Impact of emission controls on air quality in Beijing during APEC 2014: lidar ceilometer observations

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Abstract

The implementation of emission reductions during the 2014 Asia-Pacific Economic Cooperation (APEC) summit provides a valuable opportunity to study air pollution in Beijing. From 15 October to 30 November 2014, the height of the atmospheric mixing layer and the vertical attenuated backscattering coefficient profiles were observed online using a lidar ceilometer. Compared with fine particulate matter (PM$_{2.5}$) and aerosol optical depth (AOD) data, the attenuated backscattering coefficients measured by the lidar ceilometer were strongly correlated with the PM$_{2.5}$ concentration and AOD (correlation coefficients of 0.89 and 0.86, respectively). This result demonstrated the reliability of the vertical distribution of particles measured by the lidar ceilometer. By classifying different air pollution degrees based on visibility, we found that during the transition period of air pollution, which was affected by transport of southerly flows in the mixing layer, the attenuated backscattering coefficient from 0 to 1500 m was enhanced by approximately 1.4 Mm$^{-1}$ sr$^{-1}$ (140%). During the polluted period, the attenuated backscattering coefficient from 0 to 300 m suddenly increased, and the coefficient near the surface peaked (approximately 14 Mm$^{-1}$ sr$^{-1}$); however, the attenuated backscattering coefficient from 300 to 900 m decreased gradually, and the average value from 0 to 1500 m decreased by 0.5 Mm$^{-1}$ sr$^{-1}$ (20%). The height of the mixing layer gradually decreased, and the ratio of CO/SO$_2$ gradually increased, which indicate that the polluted period was dominated by local contribution. Due to the emission reductions during APEC (DAPEC), the concentration of PM$_{2.5}$ decreased by 59.2 and 58.9% and visibility improved by 70.2 and 56.0% compared to before (BAPEC) and after APEC (AAPEC), respectively. The contribution of regional transport in DAPEC decreased by approximately 36 and 25% and the local contribution decreased by approximately 48 and 54% compared to BAPEC and AAPEC, respectively. The most effective method of controlling air pollution in the Beijing area is to reduce regional emissions during the transition period and reduce local emissions during the polluted period.
1 Introduction

Aerosols are relatively stable suspensions formed by micro-liquid and solid particles that are uniformly distributed in the air (Seinfeld, and Pandis, 1998). Atmospheric aerosols can directly change the balance and distribution of global radiation by scattering or absorbing sunlight, and they can also affect the formation of clouds and fogs (as condensation nucleus) and indirectly affect the global climate (Shine and Forster, 1999; Myhre et al., 2001; IPCC, 2007). Furthermore, atmospheric aerosols are carriers of photochemical reactions and provide good reaction beds for chemical reactions; therefore, they promote the occurrence of atmospheric photochemical reactions (Seinfeld and Pandis, 1998). Because of their small radii and high specific areas, atmospheric aerosols can easily accumulate as hazardous material and can be absorbed by human bodies, where they are deposited in the lungs and threaten human health (Englert, 2004; Campbell et al., 2005; Peters, 2005; Auger et al., 2006).

With the rapid economic development of China, the amount of industrial products and the number of vehicles increase year-by-year, thus lead to an increase of energy consumption (National Bureau of Statistics of China, 2014). The North China Plain region has one of the highest global aerosol concentrations (Lu et al., 2010). Beijing, the economic, political and cultural center of China, is adjacent to the Yanshan Mountains to the north and Taihang Mountains to the west and is on the north boundary of the North China Plain (Fig. 1). This special horseshoe-shaped geographical region provides efficient southerly transport of pollutants to Beijing, which affects air quality (Ding et al., 2005; Xin et al., 2010). In 2012, China promulgated the Air Pollution Prevention and Control Action Plan to prevent and control air pollution, and the details were disseminated in September 2012. The key control region for air pollution is the North China Plain, which contains Beijing, Tianjin and Hebei. The coordinated prevention and control of pollution in this region have been proposed (State council, 2013).

Although coordinated regional prevention and control have been proposed for many years, it is difficult to obtain evidence and quantify the intensity of regional transport solely
based on ground observations. Thus, reductions in regional emissions have not been im-
plemented. Previous studies attempted to use air quality model to quantify the intensity and
height of regional transport (Wu et al., 2011). However, the vertical gradient of air pollutants
was not measured to test the model; therefore, the results are not reliable. Thus, it is of
great importance to measure the vertical gradient of air pollutants to quantify the intensity
and height of the regional transport.

