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# Carbonaceous aerosol variability and SOA formation during foggy days in Delhi, India

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The variability of organic carbon (OC), elemental carbon (EC), and secondary organic aerosol (SOA) and their relationship with meteorological parameters have been studied during foggy and non-foggy days in the peak winter months (December-January) from 2015 to 2016 in Delhi, India. Different sectoral locations were chosen based on predominant industrial, traffic, and residential activities with a background location. The average level of OC, EC, and SOA was found to be 7.47  $\pm$  7.74, 0.69  $\pm$  0.7, and 10.46  $\pm$  10.76  $\mu$ g/m<sup>3</sup>, respectively, during the foggy period and 6.1  $\pm$  6.8, 0.9  $\pm$  1.1, and 9.1  $\pm$  10.6  $\mu$ g/m<sup>3</sup>, respectively, during the non-foggy period in Delhi. A relatively higher SOA level was observed at industrial and traffic intersection sites, which indicates the proximity of the dominant source of OC that play a significant role in SOA formation. It was also found that SOA production is associated with the OC/EC ratio and may vary from site to site. Correlation analysis has confirmed that OC is having a significant strong positive correlation with EC and SOA, while EC is showing a significant moderate positive correlation with SOA. Ambient temperature (AT) shows a significant negative moderate correlation with OC levels and SOA and formation. Due to hydrophilicity (hydrophobicity) of OC (EC), its average concentration was found high (less) due to its high (less) scavenging during foggy days in comparison to non-foggy days. The study further suggests the significant impact of source variability on SOA formation due to the different nature of sector-wise sites during foggy days in Delhi.

#### KEYWORDS

organic carbon, elemental carbon, air quality, secondary organic aerosol, Delhi

## Introduction

Airborne particulate matter (PM) is composed of a variety of inorganic and organic species including carbonaceous aerosol. Carbonaceous aerosol is composed of organic carbon (OC) and elemental carbon (EC); due to radiative properties, EC is also known as black carbon (BC) (Dutkiewicz et al., 2009). The carbonaceous aerosol is produced from the incomplete combustion of organic materials such as coal, petroleum, and biomass (Seinfeld and Pandis, 2006). The OC is directly released into the atmosphere in the particle phase (primary organic aerosol) or the gas phase.

OC species in the gas phase frequently undergo oxidation reactions that lead to the formation of secondary organic aerosol (SOA) (Odum et al., 1997). Another important component of carbonaceous aerosol is EC, which is released into the atmosphere from incomplete combustion of carbonaceous fuels (Sonwani et al., 2021). Over the last decade, a number of studies of carbonaceous aerosols have been carried out especially related to their characterization and source apportionment in India and the world (Bisht et al., 2015a; Begum, 2017; Saxena et al., 2020b). Several studies in China identified the composition and distribution of organic aerosol (OA) and found that the primary organic aerosol (POA) and secondary organic aerosol (SOA) contributed 52 and 48% of total OA, respectively, in eastern China (Han et al., 2016). Huang et al. (2014) conducted a study over different regions of China and mentioned that the SOA contributes 44-71% of OA. Residential emissions, biomass burning, industrial and traffic emissions, and coal combustion are also considered major sources of OA in Beijing and South China (Cao et al., 2006; Song et al., 2006). Indian studies also identified several sources of carbonaceous components such as industrial and traffic emission sources as important sources in Delhi (Saxena et al., 2020b; Goel et al., 2021; Sonwani et al., 2021, 2022); biofuel/biomass burning and fossil fuel combustion are the important sources of the Mumbai (Aggarwal et al., 2013), while other studies mentioned that fossil fuels combustion, biomass burning, and vehicular emission sources are the important sources in Indo-Gangetic plain (one of the most popular and highly polluted regions in the world) in India (Rajput et al., 2016; Bikkina et al., 2017; Saxena et al., 2021; Ravindra et al., 2022).

Organic aerosol (OA), a major fraction of fine particulate matter, consists of primary organic aerosol (POA) and secondary organic aerosol (SOA) (Ho et al., 2006). POA is directly emitted to the atmosphere in condensed particle form (e.g., Schauer et al., 2001) after which it may partially evaporate depending on ambient conditions (Subramanian et al., 2007). Atmospheric oxidation reactions of the volatile organic compounds (VOCs) with O3, OH, and NO3 radicals result in the formation of semi-volatile VOCs (SVOCs) that are further oxidized to form SOA in the atmosphere. It was identified that most of the SOA are formed from isoprene and monoterpenes emitted from biogenic sources (Kroll et al., 2006). However, some studies also mentioned that sesquiterpenes, whose emission rate is only 10-20% of that of monoterpenes, could also be important contributors to SOA formation (Helmig et al., 2007; Sonwani et al., 2016). Oxidation of higher alkanes and aromatic compounds is an important process involved in the formation of most of the anthropogenic SOA (Kleeman et al., 2007; Chen et al., 2010).

