants occurred over the BTH region, and the IAP station recorded high relative humidity (> 90 %, shown in Fig. 4) at midnight, which would have enhanced aerosol hygroscopic growth, implying significant aerosol–cloud interactions, referred to in Che et al. (2016). Thus, we can deduce that the cloud cover over the BTH region may in part account for the aerosols on the pollution days, which supports the abundant cloud condensation nuclei (CNN) for the cloud formation on the following day. Certainly, further studies with more measurement data and model simulations are needed to validate this conclusion.

In general, the R_n (shown in Fig. 7) attenuation ratio was 3%, 27% and 68%, in the afternoon hours, 2-4 December. This attenuation of the radiation on pollution days directly resulted in the change of the SEB. In Fig. 9, clearly, LE was extremely low, less than $50 \,\mathrm{W}\,\mathrm{m}^{-2}$ during this 4 d period in winter. The peak value of H was about 154, 53 and 117 W m⁻², on 1–3 December, respectively. On 3 December, the heat flux showed a dramatically decrease, e.g., from 117 to 53 W m⁻² in 1 h (11:00-12:00 LST), which aggravated the negative effect on pollutant diffusion (corresponding to the CS). There was a thick temperature inversion close to the surface that lasted till the afternoon on 4 December, as described in the last section, which resulted in the downward heat transfer (H < 0) to the urban surface in daytime. Gao et al. (2015) also found that large positive radiative forcing reduced the H and LE by $5-16 \text{ Wm}^{-2}$ and 1-5 W m $^{-2}$ during a severe fog-haze event over the NCP, by using WRF-Chem model simulations. By analyzing the measurements collected at a rural site (farmland) Gucheng in Hebei Province from 1 December 2016 to 31 January 2017 in winter, Liu et al. (2018) confirmed that the mean daily maximum H was only $40 \,\mathrm{W}\,\mathrm{m}^{-2}$ on heavily polluted days (daily mean PM_{2.5} concentration > $150 \,\mu g \, m^{-3}$), but reached 90 Wm^{-2} on clean days (daily mean PM_{2.5} concentration $< 75 \,\mu g \, m^{-3}$). Model simulations have pointed out that the reduced sensible heat resulting from aerosol backscattering could lower the air temperature and suppress the growth of the ABL (Yu et al., 2002). In our case, the large reductions of H on 2–4 December also imply that the high $PM_{2.5}$ (PM₁) concentrations from the nighttime till after sunrise may have suppressed the evolution of the UBL. Further and more detailed investigation into the development of the UBL was reported in the next section.

Mostly, during daytime, $G - Q_F$ was the largest consuming term in the SEB, accounting for about 65 %, 83 %, 78 % and 71 % averaged in the afternoon hours (12:00–14:00 LST) on 1–4 December, respectively. Although changes in Q_F at the IAP site are unknown due to unavailable accurate energy consumption and traffic flow data, the Q_F term, an additional energy source, is always positive and can be assumed similarly during different days in a short term. Thus, the larger ratio of $G - Q_F$ relative to $R_n ((G - Q_F)/R_n)$ implies much



Figure 8. Hourly Himawari-8 geostationary meteorological satellite cloud images from 08:00 to 16:00 LST, 4 December, where the red point marks the location of the IAP station in Beijing, and the red square marks the mass of grey.

more heat is stored in the urban canopy, compared with other terms. Heat storage can be affected by different factors including atmospheric conditions (e.g., solar radiation, air temperature and wind speed) and urban characteristics (e.g., urban morphology, material properties and layout configuration) (Meehl and Tebaldi, 2004; Lindberg and Grimmond, 2011; Miralles et al., 2014; Sun et al., 2017). Urbanization results in land-cover change from vegetative to urban surfaces, and modifies the fractional coverage of urban. The fraction of impervious surfaces around the 325 m tower was investigated using an analytical footprint model and found to exceed 65 % (Wang et al., 2014). Such a large fraction of impervious urban surfaces in Beijing leads to large urban heat capacity. During the early morning on 2 December, the air temperature near the surface (illustrated in Fig. 4) was lower than on other mornings (i.e., at around 04:00 LST, about 5 °C lower than on 1 December at 2 m level ABG) and dropped to around zero, meaning a large amount of heat was lost from the urban volume. Then after sunrise, due to the high thermal conductivity of the concrete (about 65 times as large as the air), a considerable part of the R_n (maximum reaching 85 % at 12:00 LST for $G - Q_F$) was balanced by the heat storage in the urban fabric. Compared with 1 December, the larger heat storage with similar R_n (differing by less than 16 W m⁻²) on 2 December led to weaker heat flux, which was unfavorable to the diffusion of the pollutants (a slight increasing trend in PM_{2.5} / PM₁ from 09:00 LST to noon, Fig. 2). Specifically, under the conditions of early morning, much more solar heat is absorbed to warm the large urban fabric after sunrise. In addition, previous studies have demonstrated