Studies of the vertical distribution characteristics of atmospheric aerosols include layered
observations from meteorological observation towers, mooring boats, airplanes, ground re-
 mote sensing and satellites, and such data can be utilized for exploration and measure-
ments of different spatial regions from the near-surface to the free atmosphere. Using these
observation methods to study the vertical gradient, the effects of sand storms (Zhang et al.,
2006; McAuliffe and Ruth, 2013), volcanic eruptions (Emeis et al., 2014), and anthropogenic
sources (Tesche et al., 2007; Kamp et al., 2008; Zhang et al., 2009; Hänel et al., 2012; Sun
et al., 2013) on the atmospheric environment have been evaluated in several countries.
However, such studies in north China remain at the initial stages. Using the airplane obser-
vation method, Zhang et al. (2006) classified the origin of atmospheric aerosols in Beijing
and showed that they are primarily affected by sand storms, southerly transport and local
emissions. Their airplane data were used to determine the concentration of aerosol parti-
cles and vertical distribution characteristics of particle radii in the Beijing area during the
periods when atmospheric aerosols are mainly affected by anthropogenic sources. Zhang
et al. (2009) also analyzed the causes of vertical aerosol distribution under different me-
eteorological conditions by considering meteorological factors. Guinot et al. (2006) and Sun
et al. (2013) used the layered meteorological observation method to show variations in the
vertical gradient of air pollutants during periods of heavy pollution. Although the aforemen-
tioned studies analyzed the vertical variation of aerosols in the Beijing area, the results
are not ideal because they have low resolution, small sample size and low observational
height; they are unrepresentative; and they lack evidence for regional transport. In recent
years, satellite observations have become increasingly important in investigations of atmo-
spheric aerosol profiles. In addition, satellite observations provide reliable results compared
with ground remote sensing (Wu et al., 2014). However, the resolution of the satellite observation method is very low because of short passing time. Therefore, surface remote sensing is the best method to acquire the continuous vertical structure of atmospheric aerosols in high resolution.

The Asia-Pacific Economic Cooperation (APEC) summit was held from 3 to 11 November 2014 in Beijing, and it was important to ensure good air quality to provide for a successful summit. Thus, the governments of Hebei province, Tianjin city, Shanxi province, Inner Mongolia autonomous region, and Shandong province cooperated with the government of Beijing to increase the intensity of emissions reductions for the entire region of north China during the APEC summit, and a series of emission reduction methods were conducted. Consequently, more than 460 businesses with high emissions in Beijing were required to stop or limit their production during 3–12 November, 2014. The number of private vehicles in operation during the same period was reduced by 50% through an odd/even number plate rule. Further, 9298 enterprises were suspended, 3900 enterprises were ordered to limit production, and more than 40,000 construction sites were shut down in all six provinces, cities and autonomous region. Besides, with the heating supply began to run extensively after 15 November, there was also a slight difference in emissions in the time period before vs. after APEC. Therefore, the implementation of these emission variability methods resulted in significant variations in regional transport and local pollutant contributions. In this study, a lidar ceilometer was used to determine the mixing layer height and the attenuated backscattering coefficient before and after APEC (15 October to 30 November 2014). The values for fine particulate matter ($PM_{2.5}$) and aerosol optical depth (AOD) were combined, and the present study tested and compared the attenuated backscattering coefficient measured by the lidar ceilometer from 15 October to 30 November 2014. By applying visibility as an index to classify the degrees of air pollution, the vertical gradients of the attenuated backscattering coefficient were analyzed during multiple pollution episodes to determine the origin of atmospheric pollution for different degrees of air pollution. Afterwards, changes in the attenuated backscattering coefficient profiles before, during and after APEC (BAPEC, DAPEC and AAPEC, respectively) reflect the causes of variation during different pollution degrees.
and relative contribution of regional transport and local emissions in DAPEC. Finally, three
typical pollution episodes were analyzed in BAPEC, DAPEC and AAPEC to show the ori-
gin of atmospheric pollution in different pollution degrees in Beijing and the effects of the
emission reduction methods in DAPEC. The results strengthen our knowledge of pollution
formation and development in the Beijing area and provide a scientific basis for the control
of air pollution in Beijing.

2 Methods

2.1 Measurements of attenuated backscattering coefficients

An observational station (BJT) was built in the Tieta courtyard of the Institute of Atmospheric
Physics of the Chinese Academy of Science (West of Jiandemen, Haidian District, Beijing)
(Fig. 1). The station was between North Third Ring Road and North Fourth Ring Road,
and route G6 was on the east side. The geographic location of the station was 39.97° N,
116.37° E, and the altitude was 60 m.