It was identified that the water-soluble organic carbon (WSOC) in ambient aerosol is responsible for the formation of SOA (Seinfeld and Pankow, 2003; Weber et al., 2007). However, a part of water-insoluble OC (WIOC) can also be SOA (Sonwani and Saxena, 2021). The importance of SOA has been recognized and modeled extensively during photochemical events (Schell et al., 2001; Griffin et al., 2002; Pun et al., 2003; Johnson et al., 2006).

Several studies in the urban area reported SOA with higher concentration, especially in the winter months (Cao et al., 2003; Saxena et al., 2020b; Sonwani et al., 2021). A high concentration of SOA in the atmosphere is responsible for regional air quality, climate change, and human health (Pöschl, 2005; Chen et al., 2010; Saxena et al., 2020b). Thus, the monitoring and control of the SOA are important to the establishment of the air quality standard for fine PM due to its role in haze formation, visibility reduction, and negative health effects. SOA also affects climate forcing directly by altering the scattering properties of the atmosphere and indirectly by changing cloud properties.

The significance of SOA has been documented and modeled widely (Griffin et al., 2002; Johnson et al., 2006; Sonwani and Kulshrestha, 2019; Sonwani et al., 2021). Generally, OC/EC ratios are in the range of 2-3 for urban sites (Turpin and Huntzicker, 1995), and OC/EC ratios exceeding 2 represents SOA formation (Chow et al., 1993); it also represents the contribution of several sources (Sonwani et al., 2021). A ratio between 2.5 and 10.5 represents residential coal burning, 7.7 symbolizes biomass burning, 0.8 indicates the predominance of heavy-duty diesel vehicles, and 2.2 indicates gasoline exhaust as a major emission source for carbonaceous aerosol (Cheng et al., 2006; Saarikoski et al., 2008). Another study with a higher OC/EC ratio such as 5.8 in Lahore (urban location), Pakistan (Husain et al., 2007) reported the formation of SOA. However, such high OC/EC ratios cannot be explained only in terms of increased contribution from SOA, rather it can also be credited to the majority of biomass burning sources (Ram and Sarin, 2010). Nevertheless, there are very few studies that have reported SOA formation during the foggy/winter season (Chen et al., 2010; Kaul et al., 2011; Saxena et al., 2020b). Due to meteorological conditions such as low temperature, high humidity, and stagnant air favors the formation of condensable water-soluble SOA during foggy days (Kaul et al., 2011), it was also reported that the fog enhances the SOA formation, and aqueous phase chemistry in fog drops is responsible for the SOA formation (Saxena et al., 2020b). Studies in Indo-Gangetic Plain (IGP) also reported the enhanced formation of SOA due to aqueous phase chemistry. Thus, fogs also act as the active at cleansing the atmosphere of carbonaceous aerosols (Saxena et al., 2020a). The removal of the carbonaceous aerosol through sedimentation is efficient with smaller fog droplets as compared to the large droplets (Kaul et al., 2011). The OC is more effectively removed from the atmosphere through the wet scavenging process due to its high hydrophilicity as compared to EC (Sonwani et al., 2021).

The present study examined the OC and EC in ambient aerosol samples collected at different locations during the

foggy and non-foggy periods in the year 2015–2016 in Delhi, India. The main goal of the present study is to identify the variability in SOA levels according to changing anthropogenic sources of carbonaceous aerosol during foggy days. Thus, the objectives include the source identification by the OC/EC ratio, estimation of SOA using the EC tracer technique, variability of carbonaceous fractions during foggy and non-foggy days, and relationship of SOA production according to the source's predominance of carbonaceous fractions.

## Methodology

### Study area and sampling locations

Delhi, India (28.38°N, 77.10°E), constitutes an area of 1,483 km<sup>2</sup> with one of the highest polluted regions in the world. Delhi is also facing a problem of rapid industrial growth and urbanization resulting in the immigration of people from different cities in India and daily up and down schedules of the population from the National Capital Region (NCR) of Delhi resulting in high traffic density in the city. The city has several small, medium/large scale industries, several coal-based thermal power plants with combined capacity of ~1,560 MW and three gas-based power plants with a combined capacity of ~1,938 MW (CEA 2016). According to the Delhi transport department, the total number of registered vehicles up to June 30, 2014 was 80, 52,508 (Government of Delhi, 2014). Among all the megacities of the world, Delhi is also identified as the world's most polluted city in terms of fine particulate matter (World Health Organization, 2021). In several research studies, it was identified that the PM2.5 concentration in the Delhi region exceeds the National Ambient Air Quality Standard (annual NAAQS) of 40  $\mu$ g/m<sup>3</sup> (it is four times higher than the WHO's standard limit) (Dey et al., 2012; Pal et al., 2018; Sonwani and Kulshrestha, 2018; Singh et al., 2021; Sonwani et al., 2022). Thus, Delhi is characterized by several man-made emission sources such as fossil fuels, vehicular emissions, and agricultural residue burning (Saxena et al., 2020a; Sonwani et al., 2021). Delhi experiences three main seasons, viz., summer, monsoon, and winter. It experiences winter from November to February with several foggy days. The ambient temperature ranges between 3 and 22°C, humidity ranges from 53 to 98%, and wind speed is 2-6 m/s in winter months. UB is the Jawaharlal Nehru University campus (latitude 28.54°N and longitude 77.17°E) located at the ridge of the Aravalli hills in South Delhi. It is considered the urban background location in Delhi as it receives citywide emissions most of the time in a year (Sonwani et al., 2021). This site comprises academic buildings, staff quarters, a mini shopping area, and hostels. TI site is a traffic intersection area (latitude 28.63°N and longitude 77.09°E) and very near to commercial areas such as Mukherjee Nagar and Kamla Nagar. This site has high congestion at all times because of a large number of eating points, proximity to the metro station, and close to the University of Delhi North Campus area. The ID site is an industrial site (latitude 28.71°N and longitude 77.17°E) located in North-West Delhi and in close proximity to another industrial area Jahangirpuri. It is also close to the outer ring road and contains a high traffic volume (Saxena et al., 2020b). This site is also having a metro station nearby, a bus depot, some slum areas, and one of the biggest vegetable markets in Delhi, Azadpur mandi, which makes this site more congested. The location of these three sites is shown in Figure 1.

