

# Measurement report: Vertical distribution of biogenic and anthropogenic secondary organic aerosols in the urban boundary layer over Beijing during late summer

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**Abstract.** Secondary organic aerosols (SOA) play a significant role in atmospheric chemistry. However, little is known  
15 about the vertical profiles of SOA in the urban boundary layer (UBL). This knowledge gap constrains the SOA simulation in  
chemical transport models. Here, the aerosol samples were synchronously collected at 8 m, 120 m, and 260 m based on a  
325-m meteorological tower in Beijing from August 15<sup>th</sup> to September 10<sup>th</sup>, 2015. Strict emission controls were implemented  
during this period for the 2015 China Victory Day Parade. Here, we observed that the total concentration of biogenic SOA  
tracers increased with height. The fraction of SOA from isoprene oxidation increased with height, whereas the fractions of  
20 SOA from monoterpenes and sesquiterpenes decreased. 2,3-Dihydroxy-4-oxopentanoic acid (DHOPA), a tracer of  
anthropogenic SOA from toluene oxidation, also increased with height. The complicated vertical profiles of SOA tracers  
highlighted the need to characterize SOA within the UBL. The mass concentration of estimated secondary organic carbon  
(SOC) ranged from 341 to 673 ngC m<sup>-3</sup>. The increase in the estimated SOC fractions from isoprene and toluene with height  
was found to be more related to regional transport whereas the decrease in the estimated SOC from monoterpenes and  
25 sesquiterpene with height was more subject to local emissions. Emission controls during the parade reduced SOC by 4–35%  
with toluene SOC decreasing more than the other SOC. This study demonstrates that vertical distributions of SOA within the  
UBL are complex, and the vertical profiles of SOA concentrations and sources should be considered in field and modeling  
studies in the future.

## 1 Introduction

30 In the middle of the 20<sup>th</sup> century, atmosphere pollution events began to be frequently reported in different regions worldwide  
(Barrie, 1986; Went, 1960; White and Roberts, 1976). Many studies on atmospheric aerosols have been undertaken to

understand the sources and evolution mechanisms of aerosols and discuss their effects on climate and human health. It is well known that atmospheric aerosols can impact radiative forcing, the hydrological cycle, regional and global climate, and human health (Kanakidou et al., 2005; Su et al., 2020), and these impacts were all shown in the Intergovernmental Panel on Climate Change (IPCC) report (IPCC, 2014). Generally, 20–90% of the mass concentration of particulate matter (PM) is contributed by organic aerosols (OA) in which ca. 30–70% are secondary organic aerosols (SOA) (Ervens et al., 2011; Huang et al., 2014). SOA is generally formed through the photooxidation of volatile organic compounds (VOCs), including biogenic VOCs (BVOCs, e.g. isoprene, monoterpenes, sesquiterpenes, and oxygenated hydrocarbons) from terrestrial vegetation and marine phytoplankton and anthropogenic VOCs (AVOCs, e.g. toluene and naphthalene) from biomass burning, coal combustion, vehicle exhausts, and solvent use.

Anthropogenic SOA (ASOA) and biogenic SOA (BSOA) are important contributors to OA and air pollution in the atmosphere (An et al., 2019; Hodzic et al., 2016; Nault et al., 2021). BSOA and ASOA fractions are potentially underestimated in models according to the previous studies (Shrivastava et al., 2017; Volkamer et al., 2006). In recent years, a large number of studies based on field observations suggest that the formation of BSOA can be enhanced by anthropogenic precursors, an effect which is known as anthropogenic-biogenic interactions (Goldstein et al., 2009; Shilling et al., 2012; Zelenyuk et al., 2017). Simultaneously, SOA can be transported on a regional or global scale, changing cloud condensation nuclei (CCN) size, influencing the climate, and damaging human health (Pöschl, 2005; Russell and Brunekreef, 2009; Shrivastava et al., 2017).

In the last decade, severe air pollution in China has attracted worldwide attention (An et al., 2019; Huang et al., 2020a). The haze episodes in China are suggested to result from a complex interplay of anthropogenic emissions, atmospheric processes, regional transport, meteorological conditions, and climatic conditions (An et al., 2019; Du et al., 2021; Huang et al., 2020b; Sun et al., 2016; Zheng et al., 2015). The high contribution of secondary aerosols to the PM pollution during haze events in China highlights the urgent need to understand the compositions and processes of SOA formation in the atmosphere (An et al., 2019; Huang et al., 2014). Previous studies have reported the chemical characteristics of OA in many regions in China (Li et al., 2018; Simoneit et al., 1991; Wang et al., 2006; Xie et al., 2020). However, studies characterizing the vertical properties of SOA in the urban boundary layer are lacking, which constrains research on the interactions of aerosols and regional transport, local emissions, atmospheric processes, and meteorological conditions in urban areas.

Vertical profiles of atmospheric dynamic structures, gaseous species, bulk chemical compositions, and nitrogen isotopes in the urban boundary layer (UBL) have been investigated over Beijing (Chan et al., 2005; Guinot et al., 2006; Sun et al., 2015; Wu et al., 2019; Zhao et al., 2017). Several field studies at the rainforest Amazon Tall Tower Observatory (ATTO) also measured the vertical gradients of VOCs. (Andreae et al., 2015; Yáñez-Serrano et al., 2018). However, vertical SOA profiles were still lacking. A previous study reported that the loading of SOA is high above the surface layer during the summer over the southeastern United States, which was potentially related to the heterogeneous chemical reactions and gas-to-particle conversion of BVOCs oxidation products (Goldstein et al., 2009). This highlights the pressing need to obtain the vertical SOA profiles in the cities, especially in a Chinese megacity frequently enduring severe air pollution. It is meaningful to learn

the SOA properties and probe its behaviors in the atmosphere. This information also has regulatory implications for decision makers.

Beijing, one of the super megacities of China, held the 2015 China Victory Day parade in the late summer of 2015. The government had implemented strict emission controls in Beijing and its seven surrounding provinces to improve the air quality. This provided a unique chance to study atmospheric aerosols under government interventions. Daily PM<sub>2.5</sub> samples were synchronously collected at three heights (8 m, 120 m, and 260 m, above ground level, respectively) based on a 325-m meteorological tower in urban Beijing during the period August 15<sup>th</sup> to September 10<sup>th</sup>, 2015. Observations at 8 m are more subject to local emissions whereas those at 120 m and 260 m are more representative of mixing and/or regional scale influences (Sun et al., 2015; Zhao et al., 2020). BSOA and ASOA tracers in PM<sub>2.5</sub> were quantified by gas chromatography/mass spectrometry (GC/MS); organic carbon (OC), elemental carbon (EC), and water-soluble organic carbon (WSOC) in PM<sub>2.5</sub> were also determined. In addition, the tracer-based method (Kleindienst et al., 2007) was used to estimate the contributions of biogenic SOC (BSOC) and anthropogenic SOC (ASOC). The influences of emission controls during the Parade period on the characteristics of SOC were also investigated. To the best of our knowledge, this was the first time that vertical profiles of SOA tracers were measured at a molecular level in a Chinese megacity. This campaign provided new insights into the formation mechanisms of SOA in haze episodes and the feedback on SOA influenced of local emissions, regional transport, and mixing of heights over the North China Plain (NCP). Furthermore, this study provided a scientific basis for China's initiatives to guarantee good air quality in Beijing and contributed to improving the simulations of SOA in the chemical transport models.

