



# Comparison of primary aerosol emission and secondary aerosol formation from gasoline direct injection and port fuel injection vehicles

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**Abstract.** Gasoline vehicles significantly contribute to urban particulate matter (PM) pollution. Gasoline direct injection (GDI) engines, known for their higher fuel efficiency than that of port fuel injection (PFI) engines, have been increasingly employed in new gasoline vehicles. However, the impact of this trend on air quality is still poorly understood. Here, we investigated both primary emissions and secondary organic aerosol (SOA) formation from a GDI and a PFI vehicle under an urban-like driving condition, using combined approaches involving chassis dynamometer measurements and an environmental chamber simulation. The PFI vehicle emits slightly more volatile organic compounds, e.g., benzene and toluene, whereas the GDI vehicle emits more particulate components, e.g., total PM, elemental carbon, primary organic aerosols and polycyclic aromatic hydrocarbons. Strikingly, we found a much higher SOA production (by a factor of approximately 2.7) from the exhaust of the GDI vehicle than that of the PFI vehicle under the same conditions. More importantly, the higher SOA production found in the GDI vehicle exhaust occurs concurrently with lower concentrations of traditional SOA precursors, e.g., benzene and toluene, indicating a greater contribution of intermediate volatility organic compounds and semi-volatile organic compounds in the GDI vehicle exhaust to the SOA formation. Our results highlight the considerable potential contribution of GDI vehicles to urban air pollution in the future.

## 1 Introduction

Organic aerosol (OA) accounts for approximately 20–50 % of ambient fine particulate matter (PM<sub>2.5</sub>), with significant environment, climate and health effects (Maria et al., 2004; Kanakidou et al., 2005). Primary organic aerosol (POA) is emitted directly by sources, while secondary organic aerosol (SOA) is mainly formed via oxidation of gaseous precursors in the atmosphere and accounts for about 30–90 % of OA mass worldwide (Zhang et al., 2007; Hu et al., 2016). However SOA sources remain poorly constrained. Robinson et al. (2007) proposed that low-volatility gas-phase species emitted from diesel vehicles were important sources for urban ambient SOA, which achieved better mass closure between observed and modeled SOA. Using an updated Community Multiscale Air Quality (CMAQ) model, Jathar et al. (2017) found that 30–40 % OA was contributed from vehicles in southern California, half of this being SOA. In addition, it was recently revealed that 15–65 % of SOA was contributed by fossil fuel consumption (i.e., traffic and coal burning) in megacities in China (Huang et al., 2014). Zhao et al. (2016a) also reported that POA and intermediate volatility organic compounds (IVOCs) from vehicles constituted a large percentage of SOA concentration in China by chamber experiments as well as the two-dimensional volatility basis set (2D-VBS) box model simulations. These findings indi-

cated that vehicles contribute significantly to ambient SOA in urban areas. An ambient organic aerosol measurement in the Los Angeles Basin demonstrated that SOA contributed from gasoline vehicles was significant in the urban air, much larger than that from diesel vehicles (Bahreini et al., 2012). A similar conclusion was reached by Hayes et al. (2013) based on mass spectrometer results. Meanwhile, several chamber simulation studies concluded that the exhaust of gasoline vehicles could form substantial SOA (Jathar et al., 2014). Thus, gasoline vehicle exhaust is highly associated with ambient SOA formation.

Gasoline vehicles can be categorized into two types based on the fuel injection technologies in their engines, i.e., port fuel injection (PFI) vehicles and gasoline direct injection (GDI) vehicles. Unlike a PFI engine, in which gasoline is injected into the intake port, gasoline is sprayed into the cylinder directly in a GDI engine. With the increased atomization and vaporization rate of fuel, and more accurate control of fuel volume and injection time, a GDI engine has many advantages, such as better fuel efficiency, lower CO<sub>2</sub> emissions and less fuel pumping loss (Alkidas, 2007; Myung et al., 2012; Liang et al., 2013). In past decades, PFI vehicles have dominated the market share of gasoline cars in the world. However, in recent years, GDI vehicles have been increasingly employed, due to higher fuel efficiency. The market share of GDI vehicles in sales in 2016 reached about 25, 50 and 60 % in China, the United States and Europe, respectively (Wen et al., 2016; Zimmerman et al., 2016).

Several previous studies investigated the emissions of GDI and PFI vehicles, in terms of concentrations of gaseous pollutants, particle numbers and mass concentrations, and evaluated the reduction of emissions with upgrading emission standards (Ueberall et al., 2015; Zhu et al., 2016; Saliba et al., 2017). These studies showed that GDI vehicles emitted more primary particles than PFI vehicles (Zhu et al., 2016; Saliba et al., 2017), and even diesel vehicles equipped with a diesel particulate filter (Wang et al., 2016). These higher primary particle emissions are likely due to insufficient time allowed for gasoline fuel to be mixed with air thoroughly, as well as gasoline droplets impinging onto pistons and surfaces of the combustion chamber in the GDI engine (Chen et al., 2017; Fu et al., 2014). However, in most studies, vehicles were tested under the driving cycles of US or European standards; those results may not be representative of China's traffic conditions.

SOA production from gasoline vehicle exhaust was previously simulated in smog chambers and potential aerosol mass (PAM) flow reactors. SOA formed from gaseous pollutants exceeds the related POA emissions and contributes much more to air quality degradation. These studies mostly focused on the impacts of SOA formation by the model year (Gordon et al., 2014; Jathar et al., 2014; Liu et al., 2015), fuel formulations (Peng et al., 2017), driving cycles (including idling) (Nordin et al., 2013; Platt et al., 2013) and start-up modes of the gasoline vehicles (Nordin et al., 2013). Few

studies, however, have investigated SOA formation from vehicles with different engine technologies (GDI and PFI) under the same working conditions.

In this study, both primary emissions and secondary aerosol formation from GDI and PFI vehicles were investigated. To represent typical urban driving patterns in megacities such as Beijing, the tested vehicles used gasoline fuel meeting the China Phase V fuel standard, and were operated over the cold-start Beijing cycle (BJC). The SOA formation from both the PFI and GDI vehicle exhausts was then simulated using a smog chamber. Finally, the overall contributions of the GDI and PFI gasoline vehicles to ambient particulate matter (PM) were evaluated. This study is part of a project that investigates the relationship between vehicle (engine) emissions and ambient aerosols, including the potential of SOA formation from a PFI engine (Du et al., 2018) and the effects of gasoline aromatics on SOA formation (Peng et al., 2017).