Figure 9. Diurnal cycle of (a) sensible heat flux, (b) latent heat flux and (c) heat storage minus anthropogenic heat (termed as $R_n - H - LE$), observed at the 140 m level of the 325 m tower during 1–4 December 2016.

wind was a key determinant of changes in storage heat and the increasing amount of daytime heat storage in the urban canopy was strongly tied to lower wind speeds (Grimmond and Oke, 1999; Vautard et al., 2010; Sun et al., 2017). Thus, in this case, the weaker wind (Fig. 4c), associated with weak turbulent transport, contributed the larger heat storage ratios during polluted daytime, in particular on 2 December. Compared with the rural surface, Kotthaus and Grimmond (2014) reported the heat storage in urban surfaces led to delayed warming and cooling after sunrise and sunset, which resulted in the nocturnal stable conditions generally developing later (Barlow et al., 2015). In our study, generally, over the urban surface, compared with the clean daytime air, the polluted daytime air with calm wind conditions not only had reduced $R_{\rm n}$ but also a larger heat storage ratio, which contributed to weaker heat flux.

To improve our understanding of the role of the SEB in air pollution process, more work is needed, such as consideration of the uncertainty in eddy-covariance observations over complex heterogeneous urban surfaces and Q_F . Q_F is a very important term of SEB in urban areas (Sailor, 2011; Chow et al., 2014), and this additional heat release will enhance *H* and then increase the air temperature and BLH (Yu et al., 2014). Yang et al. (2018) found that incorporating anthropogenic heat emissions into the modeling system was effective in improving air quality predictions in Beijing. More specific studies on the impacts of the Q_F on the meteorology and air quality of the greater Beijing area can be made by urban–rural contrast with more observational data, or numerical models in further study.

3.4 Development of the UBL

The diurnal cycle of the ABL exerts strong control on the scalar concentrations of air pollutants (Oke et al., 2017). It is known that the ABL starts to grow after sunrise and deepens to a maximum value in midafternoon, then decreasing with the decreasing solar radiation reaching ground surface, during which the whole layer is convectively unstable and well mixed and is defined as CBL. After sunset, accompanied by diminishing turbulence, the boundary layer depth declines rapidly, and then the boundary layer becomes the NBL. Based on the general changes in BLH, the turbulent kinetic energy (TKE) at a certain depth or the amount of solar radiation, previous studies have proven that vertical mixing affects pollutant diffusion (Guinot et al., 2006; Sun et al., 2013; Guo et al., 2017). However, few have documented the diurnal circle of the intensity variation in vertical mixing in the UBL, on account of the limitation of instruments. Here, we took advantage of the Doppler lidar (superior spatial and temporal resolution) to quantify the values of the vertical mixing, described as vertical velocity variance σ_w^2 on clean and polluted days.