## 2 Materials and methods

### 2.1 Sampling

Daily PM<sub>2.5</sub> samples were collected at three heights: 8 m (at the rooftop of a two-story building about 10 m away from the 325-m meteorological tower), 120 m, and 260 m (at the platforms of the tower) in Beijing during the China Victory Day parade period (local time 08:00–6:00; August 15<sup>th</sup>–September 10<sup>th</sup>, 2015). The sampling site is at the Institute of Atmospheric Physics (IAP), Chinese Academy of Sciences (39°58.53'N, 116°22.69'E), which is in an urban site (between the 3<sup>rd</sup> and 4<sup>th</sup> ring Road) of Beijing and surrounded by traffic road (~50 m), highway (~300 m), a public park (~500 m to the southwest), restaurants (~100 m), residential housing and a gas station (~200 m). The predominant vegetation types surrounding the sampling site are deciduous broadleaf vegetation (acacia and juglandaceae), shrub, and lawn. The vegetation cover of the public park is more than 50%. The predominant vegetation is also deciduous broadleaf. Filter samples were collected onto pre-combusted (450 °C combusted for 6 h) quartz fiber filters (Pallflex, 8×10 in) using high-volume air samplers (TISCH, USA) at a flow rate of 1.1 m<sup>3</sup> min<sup>-1</sup>. The filter samples were enveloped in aluminum foils and stored at –20 °C in darkness until analysis. Meteorological parameters including wind speed (WS), wind direction (WD), temperature (T), and relative humidity (RH) at the heights of 8 m, 120 m, and 260 m were measured by the meteorological system on the

tower. Three periods are classified according to the phases of emission controls by the government: before the parade (Before-P): August 15<sup>th</sup>–19<sup>th</sup>; during the parade (During-Parade): August 20<sup>th</sup>–September 3<sup>rd</sup>; and after the parade (After-P): September 4<sup>th</sup>–10<sup>th</sup>.

## 2.2 Carbonaceous component Analyses

5 OC and EC in aerosols were directly analyzed by an OC/EC Carbon Aerosol Analyzer (Sunset Laboratory Inc., USA) following a NIOSH protocol (Mkoma et al., 2013). A portion of each filter of 3.14 cm<sup>2</sup> was extracted with 15 ml ultrapure water under ultrasonication with ice water for 20 min. WSOC in this water extract was measured by a total organic carbon (TOC) analyzer (Model NPOC, Shimadzu, Japan). The concentrations of OC, EC, and WSOC were calibrated with field blank filters.

## 10 2.3 Measurement of OA molecular compositions using GC/MS

A filter was extracted three times with dichloromethane/methanol (2:1, v/v) under ultrasonication. The extracts were then filtered, concentrated by a rotary evaporator, and blown down to dryness. After that, the dried extracts were reacted with 60 µl of N,O-bis-(trimethylsilyl)trifluoroacetamide (BSTFA) with 1% trimethylsilyl chloride and 10 µl of pyridine at 70 °C for 3 h. After sufficient reaction, 40 µl internal standard solvent (C<sub>13</sub> *n*-alkane, 1.43 ng µl<sup>-1</sup>) was added to the derivatives before  
15 GC/MS analyses. Three field blank filters were treated as real samples and used for quality calibration. GC/MS is performed on a Hewlett-Packard model Agilent 7890A GC coupled to Hewlett-Packard model Agilent 5975C mass selective detector (MSD). GC separation is equipped with a splitless injection and a fused silica capillary column (DB-5MS, 30 m×0.25 mm i.d., 0.25 µm film thickness). The GC oven temperature program was set as follows: hold at 50 °C 2 min, then increased to 120 °C at a rate of 15 °C min<sup>-1</sup>, heated up to 300 °C at a rate of 5 °C min<sup>-1</sup>, and finally hold at 300 °C for 16 min. The Mass  
20 Spectrometer was operated on the electron impact (IE) mode at 70 eV and scanned from 50 to 650 Da. Organic marker measurements were determined by comparing with references, library, and authentic standards, and were quantified with GC/MS response factors acquired using authentic standards or surrogates (Fu et al., 2009). The data reported in this work was corrected for the field blank but not for recoveries.

## 2.4 Air mass backward trajectory

25 To investigate the influences of air mass on urban aerosols of Beijing, 3-day backward trajectories starting at 300 m (a.g.l.) of every 6 hours were calculated for each sample using the HYSPLIT4 model (<http://ready.arl.noaa.gov/HYSPLIT.php>). Cluster analyses were applied to estimate the influence of air mass. As shown in Figure S1, seven clusters were determined. Air mass from south, southeast, and northeast of Beijing accounted for >70%. Especially, for pollution days, retroplumes of air masses were calculated by the FLEXPART (FLEXible PARTicle dispersion) model (Figure S2). Detailed information  
30 about the model was described in a previous study (Wei et al., 2018). The model was set with a height of 300 m (a.g.l.) and three-day backward trajectories.

## 2.5 Ancillary parameters

The ground surface concentrations of PM<sub>2.5</sub>, CO, SO<sub>2</sub>, NO<sub>2</sub>, and O<sub>3</sub> were obtained from the monitor station of the Olympic center (39.98°N, 116.40°E) about 3 kilometers away from our sampling site, which is available on the National urban air quality and real-time publishing platforms (<http://106.37.208.233:20035/>). The hourly levels of these parameters were shown in figure S4.

## 3 Results and discussion

Meteorological parameters (wind speed, wind direction, temperature, and relative humidity) at the sampling site during the observation period are shown in Figure 1. These meteorological parameters have been reported in the previous study (Zhao et al., 2017). The prevailing winds at 8 m were either easterly or westerly, while at 120 m and 260 m the wind directions were dominated by northerlies. Winds at the ground surface (8 m) were weaker than that at upper layers, which was likely related to the influences of surrounding buildings near the sampling site. Some high buildings are several hundred meters away from the sampling site. Vertical differences of wind speeds and directions suggest that samples collected at 8 m are more related to local source emissions whereas samples collected at upper layers are more influenced by the regional scale. Air temperature decreased slightly with the height, while relative humidity (RH) increased. This feature possibly plays a role in the vertical profile of the gas-to-particle partitioning of organic aerosols (Sun et al., 2015).

Three pollution episodes (marked as E1, E2, and E3) were recorded during the sampling period. The pollution episodes were defined according to a previous study (Zhao et al., 2017) and the air quality index (AQI) from the Chinese national environmental monitoring center (<http://www.cnemc.cn>). The prevailing winds during these pollution episodes varied with heights between 8 m and 260 m (Figure S3). The wind in the upper layers (120 m and 260 m) was mainly from the south, whereas at the ground surface layer (8 m) it was from the north. Similar to the air mass footprints (Figure S2), these results suggest that the air masses from the southern region significantly contributed to the haze pollution in Beijing (Tian et al., 2019; Zheng et al., 2015).

The concentrations of WSOC and OC were  $2.73 \pm 1.31 \mu\text{gC m}^{-3}$  and  $5.03 \pm 2.28 \mu\text{gC m}^{-3}$  at 260 m,  $2.69 \pm 1.55 \mu\text{g m}^{-3}$  and  $5.32 \pm 2.88 \mu\text{g m}^{-3}$  at 120 m, and  $2.03 \pm 0.99 \mu\text{g m}^{-3}$  and  $4.37 \pm 1.69 \mu\text{g m}^{-3}$  at 8 m, respectively (Figure S4 and Table S1). There were no significant differences between the average concentrations of WSOC and OC at the three layers (Table S2). However, the fractions of WSOC to OC at the upper layers (120 m and 260 m: 51.1% and 54.0%, respectively) were higher than that at 8 m (46.9%) (Table S1). The correlation coefficient values ( $R^2$ ) between WSOC and OC were also higher at upper layers: 0.96, 0.93, and 0.47 at 260 m, 120 m, and 8 m, respectively (Figure S5). These results reveal a predominant contribution of secondary sources to OA at the upper layers, indicating that organic aerosols in the upper layers were more oxidized than in the ground surface layer. This highlights the importance of investigating the vertical profiles of SOA in the UBL. In addition, primary sources from local dust and soil resuspension, such as primary biological aerosols which contain a

high abundance of water-insoluble organic compounds (Wang et al., 2019), potentially caused the lower fractions of WSOC to OC at the ground surface than at the upper layers.