The equipment used in this study included an enhanced single-lens lidar ceilometer
(CL51, Vaisala). This equipment adopted the strobe laser lidar (laser detection and distance
measurement) technique (910 nm) to measure the atmospheric attenuated backscattering
coefficient profiles. The detection distance of the CL51 ceilometer was 15.4 km, and it had
a temporal resolution of 6–120 s and vertical resolution of 10 m. Because the height of the
atmospheric mixing layer barely exceeded 4 km and the concentration of aerosols in the
free atmosphere above the mixing layer is low in the Beijing area, high detection distance
was not necessary to study the air pollution in this area. To strengthen the echo signals
and reduce detection noise, the detection height of the ceilometer was reduced by half to
7.7 km. Additional data were obtained to smooth the noise of detection signals by setting
the temporal resolution of detection to 16 s. To filter the noise of the observed data, 240 m
vertical, 1200 s time smoothly averaging was applied by BLVIEW software before analyses
(Münkel et al., 2007).
2.2 Evaluation method of attenuated backscattering coefficients

Although aerosol concentration cannot be measured directly by a ceilometer (Wiegner et al., 2014), the attenuated backscattering coefficient is a good indicator of the aerosol stratification. However, uncertainties might occur in the attenuated backscattering coefficients measured by the lidar ceilometer, especially above the boundary layer where the aerosol concentration is low (Jin et al., 2015). In addition, the attenuated backscattering coefficients measured in the spectral region of 910 nm are influenced by water vapor absorption, and the strength of the influence can be highly variable in time and space (Wiegner and Gasteiger, 2015). Therefore, the representativeness of the attenuated backscattering coefficient must be evaluated by comparison with other observations, and a good relationship indicates that the influence of water vapor absorption is negligible.

To evaluate the atmospheric attenuated backscattering coefficients measured by the lidar ceilometer, two methods based on the near-surface PM\textsubscript{2.5} concentration and AOD column data were adopted in this study. The reliability of measured results based on calibration of the near-surface attenuated backscattering coefficients was evaluated by comparing the near-surface PM\textsubscript{2.5} concentrations and near-surface atmospheric attenuated backscattering coefficients. Observational PM\textsubscript{2.5} data were downloaded from the Chinese Environmental Protection Administration website (http://www.zhb.gov.cn/), and observational data at the Olympic center (OLY), which was the closest landmark to the observational station, were chosen for comparison (Fig. 1). The AOD data were measured using the MICROTOPS II heliograph at BJT station (Fig. 1), and the weather conditions were sunny and partly cloudy. Each measurement was repeated three to five times, and the average value was used as the mean value at each time step. Because the waveband of the heliograph is different from the observational range of the lidar ceilometer, the AOD at 910 nm, which is consistent with the wavelength of the lidar ceilometer, was derived from the measured AOD at 1020 nm using the heliograph and wavelength indices of four wave bands. The derivation method was based on Eq. (1), where $\alpha$ is the wavelength index between 340 and 675 nm, and $\tau$ is...
the AOD:
\[ \ln \alpha = \frac{\ln \tau(1020 \text{nm}) - \ln \tau(910 \text{nm})}{\ln 1020 - \ln 910} \]  

(1)

2.3 Calculation of mixing layer height

Because the particle lifetimes are long and range from several days to tens of days, the distribution of particle concentrations in the atmospheric mixing layer is more uniform than that of gas-phase pollutants (Seinfeld, and Pandis, 1998). In addition, huge differences in the concentrations of particles are observed between the mixing layer and free atmosphere. The profile of attenuated backscattering coefficients in the atmosphere can be analyzed to determine the location of sudden changes caused by variations in the attenuated backscattering coefficients, which is at the top of the atmospheric mixing layer. The lidar ceilometer is inexpensive and convenient and has been widely applied in observations of the mixing layer height (Michael et al., 2006; Münkel et al., 2007; McKendry et al., 2009; Emeis et al., 2012; Yang et al., 2013; Pandolfi et al., 2013; Schween et al., 2014; Scarino et al., 2014). In this study, the gradient method was used to identify the mixing layer height, and maximum negative gradient value \((-d\beta/dx)\) of the attenuated backscattering coefficient profile was at the top of the mixing layer (Michael et al., 2006; Emeis et al., 2012). Because the data are easily affected by noise and interference from the aerosol layering structure, time or space must be smoothly averaged before the gradient method can be used to calculate the mixing layer height from the profile data (Münkel et al., 2007).

2.4 Other data

Because Beijing has a low concentration of industry and a large amount of vehicle traffic, the emissions of \(\text{SO}_2\) are low, while the emissions of \(\text{CO}\) are high. Thus, the ratio of \(\text{CO}\) to \(\text{SO}_2\) may provide a partial indication of the origin of atmospheric pollutants. The \(\text{CO}\) and \(\text{SO}_2\) data at OLY station published by the Chinese Environment Protection Administration were also used to help analyze the origin of atmospheric pollutants (Fig. 1). The obser-
vational data were downloaded from the live-updated website published by the Chinese Environment Protection Administration (http://www.zhb.gov.cn/).

Visibility was measured at BJT station using a Belfort Model 6000 visibility sensor to characterize the degree of atmospheric pollution during this period. In addition, to understand the transport characteristics of different atmospheric pollution degrees, wind speed and direction vertical profile data were obtained from the international standard weather station (ID: ZBAA) (Fig. 1). The meteorological sounding profile data were measured twice a day at 08:00 and 20:00 LT at station ZBAA.