As presented in Fig. 10, it was found that the variance of σ_w^2 could characterize the development of the UBL. σ_w^2 became greater after sunrise (07:20 LST), then reached a maximum at about 14:00 LST, exhibiting an obvious trend of decline (from $\sigma_w^2 > 10^{-1}$ to $\sigma_w^2 < 10^{-2} \text{ m s}^{-1}$) after sunset (16:50 LST). When the UBL developed into NBL, σ_w^2 was about 10^{-3} m s^{-1} at the 200–300 m levels till midnight and decreased to about 10^{-4} m s^{-1} after midnight until sunset. σ_w^2 was obviously lower and its vertical distribution shallower during daytime pollution episodes compared with the daytime clean episode, which is consistent with the results concluded by analysis of SEB. The diminished R_n and enhanced heat storage ratio during polluted daytime on 2-4 December resulted in the weak vertical mixing. On 4 December, the vertical mixing was extremely weak, ranging from 10^{-4} to 10^{-5} , and there was barely any diurnal variation in σ_w^2 till 15:00 LST when the PM2.5 (PM1) had completely dissipated, which suggests the radiative cooling of aerosols and cloud was a major factor of influence in the UBL development by suppressing vertical mixing. Weak turbulence in this stagnating UBL could not break the deep temperature inversion (Fig. 5a), and such a shallow UBL seemed to act as an umbrella, blocking the entrainment with cold, clean air at the upper level, and solar radiation to the surface, and in return further suppressing the diffusion of pollutants, leading to not only the increasing PM2.5 (PM1) concentration during the CS but also much slower diffusion of PM1 at the surface than that at the 260 m level (Fig. 2). Accordingly, in our case study, the two-way feedback mechanism between air pollutants and the



Figure 10. Velocity variance, σ_w^2 (m² s⁻²), calculated from the Doppler wind lidar data. Derived planetary boundary layer depths, based on the threshold method, are depicted as black dots.

UBL is strikingly responsible for the cumulative and dissipation stages of these pollution episodes.

Compared to 1 December, the vertical mixing was weaker till about 5 h after the sunrise on 2 December (CS). This weak evolution of the CBL was consistent with the weak sensible heat flux (Fig. 9). As discussed in Sect. 3.3, a large amount of the heat was trapped in the cold urban fabrics under calm wind conditions (Fig. 2), resulting in poor sensible heat flux after sunrise and weak vertical mixing on 2 December. Additionally, the σ_w^2 mainly ranged from 10^{-6} to

 $10^{-5} \,\mathrm{m \, s^{-1}}$ a.g.l. to the detectable observing height during nighttime from 22:00 LST, 2 December, till the early morning 05:00 LST before the CS on 3 December. This ultra-weak turbulence transport maintained a very shallow and stable NBL. Note that values of the PM_1 concentration (Fig. 2) at the 260 m height of the 325 m tower changed slightly with time during the ultra-weak turbulence transport periods. Moreover, before the CS on 3 December, the aerosol lidar data (Fig. 11) showed that the gradient of the range-squaredcorrected signals (RSCS, calculated by $(RS - RS_0)r^2$ is applied to compensate for range-related attenuation from the atmosphere, where the lidar signal RS is corrected for the background noise contribution due to atmospheric skylight and electronic noise of the instrumentation used, the RS_0 is the background signal and r is the range between the lase source and the target) between the levels of 200-250 and 400-500 m a.g.l. was larger than the other levels from 18:00 LST (after sunset) 2 December to 05:00 LST (before sunrise) 3 December. As we know, both aerosols and water vapor affect the signals of the lidar. The larger RSCS at the time mentioned above, in our case, must not only have been because of the water vapor but also aerosol concentrations, consistent with the larger PM1 concentration at the 260 m level (more than 100 µg m^{-3}). Similarly, the larger RSCS between the levels of 200-250 and 400-500 m a.g.l. illustrated these levels were accumulated with high levels of pollutants and the vertical distribution of pollutants was inhomogeneous, all of which implies that the 260 m level may have been in the residual layer. The pollutants in the residual layer are known to play an important role in the diurnal changes of pollutants at the surface (Hastie et al., 1993; Berkowitz et al., 2000; Salmond and Mckendary, 2006). Sun et al. (2013) suggested that the high concentration of particles in the residual layer could reach the ground the following morning through convection, causing severe pollutant concentrations in Beijing. In the Tianjin area, Han et al. (2018) also found that a pollution layer was present at the altitude of 1000 m in the early morning on 16 December 2016, where the aerosols in the higher layers were transmitted to the ground by downward flow before the formation of heavy pollution. Actually, many studies have focused on this mechanism of pollutant vertical mixing in a stable NBL from the micrometeorology perspective. Turbulence in a very stable NBL is typically intermittent and generated by mechanical shear associated with changes in wind velocity with height (Mahrt et al., 1998), referred to as upside-down turbulence in an upside-down boundary structure, compared to the convective daytime case (Mahrt, 1999; Mahrt and Vickers, 2002). This upside-down structure is characterized by TKE (or σ_w^2), turbulent fluxes increasing with height, and negative transportation of TKE or velocity variances (Banta et al., 2006). As shown in Fig. 10, the σ_w^2 became larger at lower levels from 05:00 LST, 3 December, and then the largest values of σ_w^2 existed at 500–600 m, along with the corresponding $|\Delta U|$ shown in Fig. 6b. This turbulence could transport the pollutants accumulated in the residual layer downward to the lower levels, and contributed to the later CS of the pollution. Halios and Barlow (2018) also suggested that shear production dominates in the upper half of the UBL and could therefore not be neglected, even in cases with low wind. Consequently, the intermittent turbulence generated by the wind shear above a stable UBL plays an important role in the vertical spreading of pollutants.