Concentrations of identified secondary organic compounds are shown in Table S1, including BSOA tracers (isoprene, monoterpene, and sesquiterpene oxidation products), ASOA tracers (2,3-Dihydroxy-4-oxopentanoic acid (DHOPA) and phthalic acid for toluene and naphthalene oxidation products, respectively), poly acids and aromatic acids in the aerosols at three heights. Most of these molecular tracers showed higher abundance at high layers ( $\geq 120$  m) than at 8 m, except for pinic acid, pinonic acid, 3-acetyladipic acid and  $\beta$ -caryophyllinic acid. Table S2 shows significant differences in the average concentrations of these SOA tracers with height, except for monoterpene SOA tracers. Many factors can regulate the vertical profiles of SOA: (1) lower temperature and higher RH at the upper layers than the ground surface layer is potentially favorable to the condensation of semi-volatile organic compounds onto particles (Carlton et al., 2009; Hallquist et al., 2009); (2) local emission, regional transport, and vertical mixing can influence the relative loading and fraction of SOA in aerosols (Brown et al., 2013); (3) atmosphere oxidation capacity can also play a role in the formation of SOA (Wang et al., 2018a). Thus, vertical distributions of SOA can be useful for investigating the atmospheric behavior of aerosols in the UBL.

### 3.1 Vertical characteristics of SOA tracers

#### 3.1.1 Emissions of BVOCs

Vegetation species, plant growth stage, and environmental conditions can impact the release of BVOCs (Benjamin et al., 1997; Wang et al., 2003), which contribute to the vertical profiles of BSOA tracers. Northwest China is mainly grasslands or barren lands, while other areas of China, especially the south of China, are rich in terrestrial plants (Ran et al., 2012). The emission inventory showed that in summer a large amount of BVOCs was mainly emitted from northeast, north, southeast regions with only a small amount from southwest China (Yan et al., 2005). Isoprene is one of the most abundant non-methane VOCs, mostly emitted by broadleaf plants (deciduous or evergreen trees) and marine phytoplankton (Sharkey et al., 2008). Back trajectories showed that 70% of the air masses originated from south or northeast regions of Beijing (Figure S1), suggesting isoprene oxidation products were potentially influenced by the regional scale emissions of BVOCs from these regions. Monoterpenes are mainly emitted from needle leaf trees (e.g. coniferous plants), and the emissions from soil and litter in local places may be larger than those from vegetation (Faiola et al., 2014). Sesquiterpenes are mainly emitted from plants and trees, which are controlled by many factors, such as temperature and stage of plant growth (Duhl et al., 2008; Faiola et al., 2019). The different contributions from various BVOCs emissions are one possible factor that influences the observed vertical profiles of BSOA tracers. Terrestrial vegetation can emit a broad spectrum of BVOCs. Ambient temperature, solar radiation, soil moisture, and pollution situation can also affect their formation processes and concentrations in the atmosphere. In addition, oxidation processes (such as reaction rates and lifetime) simultaneously control the properties of BSOA in the atmosphere (Jaoui et al., 2007; Tarvainen et al., 2005).

### 3.1.2 Vertical distribution of BSOA tracers

The total concentrations of BSOA tracers were  $31.5 \pm 16.8 \text{ ng m}^{-3}$ ,  $36.4 \pm 26.1 \text{ ng m}^{-3}$ , and  $50.2 \pm 27.0 \text{ ng m}^{-3}$  at 8 m, 120 m, and 260 m, respectively (Table S1). The vertical distribution properties of BSOA tracers are related to complicated factors, such as regional transport and ambient temperatures influencing different BSOA species (Goldstein et al., 2009). The total concentrations of isoprene SOA tracers were  $19.7 \pm 12.0 \text{ ng m}^{-3}$ ,  $27.1 \pm 22.4 \text{ ng m}^{-3}$  and  $38.7 \pm 24.1 \text{ ng m}^{-3}$  at 8 m, 120 m, and 260 m, respectively, among which C<sub>5</sub>-alkene triols (the sum of cis-2-methyl-1,3,4-trihydroxy-1-butene, 3-methyl-2,3,4-trihydroxy-1-butene, and trans-2-methyl-1,3,4-trihydroxy-1-butene) were the most abundant compounds, followed by 2-methylerythritol (2-MT<sub>eryth</sub>), 2-methylthreitol (2-MT<sub>threi</sub>) and 2-methylglyceric acid (2-MGA) (Table S1). The total of monoterpene SOA tracers were  $10.5 \pm 5.18 \text{ ng m}^{-3}$  (8 m),  $8.45 \pm 3.68 \text{ ng m}^{-3}$  (120 m) and  $10.5 \pm 3.86 \text{ ng m}^{-3}$  (260 m). Pinonic acid (PNA) was the most abundant species at 8 m, whereas 3-methyl-1,2,3-butanetricarboxylic acid (MBTCA) was the dominant compound at 120 and 260 m. The concentrations of sesquiterpene SOA tracer ( $\beta$ -caryophyllinic acid) were  $1.32 \pm 0.63 \text{ ng m}^{-3}$ ,  $0.89 \pm 0.89 \text{ ng m}^{-3}$ , and  $1.02 \pm 0.69 \text{ ng m}^{-3}$  at 8 m, 120 m, and 260 m, respectively. The abundance of isoprene SOA tracers increased with height, while there was no significant variation of the concentrations of the monoterpenes and sesquiterpene SOA tracers.

The time series of the concentrations BSOA from isoprene, monoterpenes, and sesquiterpene at the three layers and their relative contributions are shown in Figure 2 and Figure S6. Their vertical patterns are also shown in Figure 3 and Figure 4. Generally, isoprene SOA tracers increased with height, while the other two kinds of SOA tracers varied slightly with height. From 8 m to 260 m, the contributions of total BSOA tracers by isoprene SOA tracers increased from 63% to 77%, while the fractions from monoterpene SOA tracers and sesquiterpene SOA tracer decreased from 33% to 21% and 4% to 2%, respectively (Figure 2d and Figure S7). It indicates that oxidized products from isoprene are more important contributors to SOA in Beijing over the late summer than other BVOCs products. It suggests that regional transport potentially contributes more to isoprene SOA, while SOA from monoterpenes and sesquiterpene is likely more influenced by local sources. In addition, some other factors (such as transformation and condensation processes) can also lead to these patterns. Our results are in agreement with the field observations over the United States and the modeled vertical distributions of isoprene-derived SOA, that is, high loadings of SOA from isoprene oxidation occurred above the surface layer (Goldstein et al., 2009; Zhang et al., 2007). In particular, each kind of BSOA tracer displayed different temporal and vertical distributions (Figure S6 and Figure 4). These features are potentially influenced by many causes. The predominant reason is likely related to local emission and regional transport (Du et al., 2017). Secondly, the mixing of heights (Wang et al., 2018b) and meteorological conditions of the atmosphere (Ding et al., 2011) is potentially another important factor. Moreover, oxidation processes (Claeys et al., 2004; Szmigielski et al., 2007) and emissions (Faiola et al., 2014; Wang et al., 2008) of BVOCs can also cause this complex vertical profiles of SOA.



### 3.1.3 Vertical variations in the photo-oxidation of BSOA tracers

Isoprene SOA tracers are the photo-oxidation products of isoprene with atmospheric oxidants (e.g. OH, O<sub>3</sub>, and NO<sub>x</sub>). The isoprene oxidation mechanisms are dependent on atmospheric conditions (Bates and Jacob, 2019; Wennberg et al., 2018). These processes are influenced by many factors, such as atmospheric conditions (humidity, temperature, and solar radiation) and the acidity of aerosols (Claeys et al., 2004; Kleindienst et al., 2009; Nguyen et al., 2015; Surratt et al., 2010). Specifically, 2-MGA is mainly formed under a high NO<sub>x</sub> level, while 2-MTs (the sum of 2-MT<sub>eryth</sub> and 2-MT<sub>threi</sub>) are formed under a low NO<sub>x</sub> level. The ratio of 2-MTs to 2-MGA can reflect the impacts of NO<sub>x</sub> loading on the isoprene oxidation processes (Surratt et al., 2010). In this study, the average ratio of 2-MTs to 2-MGA was  $5.20 \pm 2.24$  at 8 m, higher than that at 120 m ( $3.80 \pm 1.95$ ) and 260 m ( $3.15 \pm 1.83$ ) (Figure 5a). The aloft lower ratio suggested aerosols transported from other polluted regions with higher NO<sub>x</sub> levels contributed to the isoprene oxidation products in the upper layer aerosols of Beijing. The impacts of other factors (e.g. relative humidity, temperature, and oxidizing capacity) on the heterogeneous oxidations of isoprene cannot be ignored (Wang et al., 2018a).