3 Results and discussion

3.1 Overview of air pollution

During the summit, a number of controls were adopted to guarantee good air quality in Beijing. To understand the pollution variation tendency during this period, the PM$_{2.5}$ concentration was plotted against time using the hourly PM$_{2.5}$ concentration data from 15 October to 30 November (Fig. 2). The observation period lasted for 47 days, and nine poor air quality episodes were observed, which lasted for 5.2 days on average. During each pollution episode, the PM$_{2.5}$ concentration was characterized as “slowly accumulating and rapidly disappearing”. At the transition stage during each pollution episode, the pollutant concentration increased. After reaching the maximum value, the pollutant concentration plateaued for 1–2 days and then rapidly decreased, which usually lasted for four to six days from the beginning of the pollution episode to the end. This result is consistent with previous studies (Jia et al., 2008).

A statistical analysis of the ground concentrations of PM$_{2.5}$ and heights of the mixing layers at the same time showed that with mixing layer heights rising from 0 to 1000 m, the average PM$_{2.5}$ concentration decreased from 158.9 to 67.9 µg m$^{-3}$. When mixing layer heights rose above 1200 m, the PM$_{2.5}$ concentration suddenly decreased (lower than 35 µg m$^{-3}$) and did not vary with increasing height of the mixing layer (Fig. 3). Thus, when the mixing
layer was lower than 1000 m, the PM$_{2.5}$ concentration was negatively correlated with the mixing-layer height, and when the mixing layer was above 1000 m, the air was of good quality and the negative correlation between the PM$_{2.5}$ concentration and mixing-layer height disappeared. Therefore, increased pollution during each pollution episode gradually led to the accumulation of PM$_{2.5}$ above 60 µg m$^{-3}$, and the corresponding mixing layer heights were all below 1000 m. This result indicates that the vertical diffusion capability of the atmosphere is weak, and atmospheric pollution in Beijing may be enhanced by local emissions. Because the level of industry and coal pollution is low and the number of vehicles is high in Beijing, the ratio of CO/SO$_2$ can reflect the contribution of local emissions to air pollution, with higher ratios indicating higher local contributions. The ratios of CO/SO$_2$ show that with decreasing mixing layer height, the ratio of CO/SO$_2$ gradually increased (Fig. 3). This result also suggests that with increasing pollution, the amount of pollutants transported from other regions gradually decreases while the local contribution gradually increases.

### 3.2 Characteristics of attenuated backscattering coefficients

#### 3.2.1 Evaluation of attenuated backscattering coefficients

Because the vertical distribution of atmospheric pollutants in the convective layer can better represent the evolution characteristics of pollution, the PM$_{2.5}$ and AOD data observed during this time period were used to compare the near-surface atmospheric attenuated backscattering coefficient and 0 to 4500 m column attenuated backscattering coefficient, and the results could be used to evaluate the attenuated backscattering coefficient profile measured by the lidar ceilometer helping us to better understand the vertical structure of atmospheric pollution.

The overlap of the laser beam of the ceilometer and its receiver field-of-view is smaller than 1 in the near range. Therefore, the attenuated backscattering coefficient values at a height of 100 m were chosen for comparison with the near-surface PM$_{2.5}$ concentration. The correlation showed that besides differences during several peak periods, the variations were generally consistent (Fig. 4a), which indicates that the attenuated backscattering co-
coefficients at 100 m and corresponding PM$_{2.5}$ concentrations were significantly positively correlated ($R = 0.89$) (Fig. 4b). For the column concentration, 4500 m can generally cover the entire mixing layer; therefore, the interference of cloud layers from 0 to 4500 m was manually removed, the atmospheric attenuated backscattering coefficients were integrated in this region, and the values were compared with AOD. The results showed that AOD varied directly with the integrated attenuated backscattering coefficient of the atmospheric column (Fig. 5a), and the positive correlation coefficient was as high as 0.86 (Fig. 5b).

It is noteworthy that any comparison with other parameters (PM or AOD) cannot lead to full agreement as long as we cannot quantify the water vapor effect (Wiegner and Gasteiger, 2015). Even so, the significant correlations between the attenuated backscattering coefficients and concentrations of PM$_{2.5}$ and the AOD showed that the vertical attenuated backscattering coefficient profile measured by the lidar ceilometer could accurately represent the vertical distribution of atmospheric aerosols in Beijing.