## 2 Materials and methods

### 2.1 Vehicles

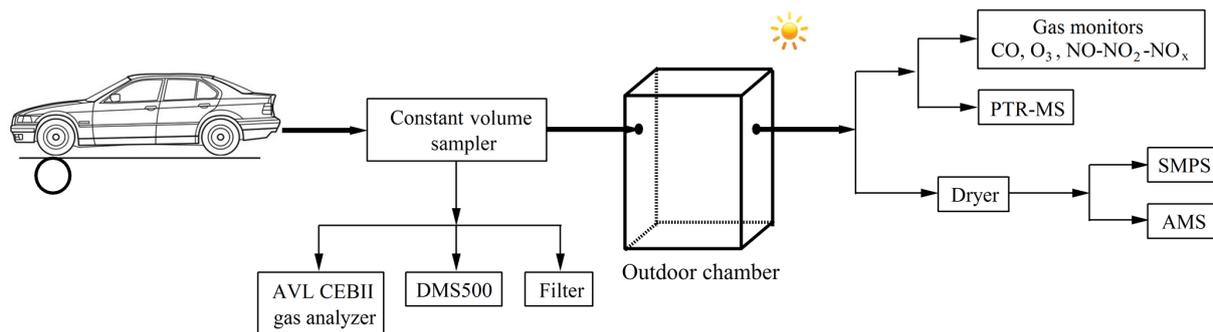
One PFI vehicle and one GDI vehicle were tested in this study to investigate their primary emissions and SOA formation. The vehicles were certified according to the China Phase IV emissions standard (equivalent to Euro IV) and the China Phase V emissions standard (equivalent to Euro V), respectively. More information on the vehicles is shown in Table 1. The fuel used in the experiments was a typical Phase V gasoline on the China market (a sulfur content of 6 mg kg<sup>-1</sup>). More information on the fuel is provided in Table S1 in the Supplement. The cold-start BJC, characterized by a higher proportion of idling periods and lower acceleration speeds than the New European Driving Cycle (NEDC), was performed to simulate the repeated braking and acceleration on roads in megacities such as Beijing. The BJC lasted for approximately 17 min, with a maximum speed of 50 km h<sup>-1</sup> (Peng et al., 2017).

### 2.2 Experimental setup

The chamber experiments were carried out in the summer at the State Key Laboratory of Automotive Safety and Energy of Tsinghua University in Beijing, including two experiments conducted with the GDI vehicle and four experiments conducted with the PFI vehicle. The tested vehicles were placed on a chassis dynamometer system (Burke E. Porter Machinery Company) with a controlled room temperature of 26.4 ± 2.5 °C and an absolute humidity of 11.5 ± 2.4 g m<sup>-3</sup>. The exhaust emitted by the vehicle tailpipe was diluted in a constant volume sampler (CVS) system, where the flow rate was maintained at 5.5 m<sup>3</sup> min<sup>-1</sup> using filtered ambient air, achieving a dilution of the exhaust of about 20-fold. Several instruments, including an AVL CEBII gas analyzer, a Cam-

**Table 1.** Descriptions of the gasoline direct injection (GDI) and port fuel injection (PFI) vehicles used in the experiments.

Vehicle	Make and model	Emission standard class	Model year	Mileage (km)	Displacement (cm <sup>3</sup> )	Power (kW)	Weight (kg)
GDI	VW Sagitar	China V	2015	3000	1395	110	1395
PFI	Honda Civic	China IV	2009	42 500	1799	103	1280

**Figure 1.** Schematic diagram of the outdoor chamber setup for the experiments.

bustion Differential Mobility Spectrometer (DMS500) and a particle sampler, were connected to the CVS (detailed in Fig. 1 and Sect. 2.3) to characterize the primary gas- and particulate-phase pollutants. The diluted exhaust produced by the CVS system was injected into an outdoor chamber, where secondary aerosol formation was simulated. This was the second dilution step of the exhaust with a dilution factor of approximately 15. A schematic illustration of the outdoor experimental setup is shown in Fig. 1.

The photochemical oxidation experiments were carried out in a quasi-atmospheric aerosol evolution study (QUALITY) outdoor chamber. More details of the setup and performance of the QUALITY chamber were introduced by Peng et al. (2017). Prior to each experiment, the chamber was covered with a double-layer anti-ultraviolet (anti-UV) shade to block sunlight and was cleaned with zero air for about 15 h to create a clean environment. Approximately 120 ppb O<sub>3</sub> were injected into the chamber prior to the injection of the vehicle exhaust to make the oxidation environment similar to the mean O<sub>3</sub> peak concentration in the ambient atmosphere. Before the chamber was exposed to sunlight, a period of about 15 min was left to ensure that the pollutants were mixed sufficiently in the chamber, then the initial concentrations were characterized in the dark. Subsequently, the anti-UV shade was removed from the chamber and photo-oxidation was initiated. A suite of high time resolution instruments was utilized to track the evolution of pollutants during the chamber experiments. Zero air was added into the chamber during the sampling period to maintain a constant pressure.

### 2.3 Instrumentation

Primary gases and aerosols were measured by the instruments connected to the CVS. The concentrations of gaseous pollutants, including CO, CO<sub>2</sub>, NO<sub>x</sub> and total hydrocarbon (THC), were monitored with a gas analyzer, the AVL Combustion Emissions Bench II (CEB II, AVL, Austria). Primary aerosols were measured with both online and offline instruments. A DMS500 (Cambustion, UK) was implemented to monitor the real-time number size distribution and total number concentration of primary particles. Its sampling line was heated to maintain the temperature at 150 °C. The aerosols were also collected on Teflon and quartz filters by an AVL Particulate Sampling System (SPC472, AVL, Austria) to analyze the mass, organic carbon (OC) and elemental carbon (EC) emission factors using a balance and an OC/EC analyzer (Sunset Lab, USA).