The average ratios of 2-MTs to C<sub>5</sub>-alkene triols were  $0.97 \pm 1.17$ ,  $1.33 \pm 1.24$ , and  $3.97 \pm 3.08$  at 8 m, 120 m, and 260 m, respectively (Figure 5b). Both C<sub>5</sub>-alkene triols and 2-MTs can be formed from epoxydiol (IEPOX) derivatives of isoprene (Wang et al., 2005). Some studies also suggested that the loading of 2-MTs increased with the enhancement of aerosol acidity (Surratt et al., 2007), and the relative humidity can affect the ratio of 2-MTs to C<sub>5</sub>-alkene triols (Surratt et al., 2010). Recent studies suggested the ratio of 2-MTs / C<sub>5</sub>-alkene triols decreased with aerosol acidity (Yee et al., 2020), and C<sub>5</sub>-alkene triols were likely formed from thermal degradation of 2-methyltetrol sulfates for GC/MS artifacts (Cui et al., 2018). Hence, it is difficult to understand the different ratios of 2-MTs to C<sub>5</sub>-alkene triols at three heights, and more field investigations on the vertical profiles of SOA are needed.

Eight monoterpene SOA tracers have been identified here, with pinonic acid (PNA), pinic acid (PA), and MBTCA being the dominant compounds (Table S1). The different temporal and vertical patterns of these tracers are displayed in Figure S6 and Figure 4. MBTCA can be produced by further oxidations of PNA and PA by OH radical (Ding et al., 2016; Szmigielski et al., 2007). Thus, the ratio of MBTCA to (PNA+PA) can represent the aging extent of monoterpene-derived SOA. The ratio of MBTCA to (PNA+PA) at 8 m ( $0.24 \pm 0.10$ ) was lower than those at 120 m ( $0.84 \pm 0.44$ ) and 280 m ( $1.49 \pm 0.77$ ) (Figure 5d and S7), indicating that SOA from monoterpenes was much fresher at the surface than the upper layers. These results suggested that the lower height (8 m) was more relevant to local fresh aerosols whereas the higher layer (260 m) was more subject to regional aged aerosols, and the middle layer (120) was likely the mixed influence of local and regional aerosols. This conclusion can also be supported by the more significant correlation between PNA and MBTCA at 8 m than those at 120 m and 260 m (Figure S8).

β-Caryophyllinic acid is produced by the oxidation of β-caryophyllene emitted from trees and plants (Jaoui et al., 2007). The average concentration of β-caryophyllinic acid decreased and then increased slightly with height (Figure 4). This could be associated with relatively high ambient temperature (Duhl et al., 2008) or β-caryophyllene released from the soil or litter



around the ground surface (Zhu et al., 2016). It is noteworthy that the correlations ( $r$ ) of  $\beta$ -caryophyllinic acid with other SOA tracers (poly acids, aromatic acids, 2-MGA,  $C_5$ -alkene triols, and 3-hydroxyglutaric acid) were stronger at 120 m and 260 m than those at 8 m (Figure S7), implying that these tracers had the same origins and were potentially associated with regional transport of aerosols at upper layers.

#### 5 3.1.4 Vertical profiles of BSOA tracers during pollution events

The winds during the pollution episodes were mostly from the south of Beijing (Figure S2), which contributed to the formation of air pollution in the city. It was also found that the variations of RH were different for E1 and E3. The southwest winds, which potentially carried high RH and pollutant air masses to the urban of Beijing (Wang et al., 2018b), likely leading to the vertical variation of RH during E1. These results suggest that E1 is likely related to regional transport.

10 However, minor vertical variation of RH during E3 suggests complex pollution. The concentrations of EC and the ratio of EC / OC (Figure S4) showed extremely low values and vertical varies during E2 when compared with other pollution events, suggesting that the E2 is largely influenced by regional transport. In addition, the increasing levels of pollution parameters (such as  $O_3$ ,  $SO_2$ , and  $NO_2$ ) also contributed to the pollution episodes.

Total concentrations of BSOA tracers increased with height during the August 17<sup>th</sup> and 19<sup>th</sup> episodes (E1) and the August 29<sup>th</sup> episode (E2), and complex vertical distributions were recorded in other pollution days. The lower concentration of BSOA tracers ( $13.2 \text{ ng m}^{-3}$ ) at 120 m on August 18<sup>th</sup> (E1) than average values ( $27.1 \text{ ng m}^{-3}$ ) during the whole sampling period was likely related to the removal by a short-lived rain event. High abundance and increasing fractions of isoprene SOA tracers with height were recorded on August 17<sup>th</sup> and 19<sup>th</sup> of E1 and E2 (Figure 6), likely associated with the regional transport from southern areas of Beijing (Figure S2 and Figure S3). The aloft lower abundance of isoprene oxidation products than at the surface layer on August 16<sup>th</sup> (E1) was likely influenced by the air masses from the northwest. The same difference on September 7<sup>th</sup> to 8<sup>th</sup> (E3) was likely influenced by the air masses from the northeast. Monoterpene SOA tracers during the pollution events showed vertical patterns similar to the average values, that is, the higher concentrations and fractions were recorded at the ground surface layer than at the upper layers due to local emissions. However, their concentrations increased with height on August 19<sup>th</sup> (E1) (Figure 3b), likely influenced by regional transport. Sesquiterpene SOA tracer showed unusually vertical distribution patterns during the episodes, that is, higher concentrations were recorded at the upper layers than at the ground surface layer (Figure 3c), which was also associated with the regional transport.

The vertical patterns of BSOA tracers during the pollution events highlighted the significant roles of air masses origins, regional transport, local emissions, and oxidation processes on urban aerosols of Beijing. More field measurements are needed to address the interactions between SOA formation and the urban boundary layer. In addition, it is important to investigate the vertical profiles of ASOA and its interactions with BSOA. ASOA is a larger contributor to the loading of SOA and the formation of air pollution in urban areas (An et al., 2019; Fan et al., 2020).

### 3.2 Vertical profiles of DHOPA

DHOPA is an anthropogenic secondary organic compound, which is often used as a tracer for toluene (aromatic hydrocarbon) derived SOA and can only be detected in the particulate phase (Al-Naiema and Stone, 2017; Kleindienst et al., 2007). DHOPA concentrations were  $0.90 \pm 0.53 \text{ ng m}^{-3}$ ,  $1.50 \pm 1.09 \text{ ng m}^{-3}$ , and  $2.03 \pm 1.69 \text{ ng m}^{-3}$  at 8 m, 120 m, and 260 m, respectively. The average concentrations at 8 m and 260 m differed significantly. This vertical pattern was more obvious during pollution episodes, except for August 16<sup>th</sup> and September 7<sup>th</sup> when air masses were from the northwest and northeast (Figure S2). Thus, the increasing abundance of DHOPA at the upper layers during the pollution episodes was most likely related to the pollutants from the southern region of Beijing.

In addition, DHOPA correlated well ( $r > 0.7$ ) with aromatic acids and polyacids at all of the three heights, suggesting that they had similar origins such as anthropogenic aromatic VOCs (Al-Naiema and Stone, 2017; Ding et al., 2017). DHOPA also showed moderate correlations ( $r > 0.5$ ) with 2-MGA, C<sub>5</sub>-alkene triols, 3-HGA, and  $\beta$ -caryophyllene acid (Figure S7).

Previous studies have reported that urban pollution can enhance the formation of natural aerosols (Shrivastava et al., 2019); the existence of aromatic compounds can lead to high loading of  $\alpha$ -pinene-derived SOA (Shilling et al., 2012; Zelenyuk et al., 2017). These moderate correlations also suggest that the anthropogenic sources are related to biogenic sources, and their interaction mechanisms still need more investigation.