# Sample collection, analysis, and quality control

Fine aerosol samples (PM<sub>2.5</sub>) were collected on quartz micro-fiber filters using a low volume sampler (flow rate = 30 LPM) on foggy and non-foggy days during the winter season in early morning hours, i.e., 04:00-07:00 h on the terrace of each site's building in the year 2015–2016 (Saxena et al., 2020b). The meteorological parameters, viz., ambient temperature (AT), relative humidity (RH), and wind speed (WS) data were procured from www.wounderground.com in the Delhi region. The foggy and non-foggy days were identified with the help of a weather forecast from the Indian Meteorological Department (IMD) (http://city.imd.gov.in) website. Before starting sampling, the filters were baked at 550°C for 8 h and then stored in aluminum foils that were also pre-baked. These samples were kept in airtight boxes in the refrigerator at about 4°C to prevent the evaporation of volatile components.

A punch of  $\sim 0.5$  cm<sup>2</sup> area of QFFs was analyzed for OC and EC fractions by using an OC-EC analyzer (DRI Model, 2001; Cao et al., 2013). The IMPROVE\_A protocol was used for the analysis of carbon in PM2.5 collected on a quartz fiber filter. The sample is heated to four temperature plateaus (140, 280, 480, and 580°C) in pure helium and three temperature plateaus (580, 740, and  $840^{\circ}$ C) in 98% helium and 2% oxygen. During the analysis, OC is vaporized from a sample in the presence of inert helium and an oxidizer is used to combust EC. Pyrolyzed carbon (OP) is formed when reflectance reached its initial intensity and when O<sub>2</sub> is added to the combustion atmosphere at 580°C. The relative standard deviation of duplicate samples was in the range of 10% for organic species, OC and EC. The calibration of this instrument can be done by different known samples of CH<sub>4</sub>. A blank is also analyzed to obtain the correct value of the samples by subtracting blank values from the samples. The magnitude of the blank was 1.77  $\mu$ g/m<sup>3</sup> for OC and 0.04  $\mu$ g/m<sup>3</sup> for EC. The analyzer was also calibrated each month by using a preheated blank quartz fiber filter and standard sucrose solution. Several studies mention a similar process of quality control for atmospheric OC and EC determination (Srinivas and Sarin, 2014; Sonwani and Kulshrestha, 2019; Sonwani et al., 2021).



### **Determination of SOA**

There is no direct analysis method available to quantify SOA in total organic mass. So, for this, an indirect method for SOC estimation is used to take EC as a tracer for POC into consideration for the evaluation of SOA (Turpin and Huntzicker, 1995). EC is mainly emitted from combustion sources along with POC (Cao et al., 2003). The equations used to estimate SOC are as follows:

$$[POC] = \left[\frac{OC}{EC}\right] \min X EC_{ambient} \tag{1}$$

$$SOC = OC_{meas} POC$$
 (2)

where [OC/EC]min is the minimum value of OC/EC ratios observed for the samples. SOA estimation was done by the EC tracer method. In this case, SOC is multiplied by 1.4 to give SOA. This method was adopted by Turpin and Huntzicker (1995) and Kaul et al. (2011).

# **Results and discussion**

# Level distribution of carbonaceous components

Foggy days during the winter season (November–January) repeatedly affect the pollutants load in northern India (Saxena et al., 2020b). Descriptive statistics of mass concentration (average  $\pm$  SD) of OC, EC, SOA, and OC/EC are shown in Table 1 for the foggy and non-foggy periods over selected locations in Delhi, India. Figures 2A,B show day-to-day variations of the different species during both seasons. The average level of OC, EC, SOA, and OC/EC was found to be 7.47  $\pm$  7.74, 0.69  $\pm$  0.7, 10.46  $\pm$  10.76, and 18.62  $\pm$  20.66 µg/m<sup>3</sup>, respectively, during the foggy period and 6.1  $\pm$  6.8, 0.9  $\pm$  1.1,

TABLE 1 Carbonaceous aerosol fractions during foggy and non-foggy days at respective sites over Delhi.