As a key variable describing the structure of the UBL, the urban BLH estimated using the threshold method ($\sigma_w^2 > 0.1 \text{ m}^2 \text{ s}^{-2}$) from the Doppler lidar data is also shown in Fig. 10. For the CBL, the diurnal variations in CBL height were not described well by the threshold method for these



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Figure 11. Evolution of the lidar range-squared-corrected signal (RSCS) at 532 nm from 12:00 LST, 2 December, to 12:00 LST, 3 December 2016. The color scale indicates the intensity of the RSCS, and warm colors represent stronger light scattering.

4d, and especially on 4 December for the weak turbulence on the polluted day. Eventually, this empirical method was derived using data in autumn or summer, during which the vertical turbulence is much greater than in the winter. In our study, the criterion $\sigma_w^2 > 0.1 \,\mathrm{m}^2 \,\mathrm{s}^{-2}$ was not applicable because of weak vertical turbulence transport $(\sigma_w^2 < 0.1 \text{ m}^2 \text{ s}^{-2})$ at certain times of the day. The threshold method was also invalid in the NBL during this study period. This may be because of the weak vertical turbulence or smaller height of the NBL falling below the observable height (100 m). Using Windcube100 data during summer in Beijing, Huang et al. (2017) also pointed out that this method was reasonable for estimating the CBL depth, while it failed to determine the planetary boundary layer depths for late in the night. Subsequently, they defined the NBL top as the height at which the vertical velocity variance decreases to 10 % of its near-surface maximum minus a background variance. However, this new method for the depth of the NBL also failed in our studied period (figure omitted). This is because the NBL in winter is mostly steady, which does not satisfy the near-neutral assumption for the method developed by Huang et al. (2017). Additionally, the NBL has been a major problem for meteorologists for a long time, especially over polluted urban canopies, which make the problem far more complex. Therefore, further investigation of this method should be made in future.

Miao et al. (2018) pointed out that the BLH of a fully developed CBL was clearly anticorrelated with the daily $PM_{2.5}$ concentration, implying that the change in the BLH in the afternoon plays an important role in pollution levels, which is similar to our present conclusion. Furthermore, the mixing heights of the fully coupled CBL for 1–4 December were about 900, 500 and 400 m, respectively. Due to the weaker mixing intensity on 4 December, it is difficult to capture specific values of the BLH. As shown in Fig. 2, the max-