During the chamber experiments, a suite of real-time instruments was utilized to characterize the evolution of the gas- and particulate-phase pollutants. A CO analyzer, a NO-NO<sub>2</sub>-NO<sub>x</sub> analyzer and an O<sub>3</sub> analyzer (Thermo Fisher Scientific Inc., USA) were employed to measure the concentrations of CO, NO<sub>x</sub> (including NO and NO<sub>2</sub>) and O<sub>3</sub>, respectively. The evolution of volatile organic compounds (VOCs) was monitored with a proton transfer reaction mass spectrometer (PTR-MS, IONICON Analytik, Austria) (Lindinger et al., 1998). H<sub>3</sub>O<sup>+</sup> was used as the reagent ion, which reacted with the target compounds. The resulting ions were detected by a quadrupole mass spectrometer. Meanwhile, the particle size distribution was characterized using a scanning mobility particle sizer system (SMPS, TSI, USA),

**Table 2.** Overview of all instruments used to measure the gas- and particulate-phase pollutants in the experiments.

Parameter	Phase	Instrument	Note
CO, CO <sub>2</sub> , NO <sub>x</sub> and total hydrocarbon (THC) concentration	Gas	Gas analyzer AVL Combustion Emissions Bench II	Online
Aerosol number size distribution	Particle	DMS500	Online
PM <sub>2.5</sub>	Particle	Balance (AX105DR)	Offline
Organic carbon/elemental carbon concentration	Particle	OC / EC analyzer	Offline
CO concentration	Gas	48i CO analyzer	Online
NO, NO <sub>2</sub> , and NO <sub>x</sub> concentration	Gas	42i NO–NO <sub>2</sub> –NO <sub>x</sub> analyzer	Online
O <sub>3</sub> concentration	Gas	49i O <sub>3</sub> analyzer	Online
VOC concentration	Gas	Proton transfer reaction mass spectrometer (PTR-MS)	Online
Aerosol number (mass) size distribution	Particle	Scanning mobility particle sizer (SMPS, consisting of 3081-DMA and 3775-CPC)	Online
Size resolved non-refractory aerosol	Particle	High-resolution time-of-flight aerosol mass spectrometer (HR-Tof-AMS)	Online

which consisted of a differential mobility analyzer (DMA, TSI, USA) and a condensation particle counter (CPC, TSI, USA). This system can measure aerosols with diameters ranging from 15 to 700 nm. A high-resolution time-of-flight aerosol mass spectrometer (HR-Tof-AMS, Aerodyne Research, USA) was used to obtain mass concentrations and size distributions of submicron, non-refractory aerosols, including sulfate, nitrate, ammonium, chloride and organics (DeCarlo et al., 2006). Table 2 lists the instruments used to measure the primary emissions and their evolution in the chamber experiments.

### 3 Results

#### 3.1 Primary emissions

##### Gaseous pollutant emissions

Emission factors (EFs) of CO<sub>2</sub>, THC, benzene and toluene from the GDI and PFI vehicles are listed in Table 3. The EFs of CO<sub>2</sub> and THC are derived from measured concentrations in CVS, while the EFs of benzene and toluene were calculated from the initial concentrations in the chamber. The THC emission factor was reported in units of carbon mass, g C kg fuel<sup>-1</sup>.

The GDI vehicle emitted less CO<sub>2</sub> and THC than the PFI vehicle due to their different fuel injection strategies and mixing features (Liang et al., 2013; Gao et al., 2015). The EF of THC from the GDI vehicle met the standard of the China Phase V Emission Standard (0.1 g km<sup>-1</sup>), but that from the PFI vehicle was slightly above the standard limit. The PFI vehicle used in this study met a less stringent emission standard (the China Phase IV), which might cause additional

THC emissions compared to the China Phase V Emission Standard. In addition, in this study we employed the BJC, whereas the standard is based on the NEDC. More repeated braking and acceleration in the BJC (Fig. S2) might cause incomplete combustion and consequently higher THC emission from the PFI vehicle. As typical VOC species emitted by vehicles, benzene and toluene were measured in this study. For both vehicles, the EFs of toluene were higher than those of benzene. Consistent with the feature of THC emission, the PFI vehicle emitted more benzene and toluene than the GDI vehicle, and the enhancement of toluene was much larger than that of benzene.

The EFs of the gaseous pollutants in this study had similar magnitudes to those in previous studies in which gasoline vehicles met comparable levels of emission standards and were tested under a cold-start driving condition, while the results in this study were slightly higher, as shown in Table 3. This difference might be because the California ultra-low-emission vehicles (ULEVs) (Saliba et al., 2017) and most low-emission vehicles (LEVs) II (manufactured in 2004 or later) (May et al., 2014) meet the US certification gasoline emission standards for the ULEV category, which has a lower limit of gaseous pollutants than the China Phase V Emission Standard. In addition, the different driving cycles of our study from those other studies (listed in Table 3) might be another explanation for the difference in the EFs of gaseous pollutants.

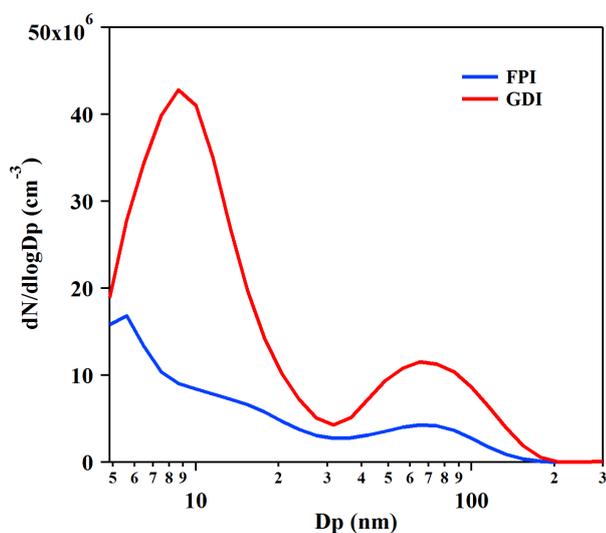
##### Primary particle emissions

The EFs of PM, EC, POA and particulate polycyclic aromatic hydrocarbons (PAHs) are shown in Table 4. The EF of PM<sub>2.5</sub> from the GDI vehicle was about 1.4 times higher than

**Table 3.** Emission factors (EFs) of gaseous pollutants from the gasoline direct injection (GDI) and port fuel injection (PFI) vehicles in this study and those of previous studies.