### 3.3 SOC estimation by the tracer-based method

The tracer-based method is used to estimate the contributions of different sources to SOC along vertical gradients. The fraction factors for SOC from isoprene, monoterpenes, and sesquiterpene (Iso\_SOC, Mon\_SOC, and Sesq\_SOC) are set as  $0.155 \pm 0.039$ ,  $0.231 \pm 0.111$  and  $0.0230 \pm 0.0046$ , respectively, and those for toluene SOC (DHOPA as a tracer) and naphthalene SOC (phthalic acid as a surrogate) are  $0.0079 \pm 0.0026$  and  $0.0199$ , respectively (Kleindienst et al., 2012; Kleindienst et al., 2007). It should be noted that estimations of fraction factors in chamber processes deviate from the real atmospheric environment (Ding et al., 2014). Quantitative uncertainties, system errors, volatility of BSOA tracers, and other factors could also increase the challenge in getting a more accurate estimation of SOC.

Temporal variations in the estimated SOC and their percentages in OC at the three heights are shown in Figure 7 and Table S3. The total concentrations of these estimated SOC were  $341 \pm 150 \text{ ngC m}^{-3}$  (average percentages in OC:  $8.05 \pm 3.17\%$ ),  $444 \pm 283 \text{ ngC m}^{-3}$  ( $8.60 \pm 3.66\%$ ) and  $673 \pm 385 \text{ ngC m}^{-3}$  ( $13.4 \pm 4.81\%$ ) at 8 m, 120 m and 260 m, respectively. Toluene SOC was the dominant contributor to SOC (32%, 41% and 35 % at 8 m, 120 m and 260 m, respectively), followed by naphthalene SOC and BSOC. The sum of ASOC (toluene and naphthalene SOC) contributed more than 50% of these SOC at three heights, and their concentrations and fractions increased with height (Figure 7c), suggesting a significant impact of anthropogenic sources from regional transport on urban aerosols of Beijing. The average concentrations of BSOC ranged from 157 to 272  $\text{ngC m}^{-3}$  and accounted for  $3.80 \pm 1.46\%$  (8 m),  $3.09 \pm 0.97\%$  (120 m) and  $5.63 \pm 2.32\%$  (260 m) in OC (Table S3).

BSOC showed different fractions at the three layers. Iso\_SOC fractions at the upper layers were higher than that at the ground surface, while Mon\_SOC and Sesq\_SOC fractions at the ground surface were the highest (Figure S8). These features illustrate the large contribution of regional transport to isoprene-derived SOC above the surface layer, while monoterpenes and sesquiterpene were likely influenced by local emissions. Consequently, the fractions of toluene SOC and Iso\_SOC increased with height, Mon\_SOC and Sesq\_SOC fractions decreased with height and naphthalene SOC fractions were similar at the three heights, suggesting that the regional transport are rich in toluene SOC and Iso\_SOC. In addition to the influence of local emission and regional transport, meteorological conditions, atmosphere turbulence, and UBL structure also cannot be ignored.

### 3.4 Impacts of emission controls on estimated SOC loadings

The average concentrations of estimated SOC before, during, and after the Parade (marked as Before-P, During-Parade, and After-P, respectively) are shown in Figure 8. The estimated SOC concentrations during the Parade ( $320 \pm 111 \text{ ngC m}^{-3}$ ,  $370 \pm 163 \text{ ngC m}^{-3}$  and  $594 \pm 264 \text{ ngC m}^{-3}$  at 8 m, 120 m and 260 m, respectively) decreased by  $\sim 12\%$  ( $364 \pm 199 \text{ ngC m}^{-3}$ ) and  $10\%$  ( $356 \pm 177 \text{ ngC m}^{-3}$ ) at 8 m,  $35\%$  ( $571 \pm 419 \text{ ngC m}^{-3}$ ) and  $16\%$  ( $441 \pm 279 \text{ ngC m}^{-3}$ ) at 120 m; decreased  $31\%$  ( $864 \pm 585 \text{ ngC m}^{-3}$ ) and increased  $4\%$  ( $570 \pm 229 \text{ ngC m}^{-3}$ ) at 260 m when compared to the Before-P and After-P, respectively. The SOC at the upper layers decreased more than at the ground surface layer, suggesting the efficient mitigation of SOC on a regional scale. The previous studies during the same period (Wu et al., 2019; Zhao et al., 2017) showed a high frequency of southerly winds before the Parade and north winds during the Parade at the high layers. It suggests that the north winds were also an important reason for the reduction of SOC during the Parade.

We found that the fractions of ASOC decreased and Iso\_SOC increased as a response to the emission controls. The ASOC fractions at 8 m were  $59 \pm 8\%$  (Before-P),  $47 \pm 5\%$  (During-Parade), and  $57 \pm 8\%$  (After-P), and Iso\_SOC were  $18 \pm 5\%$ ,  $18 \pm 2\%$ , and  $12 \pm 2\%$ , respectively. The ASOC fractions at 120 m were  $64 \pm 5\%$  (Before-P),  $61 \pm 10\%$  (During-Parade) and  $65 \pm 8\%$  (After-P), and Iso\_SOC were  $17 \pm 5\%$ ,  $23 \pm 6\%$ , and  $16 \pm 6\%$ , respectively. The ASOC fractions at 260 m were  $63 \pm 10\%$  (Before-P),  $53 \pm 9\%$  (During-Parade) and  $64 \pm 9\%$  (After-P), and Iso\_SOC were  $24 \pm 8\%$ ,  $34 \pm 9\%$ , and  $21 \pm 9\%$ , respectively. The decreased contributions of ASOC during the control period indicated the emission controls were effective in mitigating anthropogenic sources, with the control on toluene SOC being particularly effective. However, emission mitigation was not so efficient to control BSOC, especially for Iso\_SOC, implying that SOA from isoprene oxidation was potentially a more stable contributor than other VOCs in Beijing during the late summer.

Consequently, these results indicate that regional emission controls changed the aerosol SOC composition. Moreover, meteorological conditions and other factors (e.g., atmospheric oxidation state) could also impact the variations in SOC during different sampling periods, such as the wind shift before and after the Parade and the complex vertical distributions of particulate nitrate (Wang et al., 2018a; Wu et al., 2019; Zhao et al., 2017).

## 4 Conclusions

The vertical properties of SOA tracers in aerosols were investigated over the late summer in Beijing. The sum of BSOA tracers were  $31.5 \pm 16.8 \text{ ng m}^{-3}$  (8 m),  $36.4 \pm 26.1 \text{ ng m}^{-3}$  (120 m), and  $50.2 \pm 27.0 \text{ ng m}^{-3}$  (260 m). BSOA tracers from isoprene were the dominant compound, followed by monoterpenes and sesquiterpene. The fractions of isoprene SOA tracers showed an aloft increasing vertical pattern, whereas monoterpene and sesquiterpene SOA tracers showed opposite variations. These vertical characteristics of BSOA tracers were influenced by multiple factors, such as their photo-oxidation processes, local sources, and regional transport of their precursors. The isoprene oxidation products were largely influenced by air masses from regional transport, while monoterpene oxidation products were mainly influenced by local emission sources. The specific vertical distributions of BSOA tracers during pollution episodes suggest a significant contribution of regional transport of aerosols from the southern regions of Beijing. The average concentrations of the toluene tracer (DHOPA) were  $0.90 \pm 0.53 \text{ ng m}^{-3}$  (8 m),  $1.50 \pm 1.09 \text{ ng m}^{-3}$  (120 m) and  $2.03 \pm 1.69 \text{ ng m}^{-3}$  (260 m). DHOPA showed an aloft increasing pattern with larger variations during the episodes, also suggesting the regional transport from the southern regions. Estimated by the tracer-based method, the sum concentrations of estimated SOC were  $341 \pm 150 \text{ ngC m}^{-3}$  (8 m),  $444 \pm 283 \text{ ngC m}^{-3}$  (120 m) and  $673 \pm 385 \text{ ngC m}^{-3}$  (260 m), with toluene SOC being the dominant compound, followed by naphthalene SOC, Iso\_SOC and other SOC. The aloft increasing SOC suggests a contribution of the regional transport. The increase in toluene SOC and Iso\_SOC fraction with the height indicates that the air masses subject to the regional transport were potentially rich in toluene- and isoprene-derived SOC. The implementation of joint regional prevention and control by the government can significantly reduce the amount of SOC. However, they are likely more efficient on reducing toluene SOC, but not isoprene-derived SOC. Our study demonstrates the variability of SOA within the urban boundary layer and highlights that vertical profiles of SOA are critical to improving the simulation of SOA in chemical transport models.