imum daily PM2.5 (PM1) concentrations increased day by day from 1 to 3 December, indicating high pollutant concentration near the surface coincides with a shallow CBL. Petäjä et al. (2016) reported that aerosol-boundary layer feedback remained moderate at fine PM concentrations lower than $200 \,\mu g \, m^{-3}$ in the Nanjing area, but became intensive at higher PM loadings, and the BLH decreased to half of the original height at particle mass concentrations slightly above $200 \,\mu g \, m^{-3}$. Similarly, particularly strong interactions were verified in the Beijing area when the PM2.5 mass concentration was larger than $150-200 \,\mu g \, m^{-3}$ (Luan et al., 2018). In our investigation, the BLH was reduced by about 44 % on 2 December with the low PM2.5 (PM1) concentration 46 (48) μ g m⁻³ and only a 5% attenuation of R_n . Additionally, for the PM_{2.5} (PM₁) concentration of $180(150) \,\mu g \,m^{-3}$ on 3 December, a 56 % reduction of the BLH was found with a 27 % attenuation of R_n . Therefore, in addition to the R_n term, it is important to note that the heat storage term in the SEB also makes a significant contribution to the reduction of BLH (details discussed in Sect. 3.3). In particular, over the megacity Beijing with a large fraction of impervious surface, heat storage accounts for a great amount of net radiation and its ratio increases with decreasing wind speed, which should be excluded from the quantitative analysis of the impact of aerosol pollutants on the UBL. Otherwise, the response degree of the UBL to aerosol pollutants would be overestimated, owing to the polluted days mostly accompanied by weak wind in Beijing.

Note that the BLH decreased significantly from 1 December to 2 December, while the $PM_{2.5}$ / PM_1 concentration increased only a little, which implied that the reduced BLH must be a negative factor, yet not the only one, in the dispersion of pollutants. As mentioned in the introduction part, heavy pollution in Beijing is also highly related to high relative humidity (RH), which is positive for the rapid forma-



 R_n : net radiation H: sensible heat flux G: heat storage Q_F : anthropogenic heat WS: wind speed RH: relative humidity BLH: boundary layer height UBL: urban boundary layer $\partial \omega^2$: vertical velocity variance

Figure 12. Schematic diagrams of the roles of synoptic conditions, surface energy budget in the development of UBL, and the two-way feedback between UBL structure and accumulation of $PM_{2.5}$ during 1–4 December 2016; the values of meteorological elements are averaged for afternoon hours (12:00–14:00 LST).

tion of secondary aerosol. On 3 December, during the period after sunrise before the CS, with weak winds, appreciable near-surface moisture accumulation appeared with RH over 60 % (Fig. 4c, a), while the RH was about 40 % after sunrise on 2 December. Based on previous studies (Tie et al., 2017; Zhong et al., 2019), such enhanced moisture on 3 December would reduce direct radiation through accelerating liquid-phase and heterogeneous reactions to produce more secondary aerosols and enhancing aerosol hygroscopic growth to increase aerosol particle size and mass (Kuang et al., 2016), which would backscatter more solar radiation to space. Thus, the lower RH on 2 December was negative to the formation of secondary aerosol, resulting in the lower PM_{2.5} / PM₁ concentration on 2 December than on 3 December. Moreover, the sustained stagnant conditions on 2 December contributed to a certain degree of the PM2.5 / PM1 concentration before CS, which was one of the preconditions for the rapid formation of CS.

In general, the main impacts of synoptic conditions (pressure, wind, temperature, relative humidity, etc.) and surface energy balance on the UBL evolution, and then the interactions between the aerosol pollutants and UBL structure, can be summarized by a schematic diagram in the present study (Fig. 12), providing a critical reference for air pollution forecast and assessment in Beijing.

4 Conclusion

Using data from the 325 m meteorological tower in Beijing and two nearby lidars, we investigated the characteristics of UBL structure during 1–4 December 2016 in Beijing and examined the interaction between the structure of the UBL and the air pollution during three pollution episodes, especially the rapid CS during which the PM_{2.5} concentration rose from about 100 to 500 μ g m⁻³ in 12 h. The main conclusions can be summarized as follows.