	This study				Saliba et al. (2017)		May et al. (2014)	Platt et al. (2013)		Zhu et al. (2016)	
	GDI China V		PFI China IV		GDI ULEV	PFI ULEV	PFI <sup>a</sup> LEV II	Euro V Cold NEDC		GDI China IV	PFI China IV
	g kg fuel <sup>-1</sup>	g km <sup>-1</sup>	g kg fuel <sup>-1</sup>	g km <sup>-1</sup>	Cold UC <sup>b</sup>		Cold UC			Cold WLTC <sup>c</sup>	
CO <sub>2</sub>	3439 ±23	213 ±4	3350 ±24	283 ±4	–	–	–	–	–	187	215
THC	1.55 ±0.22	0.09 ±0.01	1.70 ±0.19	0.13 ±0.01	0.02	0.06	0.64	0.91–1.06	0.036–0.042	0.05	0.03
Benzene	0.056 ±0.011	0.003 ±0.001	0.061 ±0.016	0.005 ±0.001	–	–	0.018	–	0.002	–	–
Toluene	0.101 ±0.004	0.006 ±0.001	0.220 ±0.047	0.017 ±0.004	–	–	0.026	–	0.002	–	–

<sup>a</sup>22 PFI vehicles and 3 GDI vehicles. <sup>b</sup>UC: Unified Cycle. <sup>c</sup>WLTC: Worldwide harmonized Light-duty Test Cycle.



**Figure 2.** Number size distributions of primary PM emitted from the GDI (red line) and PFI (blue line) gasoline vehicles. The results are the average of particle number emissions from vehicles during a whole BJC, measured by DMS500 in the CVS system. The particles were heated to 150 °C in the DMS500.

that of the PFI vehicle. Both vehicles met the China Phase V Emission Standard for PM emission (4.5 mg km<sup>-1</sup>). The GDI vehicle emitted about 3.3 times more EC and 1.2 times more POA than the PFI vehicle. The primary carbonaceous aerosols (EC + POA) accounted for 85 and 82 % of the PM in the GDI and PFI vehicles respectively, suggesting that carbonaceous aerosols were the major components in the PM from gasoline vehicles, especially for the GDI vehicle.

PAHs account for a small fraction of particulate organic matter in the atmosphere, but the molecular signature of PAHs can be utilized in source identification of vehicle emissions (Kamal et al., 2015). The GDI vehicle emitted about

1.5 times the PAHs of the PFI vehicle. The EFs of PAH compounds are listed in Table S2, and the details of PAHs measurement were described in Li et al. (2016). It should be noted that the PAHs were tested under warm-start cycles. A higher EF of PAHs would be obtained under a cold-start cycle, since the lower temperature would lead to an inefficient catalyst at the beginning of the cold-start cycle (Mathis et al., 2005). The main contributors to the total PAH mass emitted from gasoline vehicle exhaust in this study, especially from the GDI vehicle exhaust, were similar to the results reported by previous studies (Schauer et al., 2002; Hays et al., 2013).

Lower PM<sub>2.5</sub> and POA emissions from the GDI vehicle were found in previous studies, except that a little higher PM<sub>2.5</sub> emission from the GDI vehicle was illustrated in Saliba's study (Platt et al., 2013; May et al., 2014; Zhu et al., 2016; Saliba et al., 2017). The EC emissions were in the range of those of previous studies but on the lower level. The EF of the POA measured in this study was higher than those of other studies, leading to a higher OC / EC ratio, which could be attributed to the less strict emission standard of our vehicles and the different driving cycles applied in the experiments.

The bimodal number size distributions of the primary PM from the vehicles measured by the DMS500 are shown in Fig. 2. The particle distributions of the exhaust of the GDI and PFI vehicles illustrated similar patterns, with two peaks located at about 10 nm for nucleation mode and at 60–90 nm for accumulation mode, respectively, which are consistent with the results of previous studies (Maricq et al., 1999; Chen et al., 2017). The particle number size distribution of the exhaust of the GDI vehicle showed a similar pattern to that of the PFI vehicle, with a much higher number concentration that is consistent with the emission of more particle mass.

**Table 4.** EFs of primary aerosols, including carbonaceous aerosols and particulate polycyclic aromatic hydrocarbons (PAHs) from the GDI and PFI vehicles in this study and those of previous studies.

	This study				Saliba et al. (2017)		May et al., 2014	Platt et al. (2013)		Zhu et al. (2016)	
	GDI China V		PFI China IV		GDI ULEV	PFI ULEV	PFI LEV II	Euro V Cold NEDC		GDI China IV	PFI China IV
	Cold BJC		Cold UC		Cold UC		Cold UC		Cold WLTC		
	mg kg fuel <sup>-1</sup>	mg km <sup>-1</sup>	mg kg fuel <sup>-1</sup>	mg km <sup>-1</sup>	mg km <sup>-1</sup>	mg km <sup>-1</sup>	mg kg fuel <sup>-1</sup>	mg kg fuel <sup>-1</sup>	mg km <sup>-1</sup>	mg km <sup>-1</sup>	mg km <sup>-1</sup>
PM <sub>2.5</sub>	61.7 ± 24.5	3.4 ± 1.4	33.4 ± 25.6	2.5 ± 1.9	3.9	2.4	18.0	–	–	1.5	1.0
EC	10.7 ± 3.6	0.6 ± 0.2	2.4 ± 1.6	0.2 ± 0.1	3.0	0.6	12.2	11.2–20.0	1.2–1.7	–	–
POA	41.7 ± 9.8	2.3 ± 0.6	25.0 ± 0.3	1.9 ± 0.1	0.4	0.6	5.2	24.5–19.7	0.4–1.4	–	–
OC/EC		3.2		8.7	0.1	0.8	0.4		0.2–1.8	–	–
PAHs (× 10 <sup>6</sup> )	20.4 ± 2.1	1.1 ± 0.1	13.2 ± 4.1	1.0 ± 0.3	–	–	–	–	–	–	–

### 3.2 SOA formation from gasoline vehicle exhaust

The time-resolved concentrations of gases and particles during the chamber experiments are illustrated in Fig. 3. Before removing the anti-UV shade, the initial concentrations of NO<sub>x</sub>, benzene and toluene from the PFI and GDI vehicles were 80, 3 and 5 ppb and 100, 4 and 14 ppb respectively.

After the aging experiment started ( $t=0$  in Fig. 3), NO was formed from NO<sub>2</sub> photolysis, which then reacted with O<sub>3</sub> to form NO<sub>2</sub>. The O<sub>3</sub> concentration increased rapidly to a maximum within 2–3 h and then decreased via reactions and dilution. Benzene and toluene decayed at different rates during the aging process.