	UB	TI	ID	DEL
Foggy				
OC	$3.54 \pm 2.78$	$3.71\pm5.25$	$14.75\pm4.38$	$7.47\pm7.74$
EC	$0.55\pm0.37$	$0.18\pm0.19$	$1.5\pm0.68$	$0.69\pm0.7$
SOA	$4.32\pm3.95$	$7.59 \pm 10.09$	$18.13\pm8.77$	$10.46\pm10.76$
OC/EC	$8.2\pm5.46$	$30.56 \pm 26.83$	$14.25\pm15.37$	$18.62\pm20.66$
Non-foggy				
OC	$3.14\pm2.01$	$4.64 \pm 7.93$	$12.47\pm 6.05$	$6.1\pm 6.8$
EC	$0.69\pm0.75$	$0.15\pm0.14$	$1.98 \pm 1.24$	$0.9\pm1.1$
SOA	$4.28 \pm 2.81$	$7.68 \pm 13.37$	$17.84 \pm 6.18$	$9.1\pm10.6$
OC/EC	$6.32\pm4.01$	$30.76\pm26.04$	$8.07\pm5.93$	$14.84 \pm 18.99$

9.1  $\pm$  10.6, and 14.84  $\pm$  18.99  $\mu$ g/m<sup>3</sup>, respectively, during the non-foggy period in Delhi. The relatively lower carbonaceous concentration may be due to the presence of fog in the winter season (Saxena et al., 2020b). Among all three selected sites, the highest level of carbonaceous components was found at the ID site during foggy days, where OC and EC were found about two times and SOA was 1.7 times higher than Delhi's average. The UB site was identified with lower average OC and SOA levels and was found about two and 2.4 times lower than Delhi's average. Similarly, in the case of the non-foggy period, carbonaceous components were found to be highest at the ID site and OC, EC, and SOA were observed to be about two times higher than Delhi's average. Moreover, the UB site was again identified with the lowest OC and SOA concentration and observed with about two times lower concentration on nonfoggy days. The higher level of the OC in comparison to EC indicated the more abundance of OC with fog droplets due to OC's hydrophilicity and EC's hydrophobicity. Thus, the average OC and EC concentrations were found in the order of ID > UB > TI; whereas for SOA concentration, the observed order was ID > TI > UB during foggy and non-foggy days. The higher levels of carbonaceous components at the ID site during both periods indicated the high combustion and emission activities, resulting in high levels of ambient carbonaceous components (Sonwani et al., 2021). Whereas, the low concentration of OC and SOA at UB indicated less number of immediate sources as it is a university campus area with limited combustion-related sources, especially during the sampling period. The observed SOA levels were found lesser than in the earlier reported studies in Delhi (Saxena et al., 2020b) and Kanpur (Kaul et al., 2011). In the case of EC, it was found to be lowest at the TI site with about four times and six times lower than Delhi's average during foggy and non-foggy periods, respectively. The low level of EC at the traffic site may be representative of freshly emitted EC from vehicular sources and less abundance of aged EC particles during both periods. It was also observed that the average levels

of OC/EC ratios were found significantly higher at the TI site  $(30.56 \pm 26.83 \text{ and } 30.76 \pm 26.04$ , respectively) as compared to UB ( $8.2 \pm 5.46$  and  $6.32 \pm 4.01$ ) and ID site ( $14.25 \pm 15.37$  and  $8.07 \pm 5.93$ ) during foggy and non-foggy periods, respectively. This significantly higher OC/EC ratio at the TI site was due to the emission released from the several restaurants located very near to the TI sites and involved with the different cooking activities, namely, meat roasting, cafeteria frying, fish roasting, and snack-street boiling. Similar observations were also reported by different authors characterizing different cooking-related emissions (Schauer et al., 2002; See and Balasubramanian, 2008; Li et al., 2015).