### 3.2.2 Vertical distribution of attenuated backscattering coefficients

According to the average vertical gradient of the attenuated backscattering coefficients during the period of observation, we found clear differences between the attenuated backscattering coefficients, with the highest values in the near-surface and average values reaching $4.5 \text{ Mm}^{-1} \text{sr}^{-1}$ (Fig. 6). The vertical lapse rate of the attenuated backscattering coefficients for layers from 0 to 200 m was small, and the attenuated backscattering coefficients showed limited variation; however, the vertical lapse rate above 200 m increased and the attenuated backscattering coefficients significantly decreased. After reaching the maximum value at the height of 400 to 800 m, the vertical lapse rate began to decrease gradually. Above 1000 m, the attenuated backscattering coefficient was below $0.65 \text{ Mm}^{-1} \text{sr}^{-1}$, and at approximately 2000 m, the coefficient was lower than $0.1 \text{ Mm}^{-1} \text{sr}^{-1}$. A vertical gradient with high values below and low values above is consistent with the characteristics of vertical gradient in other cities and regions (Tesche et al., 2007; Zhang et al., 2009; Liu et al., 2012; Cao et al., 2013; McAuliffe and Ruth, 2013), although it is different from those regions that are severely affected by regional transport (Yang et al., 2007). Thus, the gradual declining trend in the at-
tenuated backscattering coefficient from the near-surface to the upper boundary layer also indicates that the main sources of atmospheric aerosols are from the near-surface layers in Beijing.

3.2.3 Attenuated backscattering coefficients during different pollution degrees

Although the main sources of atmospheric aerosols occur in the near-surface layers, fine particles may originate from different locations for the different pollution degrees of each pollution episode. To analyze the origin of air pollution, visibility was used as an index to indicate the degree of air pollution and applied in the analysis of the vertical gradient profile of the attenuated backscattering coefficients under different visibility conditions (Fig. 7). When the visibility was above 40 km, small differences occurred in the vertical gradients of the attenuated backscattering coefficients from the ground to 1.5 km, and the corresponding attenuated backscattering coefficients were all below 2 Mm$^{-1}$ sr$^{-1}$. With decreasing visibility, the attenuated backscattering coefficients increased to varying degrees from the ground to 1.0 km. The near-surface layer presented a 2.1-fold increase from 2.4 to 7.4 Mm$^{-1}$ sr$^{-1}$ when the visibility decreased from 20 to 4 km, and the mean attenuated backscattering coefficient from 0 to 1500 m presented a 1.4-fold increase from 1 to 2.4 Mm$^{-1}$ sr$^{-1}$. In addition, the highly polluted region shifted from 0 to 300 to 0 to 900 m, indicating that transport in the upper boundary layer played an important role from the clear period to the transition period with medium haze. When the visibility decreased from 4 to 1 km, the attenuated backscatter coefficient near the surface varied from 7.4 to 14 Mm$^{-1}$ sr$^{-1}$. However, the mean attenuated backscattering coefficient from 0 to 1500 m significantly decreased from 2.4 to 1.9 Mm$^{-1}$ sr$^{-1}$ (approximately 20 %). The attenuated backscattering coefficient from 300 to 900 m significantly decreased and the variation at approximately 450 m reached the maximum value (decreasing approximately 4 Mm$^{-1}$ sr$^{-1}$), resulting in a sudden shift of the near-surface high concentration region from 0 to 900 m to 0 to 300 m. The significant decrease in the mean column concentration differed from the rapid increase of the near-surface concentration. Such a phenomenon is primarily caused by the weakened transport capability of the atmosphere during heavy haze, which results in decreased concentrations.
in the space from 300 to 900 m, and the increased contributions of local pollutants lead to a sudden increase of pollutant concentrations. Thus, during the transition period of air pollution, regional transport plays an important role, and within 0 to 600 m, it is characterized by strong regional transport. During the polluted period, local emissions are the most important factor and determine the accumulation rate of pollutants and pollution episode intensity.

3.3 Impact of emission controls during APEC

To evaluate the effectiveness of the emission reduction strategies during APEC, the observation periods were divided into three parts: BAPEC (15 October to 2 November), DAPEC (3 to 12 November) and AAPEC (13 to 30 November). A statistical analysis of the PM$_{2.5}$ concentration during these three time periods (Table 1) showed that the PM$_{2.5}$ concentrations in BAPEC, DAPEC and AAPEC were 126.8, 51.5 and 125.2 µg m$^{-3}$, respectively. Compared with BAPEC and AAPEC, the PM$_{2.5}$ concentration in DAPEC was decreased by approximately 60%. Correspondingly, the visibility was increased from 17.5 km in BAPEC and 19.1 km in AAPEC to 29.8 km in DAPEC, which is an increase of approximately 60%. To evaluate the diffusion capability of the atmosphere during these three periods of time, the corresponding wind speeds and mixing-layer heights were calculated. The wind speeds in BAPEC, DAPEC, and AAPEC were 2.4, 3.1 and 2.6 m s$^{-1}$, respectively, and the mixing-layer heights were 502.3, 452.8 and 423.9 m, respectively. Because wind speeds and mixing layer heights can represent atmospheric diffusion capacity along the horizontal and vertical directions, respectively, the ventilation coefficient (wind speed multiplied by the mixing layer height) was used as an index to evaluate the total diffusion capacity of the atmosphere. The ventilation coefficients in BAPEC, DAPEC, and AAPEC were 1208.3, 1400.0 and 1085.9 m$^2$ s$^{-1}$, respectively. Thus, the diffusion capability of the atmosphere was best in DAPEC, but the variation magnitude was far below the decreased magnitude of the PM$_{2.5}$, which indicates that coordinated regional emission reductions might have caused the significant decrease in PM$_{2.5}$ concentration because of the similar meteorological conditions during these three periods.
The results in Sects. 3.1 and 3.2 show that PM$_{2.5}$ originate from different sources during different pollution degrees. To identify the vertical gradient variations during different pollution degrees in BAPEC, DAPEC and AAPEC, the PM$_{2.5}$ concentration was divided as follows: 50, 50 to 100 and $>100 \mu g m^{-3}$, which represented the clean period, transition period and polluted period, respectively. The vertical gradient variations of the atmospheric attenuated backscattering coefficients under the three different pollution concentrations were statistically analyzed to obtain the attenuated backscattering coefficient profile plots for the three periods (Fig. 8).