New particle formation was found inside the chamber 15 min after the exhaust was exposed to sunlight, providing substantial seeds for secondary aerosol formation. Significant growth of particles in both size and mass was observed in the chamber, indicating that a large amount of secondary aerosol was formed during the photochemical oxidation. The chemical composition of the secondary aerosols was measured continuously by a HR-ToF-AMS. Organics were the dominant composition of the secondary aerosol, accounting for 88–95 % of the total particle mass inside the chamber (Fig. S1), which is consistent with our previous research (Peng et al., 2017). The SOA mass exhibited a different growth rate for the two types of vehicles. After a 4 h oxidation in the chamber, the SOA formed from the exhaust of the GDI vehicle was approximately double that of the PFI vehicle.

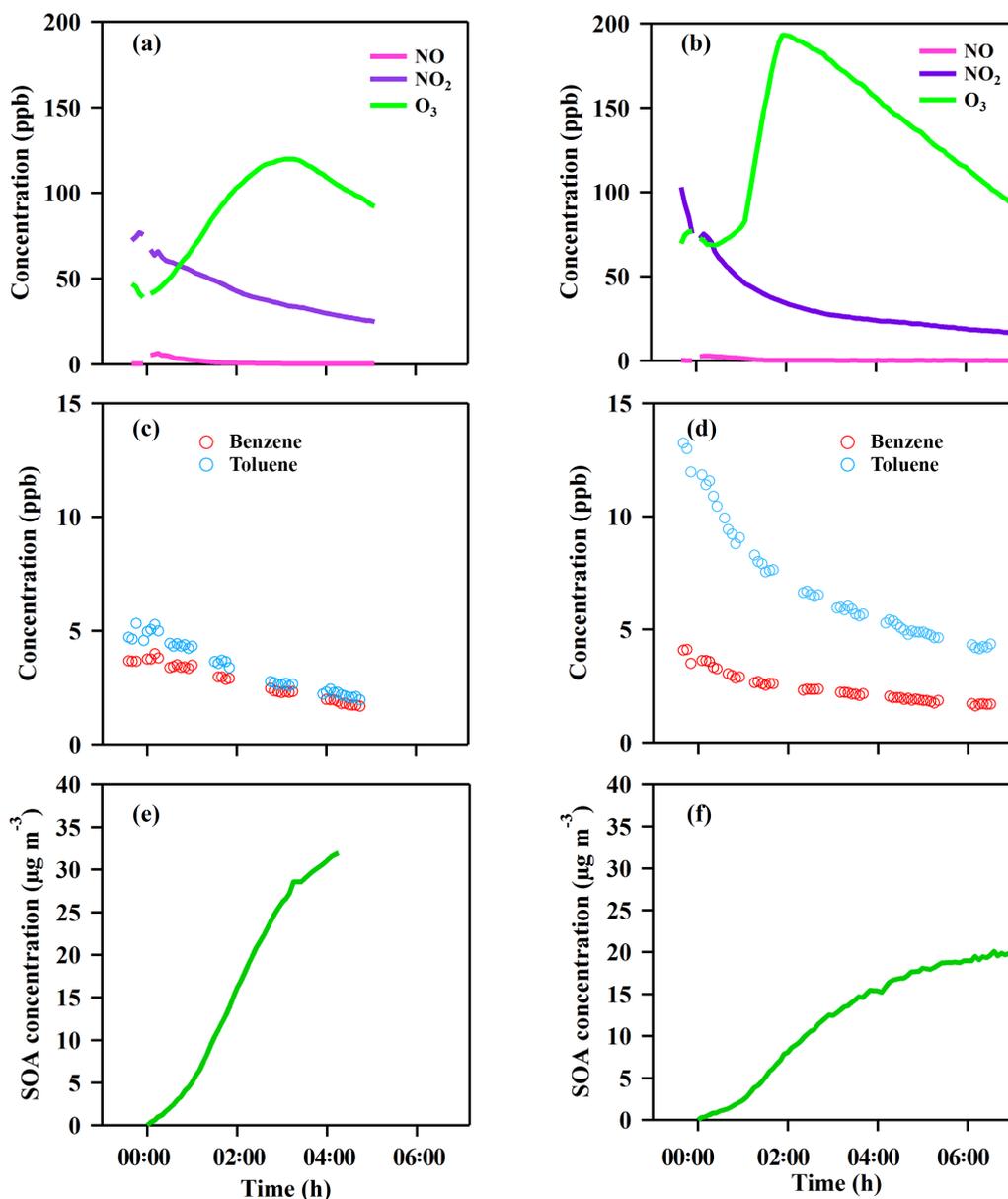
The solar radiation conditions significantly influenced the SOA formation. Thus, OH exposure was used to characterize the photochemical age as a normalization, instead of the experiment time. Two VOC species with noticeable differences in their reaction rate constants with OH radicals could be utilized to calculate the OH exposure ( $[\text{OH}] \Delta t$ ) based on Eq. (1) (for benzene and toluene, as used in this study) (Yuan et al., 2012).

$$[\text{OH}] \Delta t = \frac{1}{k_{\text{T}} - k_{\text{B}}} \times \left( \ln \frac{[\text{T}]}{[\text{B}]} \Big|_{t=0} - \ln \frac{[\text{T}]}{[\text{B}]} \right), \quad (1)$$

where  $k_{\text{T}}$  and  $k_{\text{B}}$  are the OH rate constants of benzene ( $1.2 \times 10^{-12} \text{ cm}^3 \text{ molecule}^{-1} \text{ s}^{-1}$ ) (Yuan et al., 2012) and toluene ( $5.5 \times 10^{-12} \text{ cm}^3 \text{ molecule}^{-1} \text{ s}^{-1}$ ) (Kramp and Paulson, 1998), respectively.  $\frac{[\text{T}]}{[\text{B}]}$  is the concentration ratio of toluene to benzene at the beginning of the aging process, and  $\frac{[\text{T}]}{[\text{B}]}$  is their concentration ratio measured during the aging process.