1. During this 4 d study period, the air pollution gradually worsened on a day-by-day basis, with deceasing surface air pressure. In particular, the large-scale circulation with a saddled pressure field was highly unfavorable for the dispersion of pollutants on 3 December during the CS. The RH was larger than 40 % during the heavy pollution episodes, and the vertical distribution of RH showed a remarkably inhomogeneous pattern during the peak period of the CS with the deep RH (> 80%) at the 47-240 m levels and heavy surface PM2.5 / PM1 concentration (about 500 μ g m⁻³ / 400 μ g m⁻³) in the early morning on 4 December. Temperature inversion ($\Delta \theta >$ 0) occurred during all three nights. For the first pollution episode during nighttime on 1–2 December, a southern neutral LLJ was found at the 200-1000 m levels after sunset till midnight over Beijing, which transported the pollutants from the south of Beijing by advection. For the second episode during nighttime on 2–3 December, weak southerly wind $(< 3 \text{ m s}^{-1})$ dominated below the 600 m level, with small vertical gradients, due to the saddle-type pressure-field background. Meanwhile, for CS on 3 December, there was a very deep and weak wind layer, which extended to about the 1100 m level till 22:00 LST, 3 December, when the accumulated $PM_{2.5}$ concentration was larger than 400 µg m⁻³ at the surface.

- 2. Compared with the DSR during the daytime clean episode on 1 December, the attenuation ratio of the DSR was about 5%, 24% and 63%, in the afternoon hours (12:00-14:00 LST) on 2-4 December, which mainly caused a 3%, 27% and 68% reduction of the R_n . The large attenuation of solar radiation on 4 December resulted from the cloud caused by the large aerosol loading with high RH on 3 December, possibly supporting plentiful CNN for the formation of cloud. Generally, the latent heat exchange term was very low during these 4 d over the urban canopy in Beijing, and the dominant term was mostly the heat storage minus anthropogenic heat, calculated as $R_n - H - LE$, during daytime, which accounted for about 65 %, 83 %, 78 % and 71 % of $R_{\rm n}$ (averaged 1200-14:00 LST) on 1-4 December. We also found that lower H appeared on the polluted days than on the clean days, which was partly caused by the large consuming term of the heat storage in the urban fabric with calm wind conditions.
- 3. In the CBL, the diurnal circle of lidar-based σ_w^2 agreed with the variation in the diurnal cycle of H estimated by the eddy-covariance method at the 140 m level of the 325 m tower, showing that vertical mixing was obviously weakened on polluted days. Compared to the clean day, the evolution of the UBL was delayed by about 5 h after sunrise (about 07:20 LST) on 4 December because of the long-term (> 12 h) existence of temperature inversion resulting from the effects of both aerosols and clouds. This stagnating UBL seemed to act like an umbrella, suppressing the diffusion of PM₁ at the surface, which was cleaned at about 15:00 LST, while the PM₁ at the 260 m level was driven away by the strong clean northerly wind flow at about 07:00 LST. Therefore, this two-way feedback mechanism between air pollutants and the UBL was strikingly responsible for the cumulative and dissipation stages of this pollution event in our case. Additionally, the intermittent turbulence generated by the wind shear above the stable NBL in the early morning on 3 December may have contributed to the CS through the downward transport of pollutants from the residual layer. Compared to 1 December the reduction of the maximum BLH was 44 % on 2 December and 56% on 3 December, whereas the BLH on 4 December was unobtainable due to the stagnating UBL growth.

Data availability. Data used in this study are available from the corresponding author upon request.

Author contributions. LW and GZ determined the goal of this study. LW carried it out, analyzed the data and prepared the paper with contributions from all co-authors. JL, MH and SF helped to process the three-dimensional sonic anemometer, Doppler and dual-wavelength depolarization lidar original records. SM provided radiation observations. HZ provided Doppler data. YS provided PM₁ data. TY provided dual-wavelength depolarization lidar data. LW wrote the first draft of the paper. All authors contributed to the improvement of this paper and approved the final version of the paper.

Competing interests. The authors declare that they have no conflict of interest.

Acknowledgements. This work was funded by the National Key Research and Development Program of the Ministry of Science and Technology of China (2016YFC0203304 and 2017YFC0209601) and the open funding of State Key Laboratory of Loess and Quaternary Geology (SKLLQG1842). We also thank the three anonymous reviewers for their valuable comments and suggestions.

Financial support. This research has been supported by the National Key Research and Development Program of Ministry of Science and Technology of China (grant nos. 2016YFC0203304 and 2017YFC0209601) and the open funding of the State Key Laboratory of Loess and Quaternary Geology (SKLLQG1842).

Review statement. This paper was edited by Stefano Galmarini and reviewed by three anonymous referees.

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