During the clean period, the attenuated backscattering coefficients for BAPEC, DAPEC, and AAPEC from 0 to 2000 m were similar, and the coefficients for the near-surface were all below $1.5 Mm^{-1} sr^{-1}$ (Fig. 8a). The near-surface attenuated backscattering coefficients in AAPEC were $0.3 Mm^{-1} sr^{-1}$ higher than those during other periods because of widespread heating after 15 November. The variation magnitude was approximately 20%.

Because of the important effect of regional transport from 0 to 1000 m, the attenuated backscattering coefficients were all higher during the transition period compared with the clean period for BAPEC, DAPEC, and AAPEC, with 1.2- to 3-fold changes at different heights (Fig. 8b). Interestingly, compared with BAPEC and AAPEC, greater decreases in the coefficients occurred in DAPEC with increasing height, and at 1000 m, the value was approximately 35 and 25% lower compared with that of BAPEC and AAPEC, respectively. The smallest decrease of the attenuated backscattering coefficients occurred near the surface at only 10%. The decreased pollutant concentration in the upper boundary layer relative to the near-surface showed that during the transition period, regional transport was an important contributor to air pollution in Beijing. Considering the dominant effect of regional transport during this period and southerly flow transport in the lower atmosphere within 300 to 900 m, the mean attenuated backscattering coefficients in DAPEC, BAPEC, and AAPEC were calculated to eliminate the effect of local emission. The results showed that the attenuated backscattering coefficient for DAPEC decreased by 36 and 25% relative to BAPEC and AAPEC, respectively, which indicate that the contribution of regional transport to atmospheric aerosols in Beijing decreased by approximately 36 and 25%, respectively.
Compared with the transition period, the near-surface attenuated backscattering coefficients for DAPEC, AAPEC and BAPEC were all greatly enhanced during the heavy pollution stage and began to decrease at 600 to 1000 m. The near-surface attenuated backscattering coefficients in BAPEC and AAPEC exceeded 8 Mm\(^{-1}\)sr\(^{-1}\), which was approximately twice the variation that occurred in the transition period. The near-surface attenuated backscattering coefficient during the DAPEC polluted period was only 4 Mm\(^{-1}\)sr\(^{-1}\), and the increase compared to the transition period was 25%. Compared with BAPEC and AAPEC, the attenuated backscattering coefficients in DAPEC in the space from 0 to 2000 m were decreased by 0 to 48% and 0 to 54%, respectively, and the near-surface attenuated backscattering coefficients showed the greatest decrease at 48 and 54%, respectively. With increased height, the decreasing magnitude of the attenuated backscattering coefficients decreased gradually. The higher decreasing magnitude of the near-surface relative to the upper boundary layer indicates that during the polluted period, local emission contributed significantly to air pollution. Considering the dominant role of local emissions during the polluted period and using the near-surface attenuated backscattering coefficient as a baseline, the significant decreases in DAPEC relative to BAPEC and AAPEC indicate that the contribution of local emissions decreased by 48 and 54%, respectively.

Although a number of air pollution controls were implemented in DAPEC, the increased heat supply was the only difference between BAPEC and AAPEC. To evaluate the effect of heat supply on air pollution during the heavy haze periods in Beijing, the near-surface attenuated backscattering coefficients in BAPEC and AAPEC were compared, and the result showed that they were 1.1-fold higher in AAPEC than BAPEC, which indicates that the contribution from the heat supply to atmospheric aerosols in Beijing is approximately 10% during the heavy haze periods.

Based on the above discussion, three conclusions can be drawn: (1) the regional transport in DAPEC decreased by 25 and 36% compared with BAPEC and AAPEC, respectively, (2) the contribution of local emissions in DAPEC decreased by 48 and 54% compared with BAPEC and AAPEC, respectively; and (3) the contribution of the local heat supply to atmospheric aerosols in Beijing was approximately 10% during the heavy haze periods. Al-
though the quantitative contributions of local and regional areas are given, these are still rough estimates for different episodes. Detailed contributions of local and regional sources over north China still need further investigation and additional observational and modeling studies (although beyond the scope of the present analysis) are suggested for further work.