Table 2 shows a comparison of particulate bound average concentrations of OC, EC, and SOA/SOC/WSOC with their predominant source type at different selected locations in Delhi, India and in the different regions of the world. Several studies on carbonaceous aerosol have been performed across the world but very limited studies were carried out for the determination of carbonaceous species during foggy days in comparison to non-foggy days. Some of the recent studies that reported their OC, EC, and SOA/SOC/WSOC concentrations during foggy days have been listed along with the other studies that reported concentrations of such carbonaceous species in PM2.5. Saxena et al. (2020b) reported OC, EC, and SOA levels as 35.48, 10.34, 17.84 and 54.74, 11.86, and 40.12 µg/m<sup>3</sup> at residential and industrial sites, respectively, during foggy days in Delhi. Such levels of the carbonaceous species are relatively higher as compared to our study and that may be due to the selection of the nearness of sampling location to the source and another reason is due to the selection of the time period and that is the time of Diwali (firework) festival and a season of crop residue burning in nearby states in Delhi. Similarly, Ali et al. (2019) identified the OC, EC, and SOA levels in Delhi in PM<sub>1.0</sub> mass concentrations and found OC (24.7  $\pm$  9.4), EC (11.7  $\pm$ 4.7), and SOC (11.3–16.3)  $\mu$ g/m<sup>3</sup> at airport and traffic sites, i.e., also higher than our studies values due to the fine size of particulate matter and predominance of traffic and airportrelated emissions. Kaul et al. (2011) identified the OC, EC, and SOA concentrations in foggy and non-foggy periods in the Kanpur site with a predominance of industrial, traffic, and domestic fuel combustion sources. The levels of carbonaceous species were found significantly higher than in the present study during foggy and non-foggy periods. These significantly higher levels of OC, EC, and SOA might be due to the presence of a variety of emission sources near the sampling location in Kanpur. Jain et al. (2020) identified Delhi's annual average levels of OC and EC as 15.73  $\pm$  12.72 and 7.31  $\pm$  6.17  $\mu g~m^{-3},$ respectively, for PM2.5. Jain et al. (2021) also noticed PM2.5 bound OC and EC levels as 15.09  $\pm$  8.72 and 6.54  $\pm$  3.27  $\mu$ g m<sup>-3</sup>, respectively, in Varanasi. While in Kolkata, OC and EC levels were observed as 17.91  $\pm$  9.72 and 9.43  $\pm$  4.11 µg m<sup>-3</sup>, respectively. Similarly, other studies also reported the carbonaceous species in PM2.5 and PM1.0 samples collected at



different locations in India and the world as listed in Table 2 (Pio et al., 2011; Zhang et al., 2011, 2014; Du et al., 2014; Bisht et al., 2015a; Gao et al., 2016; Sharma et al., 2016).

# Time series of carbonaceous components

Figures 2A,B represent the time series of carbonaceous components at selected sites over Delhi during foggy days and non-foggy days, respectively. The time series of OC and SOA have been presented on the primary y-axis, while EC has been presented on the secondary y-axis in both the figures. Some of the samples were discarded due to contamination, and electricity failure/operational failure of the sampler at the respective sites. Fog is an effective scavenger of OC and is observed with varying scavenging efficiencies that range between 5 and 90% for EC or black carbon (BC) (Gundel et al., 1994; Collett et al.,

2008). Carbonaceous species (OC, EC, and SOA) were found to be higher in the peak winter period during both foggy and non-foggy days. Due to a predominant industrial emission, significantly high OC and SOA levels were observed in the case of ID sites during both periods. SOA concentrations on both foggy and non-foggy days were found to be high; however, the SOA concentrations on foggy days are comparatively higher, on average, than on non-foggy days. A direct comparison of SOA concentrations is, however, perhaps not especially revealing, since fog actively deposits scavenged organic matter as enhanced dispersion on non-foggy days is estimated to decrease SOA levels under such atmospheric conditions. A higher OC and SOA formation was also noticed in the case of the TI site, especially during the peak winter period, which may be due to the traffic congestion due to visibility degradation in the peak winter period (Saxena et al., 2020a; Sonwani et al., 2022). Similarly, EC levels were also found to be higher on foggy and non-foggy days both at the ID site. In case of non-foggy days,