The SOA concentrations as a function of OH exposure are illustrated in Fig. 4. Wall-loss correction and dilution correction, including both particles and gaseous pollutants, were taken into consideration in the calculation of the SOA mass concentration in the chamber. Detailed descriptions of corrections are given in the Supplement. Assuming the mean OH concentration was  $1.6 \times 10^6 \text{ molecular cm}^{-3}$  in Beijing (Lu et al., 2013), the whole aging procedure in the chamber experiments was equal to a 6–10 h atmospheric photochemical oxidation. The average SOA concentrations were  $9.25 \pm 1.80$  and  $4.68 \pm 1.32 \mu\text{g m}^{-3}$  for the GDI and PFI vehicles, respectively, when the OH exposure was  $5 \times 10^6 \text{ molecular cm}^{-3} \text{ h}$  in the chamber. Considering the driving cycle mileage and fuel consumption, the SOA productions were  $54.77 \pm 10.70 \text{ mg kg fuel}^{-1}$  or  $3.06 \pm 0.60 \text{ mg km}^{-1}$  for the GDI vehicle and  $20.57 \pm 5.82 \text{ mg kg fuel}^{-1}$  or  $1.55 \pm 0.44 \text{ mg km}^{-1}$  for the PFI vehicle. Compared with the PFI vehicle, the GDI vehicle exhaust exhibited a higher potential of SOA formation, even though the PFI vehicle emitted more VOCs, which are considered as dominant classes of SOA precursors. This result indicates that higher concentrations of some other SOA precursors exist in the exhaust of GDI vehicles, which will be further discussed in Sect. 3.3.

The results from chamber simulations of SOA formation from individual gasoline vehicles are illustrated in Fig. 5. The SOA production from the both vehicles in this study is in the range of the results of previous studies (Nordin et al., 2013; Platt et al., 2013; Jathar et al., 2014; Liu et al., 2015; Peng et al., 2017). The variation of the SOA production among these studies might be caused by several factors: the model years of vehicles (corresponding to emission standards) (Nordin et al., 2013; Liu et al., 2015), their driving cycles (Nordin et al.,



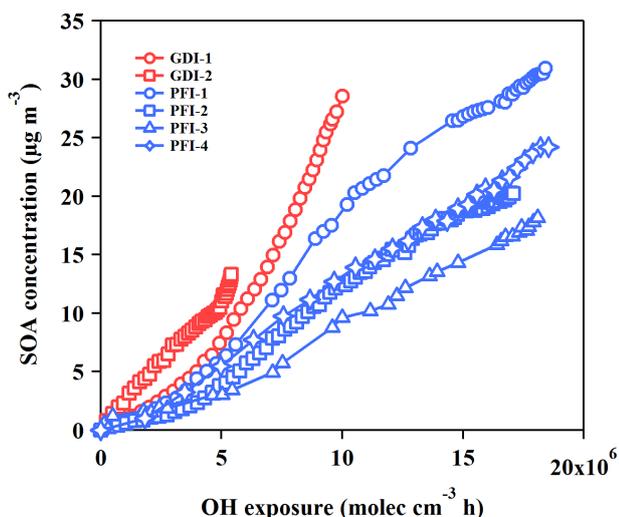
**Figure 3.** Time series of the gases and particle evolution over the photochemical age in the chamber experiments from the GDI vehicle exhaust (a, c, e) and PFI vehicle exhaust (b, d, f). Panels (a, b) show NO, NO<sub>2</sub> and O<sub>3</sub> concentration; panels (c, d) show benzene and toluene concentration; panels (e, f) show corrected SOA concentration.

2013), the initial concentrations of gaseous pollutants in the chamber (Jathar et al., 2014) and the ratio of VOCs to NO<sub>x</sub> (Zhao et al., 2017) in the chamber experiments.

To investigate the dominant contributors to ambient PM from the GDI and PFI vehicles, Fig. 6 illustrates the EFs of EC and POA as well as the production factors of SOA in this study. The SOA production from the GDI vehicle was approximately 2.7 times higher than that from the PFI vehicle. At  $5 \times 10^6$  molecular cm<sup>-3</sup> h OH exposure, the SOA / POA ratio was close to unity. Fig. 4 illustrates that the SOA production increased with photochemical age rapidly (within

$2 \times 10^7$  molecular cm<sup>-3</sup> h). Thus, SOA would exceed POA at higher OH exposure; e.g., the SOA / POA ratio reached about 4 at  $10^7$  molecular cm<sup>-3</sup> h OH exposure, becoming the major PM contributor. In terms of the POA and EC emissions as well as the SOA formation, the GDI vehicle contributed 2.2 times more than the PFI vehicle.

Although particle wall loss correction as well as particle and gas dilution corrections were considered in this study, several factors may still contribute to the uncertainties of the SOA production. First, the loss of semi-volatile vapors to the chamber walls was not corrected, which may result



**Figure 4.** SOA productions from the GDI vehicle exhaust (red markers) and the PFI vehicle exhaust (blue markers) as functions of OH exposure in the chamber experiments.

in an underestimation of the rate of SOA production with a factor of 1.1–4.1 (Zhang et al., 2014). Second, under some ambient conditions such as severe urban haze events (Guo et al., 2014), particle mass concentrations can be as high as 200–300  $\mu\text{g m}^{-3}$ , much higher than the  $23 \pm 6 \mu\text{g m}^{-3}$  under the chamber conditions of this study. High particle mass loadings are favorable for the partitioning of semi-volatile compounds into the particle phase, potentially increasing SOA mass yields (Odum et al., 1996; Donahue et al., 2006). Third, stronger partitioning of SOA precursors into the particle phase may reduce oxidation rate in the gas phase, which will potentially reduce the rate of SOA production (Seinfeld et al., 2003; Donahue et al., 2006).

### 3.3 SOA mass closure

SOA production ( $\Delta\text{OA}_{\text{predicted}}$ ) estimated from VOC precursors can be defined as in Eq. (2):

$$\Delta\text{OA}_{\text{predicted}} = \sum_i (\Delta_i \times Y_i), \quad (2)$$

where  $\Delta_i$  is the concentration change of precursor  $\text{VOC}_i$  measured with PTR-MS in the chamber experiments, and  $Y_i$  is the SOA yield of the  $\text{VOC}_i$ . In this study, benzene, toluene, C8 alkylbenzene (e.g., ethylbenzene and *o*-, *m*- and *p*-xylene) and C9 alkylbenzene (e.g., *n*- and *i*-propylbenzene, *o*-, *m*- and *p*-ethyltoluene and 1,2,3-, 1,2,4- and 1,3,5-trimethylbenzene) were involved in the estimation of SOA production, and alkanes and alkenes were not considered. A recent study found that ozonolysis of alkenes from gasoline vehicle exhaust could form SOA through aldol condensation reactions (Yang et al., 2018). However, much lower declines of concentrations were observed than those of aromatics during chamber experiments, so alkenes might not play a significant role in SOA formation in this study.