**Data availability.** The atmospheric particulate matter data used for analysis are available in the Supplementary Material, and the data are also available upon request from the corresponding author Pingqing Fu (fupingqing@tju.edu.cn). The data can also be found online (at <https://10.11922/sciencedb.00069>). The DOI will be valid automatically as soon as ScienceDB publishes.

**Author contributions.** HR, LW SY, JZ, LL, and WZ conducted the laboratory analysis. WH, LW, SY, LR, MK, QX, SS, XP, ZW, YS, and KK reviewed and commented on the paper. PF designed the research. HR and PF wrote the paper.

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

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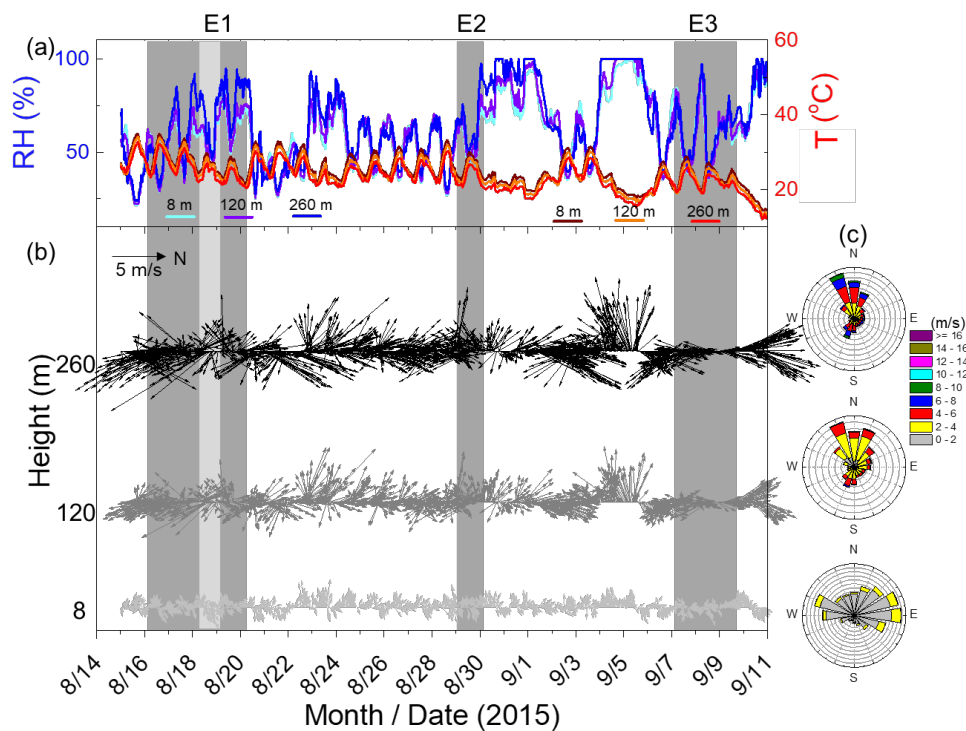


Figure 1. Temporal series of vertical meteorological parameters including (a) relative humidity (RH) and temperature (T), (b) wind direction (WD) and wind speed (WS), and (c) wind roses. Three pollution events (including E1 to E3) are indicated by grey shading (E1: August 16<sup>th</sup> to 19<sup>th</sup>, E2: August 29<sup>th</sup>, and E3: September 7<sup>th</sup> to 8<sup>th</sup>, respectively). The light grey shading during E1 is a short rain event that reduced the loading of OA in aerosols. N represents the northern wind.

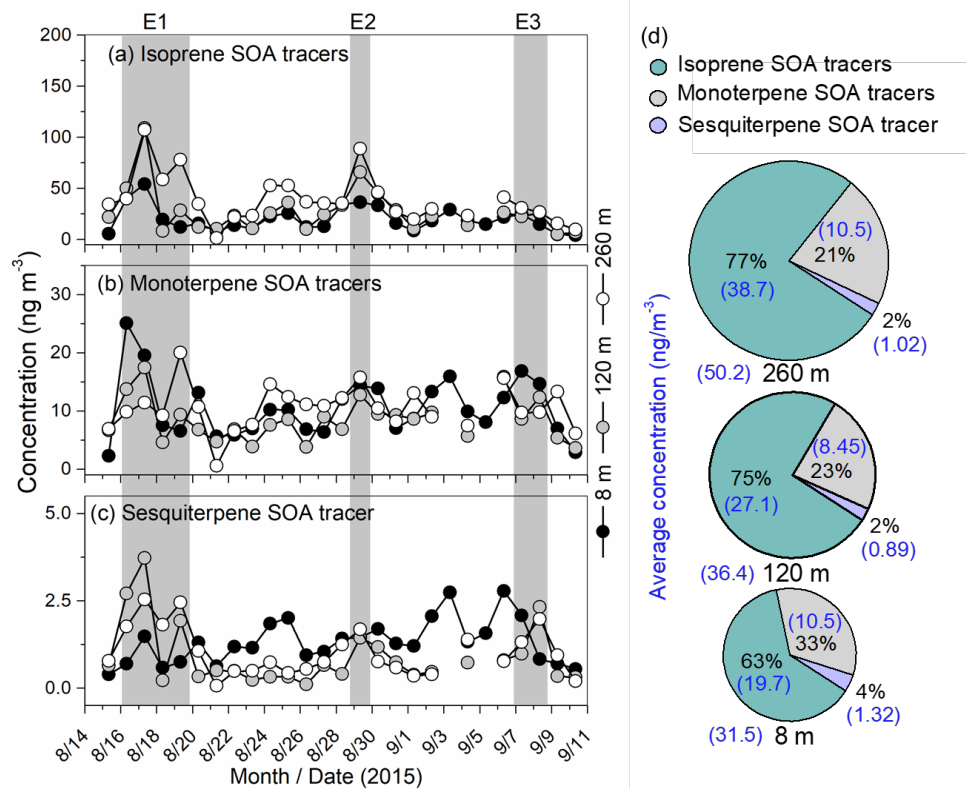


Figure 2. Vertical and temporal variations in BSOA tracers from (a) isoprene, (b) monoterpenes, and (c) sesquiterpene. Measurement heights were at 8 m (solid circles), 120 m (grey circles), and 260 m (open circles). Relative mass fractions are shown in (d).