Location	Site type	Average concentration			References
		OC	EC	SOA	
Delhi	Urban background	$3.54 \pm 2.78$	$0.55\pm0.37$	$4.32\pm3.95$	Present study
		(Foggy)/ $3.14 \pm 2.01$	$(Foggy)/0.69 \pm 0.75$	(Foggy)/4.28 ± 2.81	
		(Non-foggy)	(Non-foggy)	(Non-foggy)	
	Traffic	$3.71\pm5.25$	$0.18\pm0.19$	$7.59 \pm 10.09$	
		(Foggy)/ 4.64 $\pm$	(Foggy)/ 0.15 $\pm$	(Foggy)/7.68 $\pm$	
		7.93 (Non-foggy)	0.14 (Non-foggy)	13.37 (Non-foggy)	
	Industrial	$14.75\pm4.38$	$1.5\pm0.68$ (Foggy)/	$18.13\pm8.77$	
		(Foggy)/ 12.47 $\pm$	$1.98 \pm 1.24$	(Foggy)/ 17.84 $\pm$	
		6.05 (Non-foggy)	(Non-foggy)	6.18 (Non-foggy)	
Delhi	Airport and traffic	Average: 24.7 $\pm$ 9.4	Average: $11.7 \pm 4.7$	SOC: 11.3-16.3	Ali et al., 2019*
		(Foggy)	(Foggy)		
Delhi	Residential	35.48 (Foggy)	10.34 (Foggy)	17.84 (Foggy)	Saxena et al. (2020b)
Delhi	Industrial	54.74 (Foggy)	11.86 (Foggy)	40.12 (Foggy)	
Kanpur	Mix of industries,	$40.92 \pm 20.59$	$6.13 \pm 6.03$	$29.44 \pm 8.90$	Kaul et al., 2011*
	traffic and domestic	(Foggy)/37.37 ±	(Foggy)/9.18 ± 5.29	(Foggy)/16.03 $\pm$	
	fuel combustion	17.87 (Non-foggy)	(Non-foggy)	8.29 (Non-foggy)	
Kanpur	Traffic, Industrial,	$41.3\pm21.7$	$3.6 \pm 3.0$	WSOC: 34.2 ± 17.8	Rajput et al. (2016)'
	and biomass	(Foggy)/64.5 ± 36.6	(Foggy)/8.2 ± 4.7	(Foggy)/28.8 ± 18.4	
	burning		(Non-foggy)	(Non-foggy)	
Delhi	Traffic	$15.4\pm12.7$	$5.2 \pm 3.2$	SOC: $7.3 \pm 8.6$	Shivani et al. (2019)
Haryana	Residential	$12.1\pm10.5$	$3.2 \pm 2.2$	SOC: $7.2 \pm 8.0$	
Delhi	Traffic and	$37.73 \pm 14.32$	$7.79\pm3.73$	NA	Bisht et al. (2015a)
	residential				
Delhi		$15.7 \pm 12.7$	$7.31\pm 6.17$	SOC: 3.46-11.84	Jain et al. (2020)
Delhi	Traffic and	$19.9 \pm 14.3$	$10.4\pm8.0$	NA	Sharma et al. (2016)
	residential				
Varanasi	Traffic and	$15.1 \pm 8.7$	$6.5 \pm 3.3$	NA	Jain et al. (2021)
	residential				
Kolkata	Traffic and	$17.9\pm9.7$	$9.4 \pm 4.1$		
	residential				
Shanghai	Residential	$8.6\pm 6.2$	$2.4 \pm 1.3$	SOC: $3.9 \pm 4.2$	Zhang et al., 2014
Hong Kong	Suburban-coastal	4.5	1.3	NA	Gao et al., 2016
Beijing	Residential and	15.7	5.2	WSOC: 6.77	Du et al., 2014
	commercial				
Nanjing	Suburban-	27.8	9.3	14.77-18.18	Zhang et al., 2011
	Industrial				
Birmingham	Traffic	$3.5 \pm 2.8$	$2.2 \pm 1.5$	NA	Pio et al., 2011
Oporto	Urban background	$8.5\pm7.9$	$3.2 \pm 2.3$		
Coimbra	Urban background	$5.0 \pm 3.9$	$1.4 \pm 1.2$		
Madrid	Industrial	$3.8 \pm 1.3$	$3.8 \pm 1.2$		

TABLE 2 Statistics for carbonaceous aerosol mass concentrations in PM<sub>2.5</sub> measured in the major cities of India and the world (µg/m<sup>3</sup>).

 $*PM_{1.0}$  sample.

OC at ID and TI sites was found higher in comparison to OC at the UB site. Moreover, SOA formation was significantly higher at industrial and traffic sites in comparison to the UB

site. The higher SOA formation at ID and TI sites indicated toward the immediate source of OC that is further responsible for the anthropogenic origin of SOC formation and play a significant role in anthropogenic pollutants for SOA formation in the urban area (Lee et al., 2010). In comparison to OC and SOA, EC remains less affected during foggy days, as freshly emitted EC particles (hydrophobic) remain unaffected by fog, hence less scavenged by fog droplets, whereas aged EC particles (hydrophilic) are easily scavenged from the atmosphere during foggy days. In the present study, EC particles effectively scavenged through the fog at ID followed by UB in comparison to the TI site. It indicates the abundance of EC particles at the ID site and the predominance of aged particles at the UB site (as the site is located at the urban background location and behaves like a sink of the city). The low EC concentration during foggy and non-foggy days at the TI site represents the predominance of freshly released EC particles (hydrophobic) through vehicular emission.

### **Correlation analysis**

Correlation analysis is performed between OC, EC, and SOA concentrations ( $\mu$ g/m<sup>3</sup>) and meteorological parameters, i.e., AT (ambient temperature), RH (relative humidity), and WS (wind speed) in Delhi (Supplementary Table 1). Pearson's correlation coefficient (r) assumes an inherent linear relationship in the data (Jain et al., 2017) and the correlation ranges from strong (1.00-0.50) to moderate (0.49-0.30) to weak (0.29-0.00) (Xie et al., 2015). As per correlation analysis, OC is having a significant strong positive correlation with EC and SOA, while EC is showing a significant moderate positive correlation with SOA. Moreover, OC shows a significant negative moderate correlation with AT. OC and EC's strong positive correlation indicates that both are emitted from a common source. The selected sites, TI and ID, have immediate combustion sources like industries and vehicles which are strong sources of OC and EC; however, UB is an urban background site and acts as a sink of emissions coming from combustible sources that again confirms the presence of OC and EC. Moreover, OC was also found to be strongly positively correlated with SOA, and EC was found to be significantly moderately positively correlated with SOA. Primary OC is the main precursor of SOA and actively participates in the formation of SOA. OC species in the gas phase often undergo oxidation reactions that lead to the formation of secondary organic aerosol (SOA) (Odum et al., 1997). The pre-existing seed aerosols are responsible for the formation of SOA under the influence of homogeneous or heterogeneous nucleation (Sonwani and Kulshrestha, 2019). Moreover, since OC and EC are significantly strongly positively correlated, therefore, EC also has some minor role in the formation of SOA (Bhowmik et al., 2021). The significant moderate negative correlation of OC with AT justifies the fact that with a decrease in temperature, OC concentrations will increase. Generally, during winters (selected period of study), lower temperatures favor the low mixing heights of carbonaceous aerosols resulting in their