The SOA yield is sensitive to the  $\text{VOCs} / \text{NO}_x$  ratio (Song et al., 2005). In this study, the  $\text{VOCs} / \text{NO}_x$  ratio was in the range of 0.5–1.0  $\text{ppbC} / \text{ppb}$ ; thus, the SOA formation from the vehicle exhaust was determined under high  $\text{NO}_x$  conditions. The high  $\text{NO}_x$  SOA yields of benzene and toluene were taken from Ng et al. (2007). The C8 and C9 alkylbenzenes used the SOA yield of *m*-xylene from Platt et al. (2013).

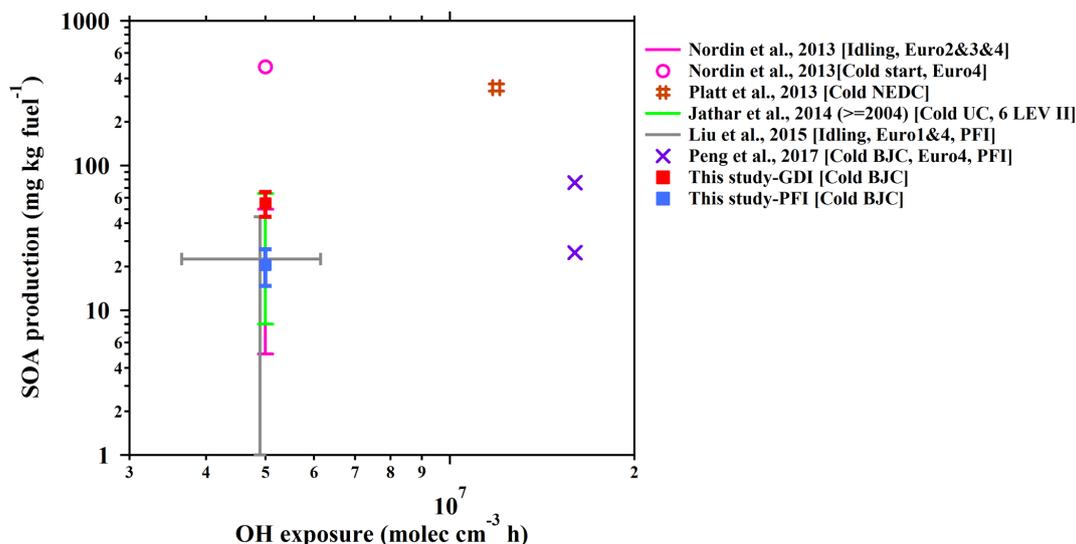
The increased predicted SOA contribution from the VOC precursors as a function of OH exposure accumulation is demonstrated in Fig. 7. At the end of the experiments, the SOA estimated from these speciated VOCs accounted for about 25 and 53 % of the measured SOA formation from the GDI and PFI vehicle exhausts, respectively. Similar to the results of previous studies (Platt et al., 2013; Nordin et al., 2013; Gordon et al., 2014), single-ring aromatics play an important role in the SOA formation, especially for the PFI vehicle which shows a higher predicted SOA fraction.

The unpredicted fraction of the measured SOA in the chamber experiments was in the range of 47–75 %. Contributions from IVOCs and semi-volatile organic compounds (SVOCs), e.g., long-branched and cyclic alkanes and gas-phase polycyclic aromatic hydrocarbons, could be a possible explanation for this underestimation because of the finding that the SOA formed by oxidation of IVOCs and SVOCs dominates over that from single-ring aromatics (Robinson et al., 2007). In addition, using a CMAQ and a 2D-VBS box model, a previous study showed that oxidation of semi-volatile POA and IVOCs from vehicles was an important source of SOA in China, and the model–measurement agreement was improved significantly when they were taken into consideration (Zhao et al., 2016a). The unpredicted SOA ratio exhibited a maximum value at the beginning of the experiment, indicating that the IVOCs and SVOCs with low volatilities produced SOA much more efficiently than the single-ring aromatics with high volatilities, as the first-generation products of photo-oxidation of these precursors form SOA (Robinson et al., 2007).

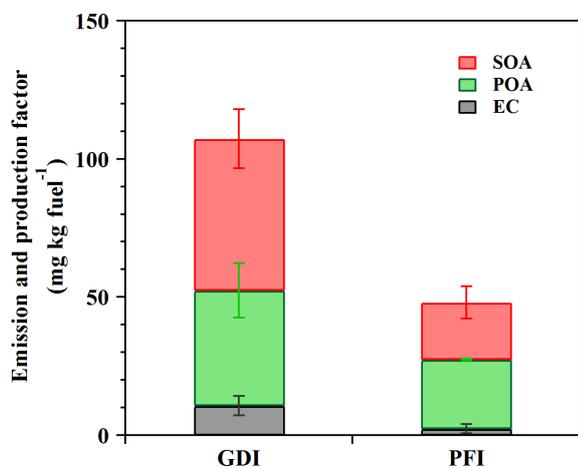
The larger fraction of the unpredicted SOA from the GDI vehicle exhaust might be associated with higher IVOCs and SVOCs emissions. Gas-phase PAH is one of the main components of speciated IVOCs (Zhao et al., 2016b). The particulate-phase PAHs from the GDI vehicle were more abundant than those from the PFI vehicle by a factor of 1.5 (Sect. 3.1). Based on gas–particle equilibrium, this indicates that more gas-phase PAHs, including some aromatic IVOCs, might be emitted by the GDI vehicles, which contribute to the SOA enhancement.

## 4 Discussion and conclusions

GDI and PFI vehicles have different fuel injection technologies in their engines, which affects their emissions of gaseous and particulate pollutants. In the GDI engine, the fuel is directly injected into the cylinder, which benefits the fuel at-



**Figure 5.** Fuel-based SOA production from gasoline vehicle exhaust as a function of OH exposure in the chamber simulations. The SOA production data are from published studies of chamber simulations of gasoline vehicle exhaust. From the study of Jathar et al. (2014), the SOA production of vehicles manufactured in 2004 or later (LEV II) is selected, which is a model year that is more close to those of the vehicles in this study. The error bars of previous results indicate the range of OH exposure (x axis) and SOA production (y axis) in their simulations. The driving cycles and vehicle information are also noted in the legend of each study.