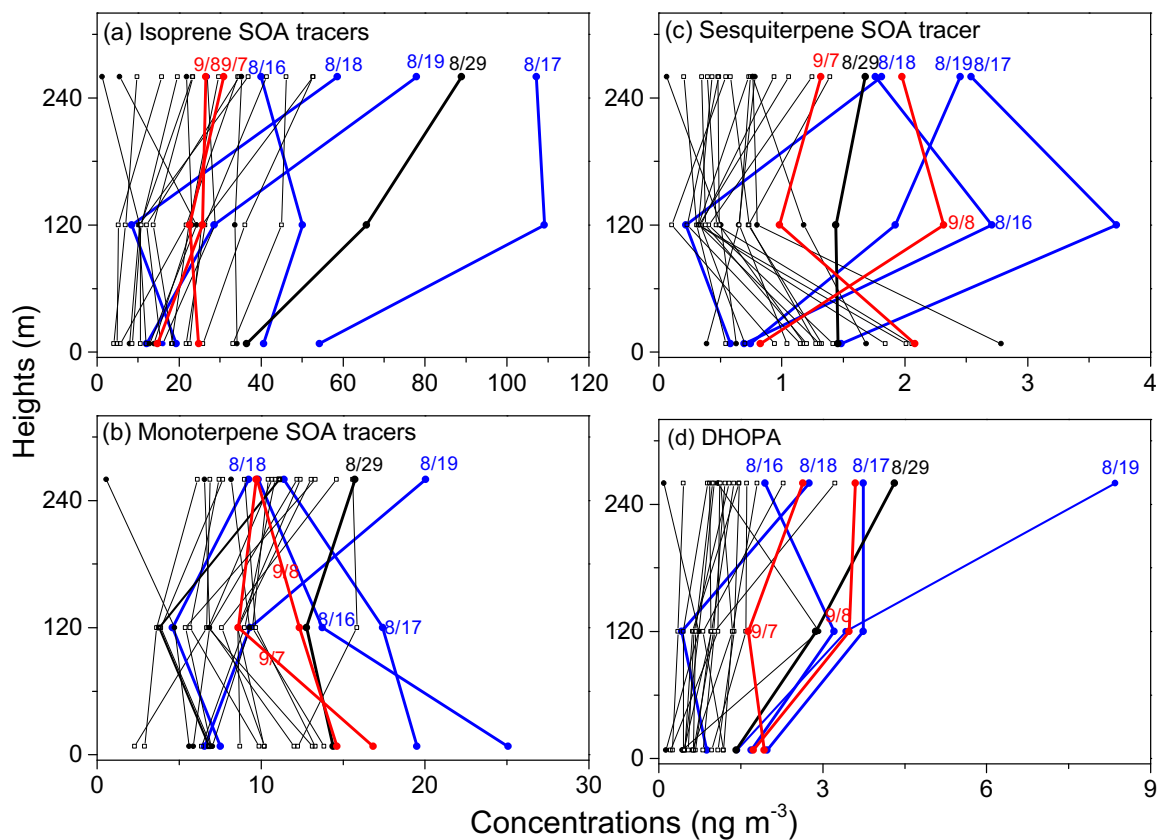


Figure 3. Vertical profiles in the concentrations of SOA tracers from (a) isoprene, (b) monoterpenes (c) sesquiterpene, and (d) DHOP in daily samples collected at three heights. The samples collected during E1, E2, and E3 periods are marked with blue, black, and red bold lines, respectively. The sampling date during the pollution days was also marked.

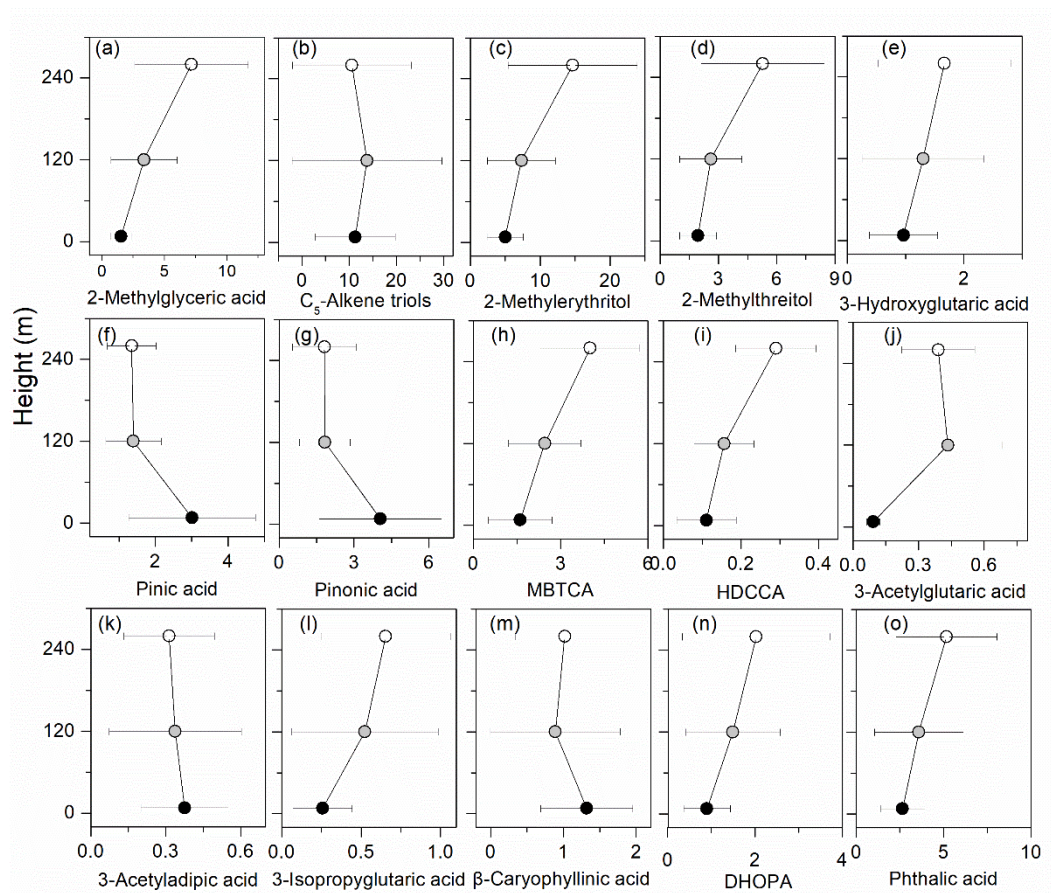
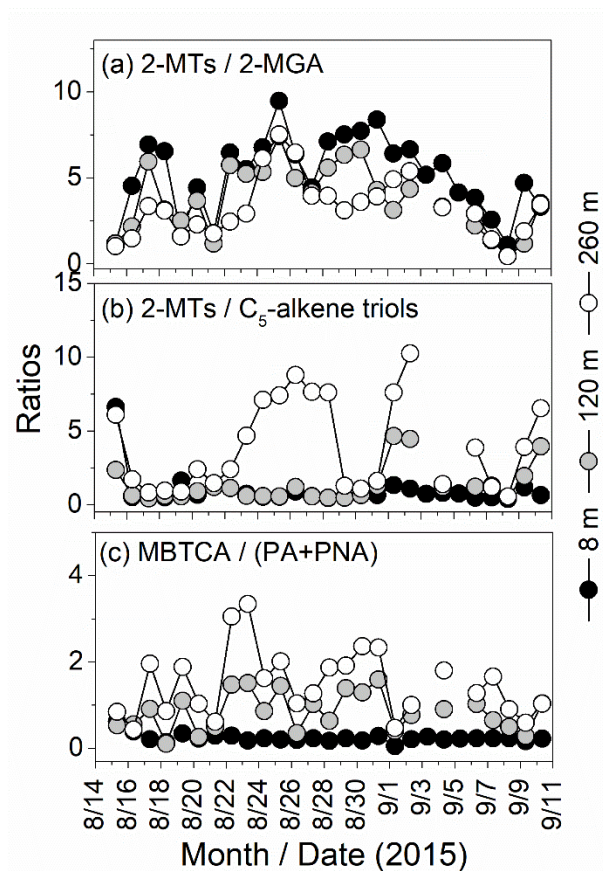
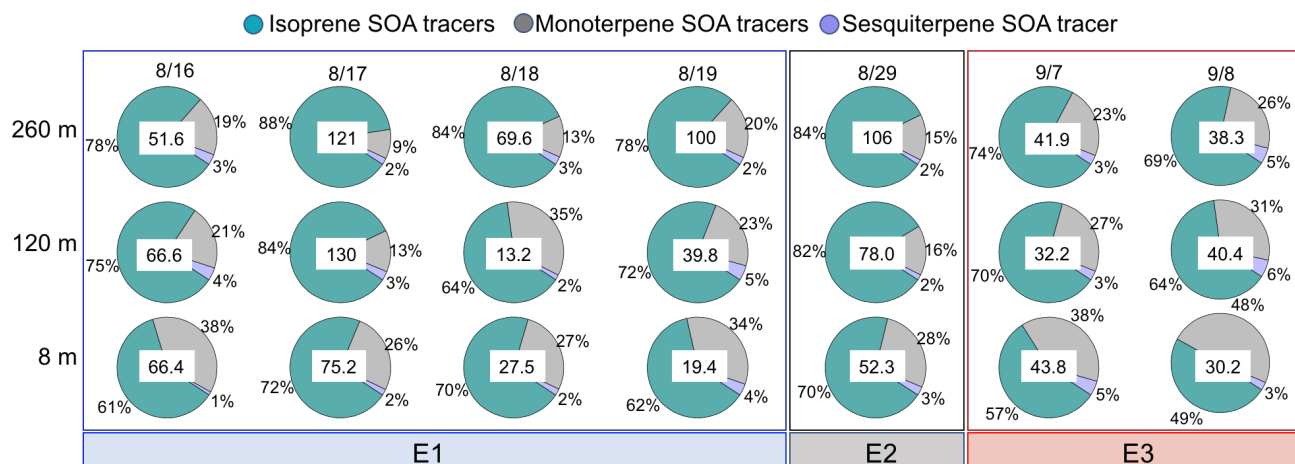


Figure 4. Vertical distributions of the average concentrations of SOA tracers from (a–d) isoprene, (e–i) monoterpenes, (m)  $\beta$ -caryophyllinic acid, (n) dihydroxy-4-oxopentanoic acid (DHOPA), and (o) phthalic acid in  $PM_{2.5}$ . Figures (a–m) and (n–o) are tracers of BSOA and ASOA, respectively (HDCCA is the abbreviation of 3-(2-hydroxyethyl)-2,2-dimethyl-cyclobutane carboxylic acid).