higher deposition in less air mass. Lower temperatures also favor more SOA due to the shifting of gas-to-particles conversion toward the particle phase in the atmosphere (Sonwani and Kulshrestha, 2019; Sonwani and Saxena, 2021). Moreover, EC is having a negative weak correlation with AT. In addition to that, SOA is showing a significant negative moderate correlation with AT which favors the fact that during low temperatures, SOA formation will be more (Rengarajan et al., 2007).

# SOA formation and OC/EC ratios during foggy and non-foggy days

Secondary organic aerosol (SOA) is a significant component of atmospheric fine particulate matter and formed through reactions in atmospheric waters (i.e., clouds, fogs, and aerosol water) (Aiken et al., 2008), and responsible for the adverse impacts on both climate and human health (Seinfeld and Pandis, 1998). Formally, SOA forms through the partitioning of semi-volatile compounds of gas-phase photochemical reactions relating to volatile organic compounds (VOCs) and atmospheric oxidants (Seinfeld and Pankow, 2003). Thus, the partitioning theory is an essential tool for SOA modeling (Donahue et al., 2006). In the winter months, the shifting of gas to particle toward the particle phase is one of the significant factors for the formation of SOA that ultimately increase the organic aerosol in the winter season. It was reported that a large fraction of the OC concentration is estimated to be secondary in origin (Cabada et al., 2004; Bisht et al., 2015b). The EC tracer method is one of the well-known SOA measurement tools that are now widely used in carbonaceous aerosol-related studies. The primary OC/EC ratio estimated by the EC tracer method is subject to uncertainties due to the influence of several emission sources with variable meteorological factors that ultimately effects the measurement of accurate SOC and SOA levels. Several studies recently suggested that multiphase chemistry can play an important role in understanding the SOA formation, and the SOA formation mechanism has been explained through wet aerosol and in fogs and clouds (Carlton et al., 2008; Virtanen et al., 2010). Multiphase chemistry involves chemical reactions, transportation, and transformations between gaseous, liquid, and solid matter. Such processes are important for climate and Earth science research as well as for life and health sciences (Poschl and Shiraiwa, 2015). The SOA formation and evolution is a complex multiphase process, involving a series of chemical reactions and mass transport in the gas phase, at the gasparticle interface, and in the particle phase. In the atmosphere, a mixture of organic aerosol with some inorganic salts or acids and water may follow complex, non-ideal behavior including liquid-liquid or liquid-solid phase separation identified in some thermodynamic models and also demonstrated in laboratory and field studies (Pöhlker et al., 2012; Shiraiwa et al., 2013; Ganbavale et al., 2015). Several studies also mentioned that

the oxidation of  $\alpha$ -pinene and isoprene play an important role in the formation of the SOA particles formed that are liquid at high RH and amorphous semisolid or glassy at low RH and ambient temperature (Renbaum-Wolff et al., 2013; Song et al., 2015). A large number of primary particles from a variety of anthropogenic sources (e.g., fly ash, metal, primary organic matter, and soot particles) are the major aerosols in winter hazes (Chen et al., 2017; Wang et al., 2019). Rapid production of secondary aerosols (e.g., sulfates, nitrates, and secondary organics) via heterogeneous reactions under high relative humidity (RH) mainly elevates haze levels and causes regional hazes (Wang et al., 2016; Murphy et al., 2017; Li et al., 2019; Xing et al., 2019). In the early winter season (October-mid-November), crop residue burning activities are very common and release a huge amount of air pollutants that undergo long-range transport and disturb Delhi's air quality significantly (Saxena et al., 2021). Firework activity-related festival, "Diwali," is associated with the early winter months that create air pollution load in the Delhi region (Sarkar et al., 2010; Saxena et al., 2020a,b). Other studies, also reported that the regional haze and SOA levels are also enhanced by longrange transport of emissions from distant locations (Zhang et al., 2020, 2021). The dissolution of soluble organic gases into the fog droplets results in oxidation and yields low volatile products that remain along with the particles released by evaporating fog droplets. The mechanism of SOA production is still poorly understood partly due to the complex nature of multiphase processes likely involved in SOA production (Virtanen et al., 2010); while in the case of surface-based fogs, significant scavenging and removal of organic aerosol also occur as droplets that are deposited to surfaces Turpin and Huntzicker (1995). In addition, recent studies during winter months mentioned the anthropogenic emission's dominant role in SOA formation during foggy days (Kaul et al., 2011; Chakraborty et al., 2016; Satish et al., 2017; Saxena et al., 2020b) and observed that the SOA formation is also affected by several factors such as AT, RH, fog, and organic aerosol loading (Frank et al., 1998; Sonwani et al., 2021).