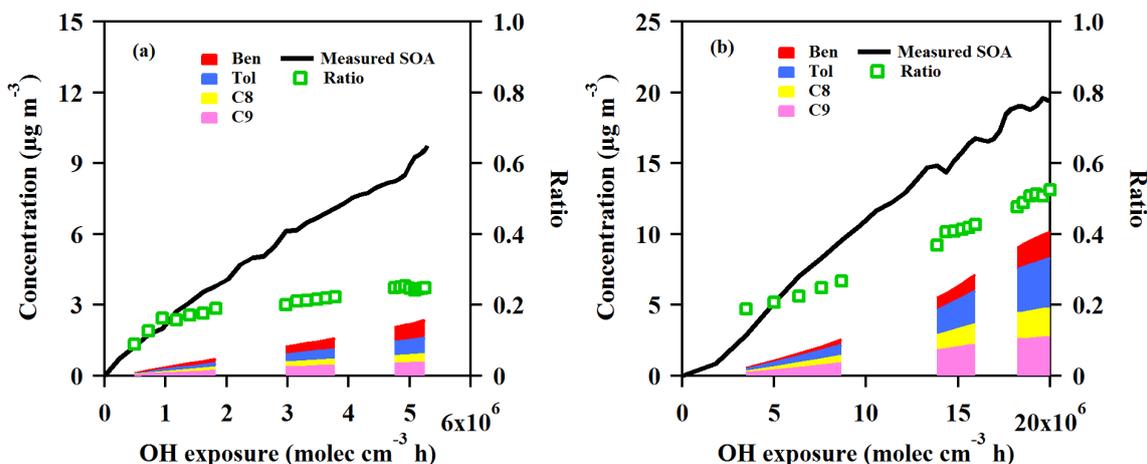
**Figure 6.** EC and POA EFs as well as corrected SOA production factors from the GDI and PFI vehicle exhausts in this study (OH exposure of  $5 \times 10^6$  molecular  $\text{cm}^{-3}$  h).

omization and vaporization and provides better control of the fuel volume and the combustion process (Liang et al. 2013; Gao et al., 2015). Thus, in this study, the tested GDI vehicle has higher fuel economy and lower THC emission than the PFI vehicle. However, the insufficient mixing time allowed for the fuel and air leads to incomplete combustion in the GDI engine (Fu et al., 2014). In addition, direct fuel injection leads to fuel impingement onto surfaces of the combustion chamber, where liquid pools form, favoring soot-like particulate formation (Ueberall et al., 2015; Chen et al., 2017). Consequently, larger particle mass and number are emitted by the

GDI vehicle than by the PFI vehicle. The particles emitted by the GDI vehicle have a higher EC mass fraction, leading to a lower OC / EC ratio. The considerable particle number emitted by gasoline vehicles, especially in GDI vehicle exhaust, makes a significant contribution to particle number concentration as well as seeds for further reactions in the atmosphere, and needs to be controlled in the future emission standards.

Our results show that the GDI vehicle contributes more to both primary and secondary aerosol than the PFI vehicle, and has a greater impact on the environment and air quality. In recent years, the market share of GDI vehicles has demonstrated a continuous growth in China because they provide better fuel economy and lower  $\text{CO}_2$  emissions. In 2016, GDI vehicles accounted for 25 % of China's market share in sales, and this proportion is expected to reach 60 % by 2020 (Wen et al., 2016). The PM enhancement of GDI vehicles with increasing population could potentially offset any PM emission reduction benefits, including the development of gasoline emission and fuel standards and the advanced engine technologies of gasoline vehicles. Therefore, our results highlight the necessity of further research and regulation of GDI vehicles.

It should be pointed out that the SOA formation factors in this study are based on one GDI vehicle and one PFI vehicle. Some previous studies proposed that vehicles have variations even though they meet similar specification vehicles and use the same fuel (Gordon et al., 2014; Jathar et al., 2014). Thus more research with more vehicles for each technology is needed on SOA formation from vehicle exhaust.



**Figure 7.** Measured and predicted SOA concentration as a function of OH exposure from GDI vehicle exhaust (a) and PFI vehicle exhaust (b) in the chamber experiments. The black line is the measured SOA concentration with wall loss and particle dilution correction during the experiment. The red, blue, yellow and pink areas are predicted SOA concentration estimated from benzene, toluene, C8 alkylbenzene and C9 alkylbenzene, respectively. The green markers are the ratios of the predicted SOA to the measured SOA.

Primary emissions and secondary organic formation from one GDI vehicle and one PFI vehicle were investigated when driving under the cold-start BJC. The primary PM emitted by the GDI vehicle was 1.4 times greater than that emitted by the PFI vehicle, and the SOA formation from the GDI vehicle exhaust was 2.7 times greater than that from the PFI vehicle exhaust for the same OH exposure. The SOA production factors were  $54.77 \pm 10.70$  mg kg fuel<sup>-1</sup> or  $3.06 \pm 0.60$  mg km<sup>-1</sup> for the GDI vehicle and  $20.57 \pm 5.82$  mg kg fuel<sup>-1</sup> or  $1.55 \pm 0.44$  mg km<sup>-1</sup> for the PFI vehicle at an OH exposure of  $5 \times 10^6$  molecular cm<sup>-3</sup> h, which is consistent with the values seen in previous studies. Considering the higher amounts of OA derived from primary emission and secondary formation, the GDI vehicle contributes considerably more to particle mass concentration in the ambient air than the PFI vehicle.

The SOA formation was predicted from the gaseous precursors emitted by the GDI and PFI vehicles under high NO<sub>x</sub> conditions. Single-ring aromatic VOCs could only explain 25–53 % of the measured SOA formation in the chamber experiments. The GDI vehicle exhibited a higher fraction of unexplained SOA. More IVOCs and SVOCs were inferred as being emitted by the GDI vehicle.

With an increasing population of GDI vehicles, any benefits of the aerosol emission reduction of gasoline vehicles are substantially offset because GDI vehicles contribute significantly to ambient aerosols. More work is needed to improve the understanding of GDI vehicle emissions and to provide information for the regulation of gasoline vehicles.

**Data availability.** The data presented in this article are available from the authors upon request (minhu@pku.edu.cn).

**Supplement.** The supplement related to this article is available online at: <https://doi.org/10.5194/acp-18-9011-2018-supplement>.

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

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