**Figure 5. Temporal variations in the mass concentration ratios among different biogenic SOA tracers in  $PM_{2.5}$ : (a) 2-MTs / 2-MGA; (b) 2-MTs /  $C_5$ -alkene triols and (c) MBTCA / (PA+PNA).**





**Figure 6.** Relative mass contributions of three kinds of BSOA tracers during the pollution days at three heights. The sum concentrations of BSOA tracers ( $\text{ng m}^{-3}$ ) are shown in the center of each pie.

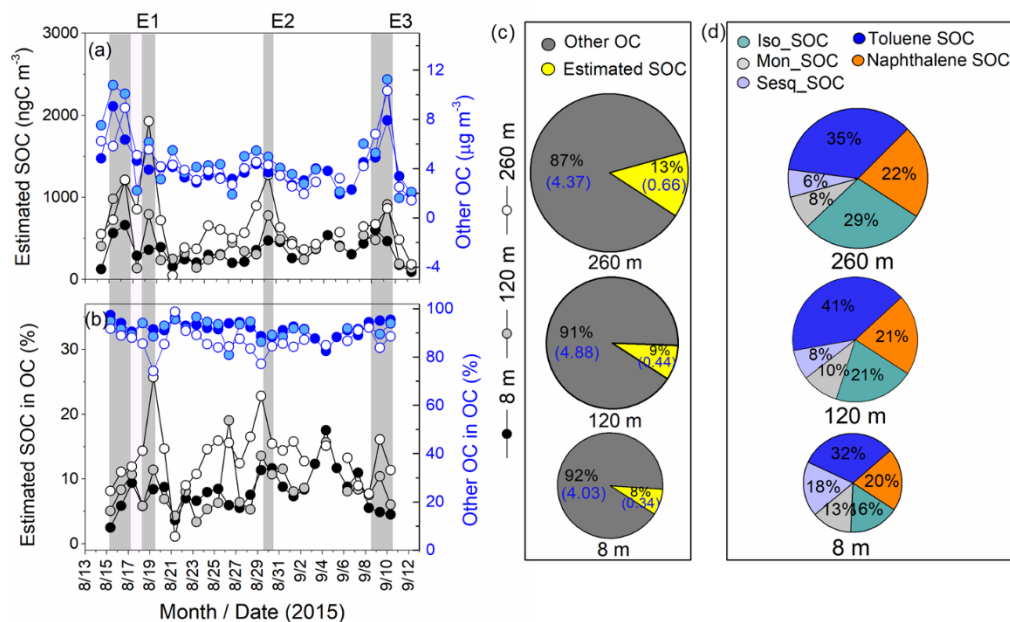


Figure 7. Temporal variations in the estimated SOC and other OC at three heights: (a) the concentrations of estimated SOC (right axis) and other OC (left axis), (b) the fraction of estimated SOC and other OC in OC. Relative mass fractions of OC and estimated SOC is shown in (c) and (d). Other OC is not captured by the source apportionment. Iso\_SOC, Mon\_SOC, and Sesq\_SOC represent BSOC estimated from isoprene, monoterpenes, and sesquiterpene, respectively. Toluene SOC and naphthalene SOC represent anthropogenic SOC (ASOC) that were estimated by DHOPA and phthalic acid, respectively.

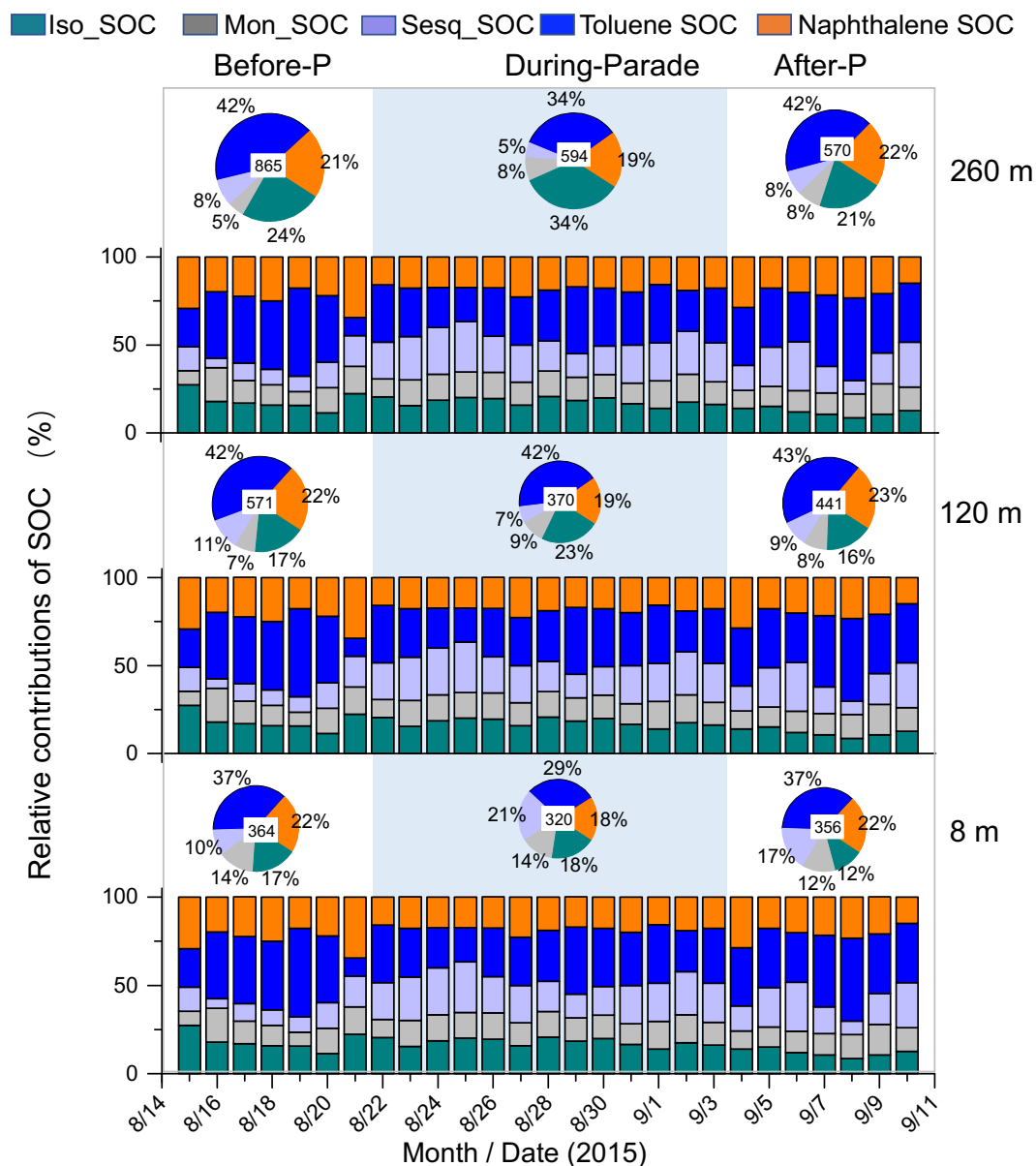


Figure 8. Temporal variation in mass fractions of estimated SOC in PM<sub>2.5</sub> and its relative contributions during three periods (Before-P means before Parade; During-P means during Parade, and After-P means after Parade) at three heights. The values in the center of the pies represent the average concentrations of estimated SOC and the sizes of the pie are related to the concentrations.