3.4 Characteristics of heavy pollution episodes

To predict the occurrence and development of air pollution under different pollution degrees in Beijing more precisely, the atmospheric attenuated backscattering coefficients, mixing layer height, ratio of CO to SO$_2$ during BAPEC, DAPEC, and AAPEC and backscattering profile with wind vectors during typical periods (Figs. 9–14) were evaluated in a time-series plot to investigate the characteristics and the causes of the attenuated backscattering coefficients during different pollution degrees at different heights. The heavy pollution episodes in BAPEC and AAPEC (Figs. 9, 10, 13 and 14) showed that during the transition period (21–23 October and 17–18 November), southerly flow resulted in increased mixing-layer height and a gradual increase of the atmospheric attenuated backscattering coefficient from the near-surface (100 m) to the upper boundary layer (300 to 900 m). From 300 to 800 m, the effect of the southerly flow was significant, and the pollutant concentration rapidly increased. However, during the polluted period (23–25 October and 19–20 November), the southerly flow disappeared. Thus, the mixing-layer height decreased because of the westerly and northerly flows and the attenuated backscattering coefficient of the upper boundary layer began to decrease. The reduction in mixing-layer height and relatively low wind speed promoted an increase in near-surface pollutants, which quantitatively accumulated during the polluted period. When cold, dry air masses go through Beijing, the attenuated backscattering coefficient and CO/SO$_2$ ratio in the lower and upper air both rapidly decreased with the rapidly increased mixing layer height, and the PM$_{2.5}$ in the atmosphere was significantly decreased. Subsequently, the evolution of a pollutant episode was completed. Although the mixing layer height gradually decreased, the “slow accumulation and rapid disappearance” characteristics of the PM$_{2.5}$ concentration, which were obvious in BAPEC and AAPEC, were not clear in the pollution episode in DAPEC (6–11 October). In addition, variations in the
PM$_{2.5}$ concentration and atmospheric attenuated backscattering coefficient appeared as zigzag shapes, and accumulation and disappearance alternated (Fig. 12). During the transition stage in DAPEC, the variations of air pollutants were similar to those of BAPEC and AAPEC. Because of the effect of the southerly flow, the simultaneous increase in the space from 0 to 900 m that occurred in BAPEC and AAPEC also occurred in DAPEC (Figs. 11 and 12). In addition, the ratio of CO to SO$_2$ was low, indicating that regional transport was dominant during this period. During the polluted period, the attenuated backscattering coefficient of the upper boundary layer in DAPEC significantly decreases because of the disappearance of westerly jet flows, which is consistent with what occurred in BAPEC and AAPEC. However, the near-surface attenuated backscattering coefficient did not show a sharp increase (up and down), and the CO/\text{SO}_2 ratio did not increase as expected. Instead, the near-surface attenuated backscattering coefficient decreased. Thus, during the DAPEC polluted period, the decreased local contribution magnitude of pollutants was insufficient to maintain the increases of pollutant concentrations at the near surface, which resulted in a zigzag distribution of atmospheric attenuated backscattering coefficients during the polluted period.

Based on the above discussion, southerly flow occurred during the transition period (21–22 October, 7–8 November, 17–18 November) in the upper boundary layer (300 to 900 m), and it transported large quantities of pollutants from the south to Beijing. In turn, the attenuated backscattering coefficients from the near-surface to the upper boundary layer increased, and the abundance of pollutants in the mixing layer increased. Pollutants transported during the daytime are mixed with pollutants released locally by convective mixing, and pollutants transported at night remain above the mixing layer overnight and then move to the near surface through upper boundary layer convection after the development of the mixing layer. Because of the transportation effect, the variation rate of the entire profile was relatively small and resulted in increased column concentrations of pollutants throughout the mixing layer, which led to the air pollution. During the polluted periods (24–26 October, 8–11 November, and 19–21 November), southerly flow was not significant, and it was replaced by near-surface static winds and westerly and northerly winds in the high layers.
Because of this effect, the near-surface attenuated backscattering coefficient continued to increase, whereas that of the upper boundary layer continued to decrease, resulting in increased variation rates of the entire profile with height. The contribution of local emissions to pollution during the polluted period increased, and its contribution to the upper boundary layer was reduced.

4 Conclusions

The APEC summit was held in Beijing from 3 to 11 November 2014. During this period, six provinces, cities and autonomous region near Beijing (Beijing, Tianjin, Hebei, Shanxi, Inner Mongolia, and Shandong) worked together to control the air pollution by emission reduction, so this period provided the best experimental platform for studying regional pollution and transport. The following conclusions have been drawn based on the attenuated backscattering coefficient and mixing layer height in the Beijing area as measured by lidar ceilometer for the period 15 October to 30 November 2014.

1. A comparison of PM\(_{2.5}\) concentrations and AOD values showed that the near-surface and 0 to 4500 m attenuated backscattering coefficient measured by the lidar ceilometer were well correlated with the near-surface PM\(_{2.5}\) and AOD values, respectively, indicating that the lidar ceilometer can be used to study air pollution and indicate regional transport characteristics of atmospheric aerosols in the boundary layer.

2. Air pollutants under different pollution degrees in Beijing were from different sources. The transition period was primarily affected by southerly flow, and pollutant transport in the space from 300 to 900 m was significant, which resulted in the accumulation of pollutants and air pollution in Beijing. However, during the polluted period, the contribution of upper air transport is decreased and local contributions played an important role.

3. PM\(_{2.5}\) concentrations in DAPEC in Beijing were affected by coordinated regional emission reductions and decreased by approximately 60 %, and the visibility was enhanced
by approximately 60%. During the transition period, the concentration was mainly af-
fected by regional transport, and the contribution of regional transport to aerosols in
the Beijing area was decreased by 36 and 25% compared to BAPEC and AAPEC,
respectively. During the polluted period, the concentration was dominated by local
contributions, and the local contribution in Beijing was significantly decreased by 48
and 54% relative to BAPEC and AAPEC. A comparison of the near-surface attenu-
ated backscattering coefficients in BAPEC and AAPEC showed that the contribution
of coal burning for heating to air pollution during the heavy haze period was approxi-
mately 10%.

Therefore, local emissions are the key factors determining the formation and development of
air pollution in the Beijing area, and a reduction in local emissions can greatly decrease local
pollution. However, regional transport can promote air pollution, so such processes cannot
be ignored, particularly during the transition period, which results in enhanced intensity and
increased accumulation of local pollution. Thus, during the transition period, emissions in
areas surrounding Beijing should be reduced to effectively control regional transport and
reduce the load of regional pollution. During the polluted period, local emissions should be
reduced to control pollution. Our results can provide a scientific basis for emission control
and management and air pollution forecasting and prevention, and they have the potential
for use in the design and implementation of coordinated regional reduction strategies.

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Table 1. Meteorological conditions and atmospheric particle concentrations during BAPEC, DAPEC and AAPEC.

|       | WS (m s\(^{-1}\)) | MLH (m) | Ventilation coefficient (m\(^2\) s\(^{-1}\)) | Visibility (km) | PM\(_{2.5}\) (µg m\(^{-3}\)) |
|-------|-------------------|---------|---------------------------------------------|-----------------|-----------------------------|
| BAPEC | 2.4               | 502.3   | 1208.3                                      | 17.5            | 126.8                       |
| DAPEC | 3.1               | 452.8   | 1400.0                                      | 29.8            | 51.5                        |
| AAPEC | 2.6               | 423.9   | 1085.9                                      | 19.1            | 125.2                       |
Figure 1. Observation sites and topography over Northern China.
Figure 2. PM$_{2.5}$ concentrations and mixing-layer heights vs. time from 15 October to 30 November 2014.
Figure 3. PM$_{2.5}$ concentrations and CO/SO$_2$ ratios of the mixing layer at different heights.
Figure 4. PM$_{2.5}$ concentrations and attenuated backscattering coefficients vs. time (a) and their correlations (b) from 15 October to 30 November 2014.
Figure 5. AOD values and 0 to 4500 m column attenuated backscattering coefficient vs. time (a) and their correlations (b).
Figure 6. The vertical attenuated backscattering coefficient profile and the lapse rate.
Figure 7. The vertical gradient of attenuated backscattering coefficients under different visibility conditions.
Figure 8. Attenuated backscattering profiles under different air pollution degrees during BAPEC, DAPEC and APPEC (a) PM < 50 µg m$^{-3}$, (b) 50 µg m$^{-3}$ < PM < 100 µg m$^{-3}$, (c) PM > 100 µg m$^{-3}$. 
Figure 9. Attenuated backscattering coefficients at different heights and near-surface CO/SO$_2$ ratios from 21–26 October.
**Figure 10.** Attenuated backscattering coefficients and wind vectors for the periods 21–26 October at (a) 08:00 LT on 21 October, (b) 08:00 LT on 22 October, and (c) 08:00 LT on 25 October.
Figure 11. Attenuated backscattering coefficients at different heights and near-surface CO/SO$_2$ ratios from 6–11 November.
Figure 12. Attenuated backscattering coefficients and wind vectors for 6–11 November at (a) 20:00 LT on 7 November, (b) 20:00 LT on 8 November, and (c) 20:00 LT on 10 November.
Figure 13. Attenuated backscattering coefficients at different heights and near-surface CO/SO$_2$ ratios from 17–21 November.
Figure 14. Attenuated backscattering coefficients and wind vectors for 17–21 November at (a) 20:00 LT on 17 November, (b) 20:00 LT on 18 November, (c) 20:00 LT on 21 November.