In the present study, the average OC/EC ratio of Delhi during foggy days was comparatively higher with an average value  $\pm$  standard deviation of 18.62  $\pm$  20.66 to its value on non-foggy days with an average value  $\pm$  standard deviation of 14.84  $\pm$  18.99. As fog is most often present during the early morning hours; the enhanced OC/EC ratio during this time period on foggy days could be an indication of aqueous phase SOA production (Kaul et al., 2011). Another explanation for this observation could be an increased occurrence of biomass burning at night. The study occurred during winter when overnight heating by fires is likely to be important. In the case of SOA formation, it was found to be higher with a concentration of 10.46  $\pm$  10.76  $\mu$ g/m<sup>3</sup> on foggy days in comparison to nonfoggy days with a concentration of 9.1  $\pm$  10.6  $\mu$ g/m<sup>3</sup> over Delhi. The relationship between SOA and OC/EC ratio is shown in

Figure 3 and it represents the scatter plot between the SOA and OC/EC ratio during foggy and non-foggy days. Fig 3a shows the OC/EC and SOA relationship at all three sites during foggy days. It was observed that the TI site showed a moderate positive correlation (R = 0.57), whereas ID and UB sites showed a poor correlation with R = 0.08 and R = 0.19, respectively, between SOA and OC/EC ratio during foggy days. Similarly, during nonfoggy days, SOA and OC/EC ratios were observed with moderate positive correlation (R = 0.62) at the TI site and poor correlation at ID (R = 0.17) and UB sites (R = 0.34). Thus, the most significant relationship between SOA and OC/EC ratios was observed at the TI site on both days.

On comparing the OC/EC ratio at different sites, the highest average level was observed in decreasing order of TI >ID>UB during foggy and non-foggy days. It represents that the comparatively higher amount of freshly emitted OC and EC particles at TI and ID sites in comparison to UB sites were observed with mixed primary as well secondary OC and EC particles. Aged OC and EC particles are also the characteristic features of the site located at a downstream location (Sonwani and Kulshrestha, 2019). It was also observed that a higher average value of OC/EC ratio (≥10) was found to be 68% at the TI site, 57% at the ID site, and 38% at the UB site during foggy days. Similarly, in the case of non-foggy days, a higher OC/EC ratio was 73% at the TI site, 17% at the ID site, and 6% at the UB site. The higher OC/EC ratio during foggy and non-foggy days represents the biomass burning activities on winter nights. Apart from traffic emission at the TI site, the high percentage of samples with a higher OC/EC ratio also indicated the contribution from residential heating, as this site is very close to the residential and commercial area. Previous studies also mentioned that a high OC/EC ratio indicates a higher contribution of OC, indicating lower traffic emissions or a higher non-traffic contribution (e.g., biomass burning) at the same time as a low OC/EC ratio indicates a high contribution from traffic emissions (Pant et al., 2017). The result shows that there is no significant difference in the SOA formation between foggy and non-foggy days. However, there was a significant difference in SOA formation between different sites, where, the ID site was predominantly contributing to SOA formation over Delhi and followed by TI and UB sites during both days. In addition, recent studies in wintertime also mentioned biomass burning emission as a dominant contributor to the SOA formation during winter months (Chakraborty et al., 2016; Saxena et al., 2020a).

# Conclusion

The present study hypothesized that the fog episodes in Delhi were associated with enhanced production of SOA. The findings of the study may be summarized as follows:

• The enhanced SOA production in Delhi is due to aqueous phase chemistry, hence high SOA production was observed



during foggy days as compared to the non-foggy period. Results also indicate the higher SOA formation at industrial and traffic intersection sites in comparison to the urban background site in Delhi.

- The higher levels of carbonaceous components at the ID site during both periods indicated the high carbonaceous aerosol emissions due to industrial activities. The ID site was also identified with high SOA production under the influence of high OC at the industrial site.
- Correlation observations found that SOA was strongly positively correlated with OC and moderately positively correlated with EC. The lower temperature also favors SOA formation due to the shifting of gas-to-particles conversion toward the particle phase. However, relative humidity had no detectable influence on SOA production. AT was observed with a significant moderate negative correlation with OC and a negative weak correlation with EC. Scatter plots between SOA and OC/EC ratio indicated that the TI site was observed with a moderate positive correlation, while ID and UB sites were observed with a poor correlation on foggy and non-foggy days both.
- Thus, the results mentioned that the SOA production may be associated with the OC/EC ratio during foggy and nonfoggy days. However, it may vary from site to site, and their levels are influenced by the immediate carbonaceous aerosol emission sources.
- The high average OC concentration during foggy days is due to its hydrophilicity, due to which OC aerosol is easily scavenged from the atmosphere during foggy days; however, due to the hydrophobicity, EC is less effectively scavenged with fog and was observed with relatively less average concentration during foggy days in comparison to non-foggy days.

• Thus, the understanding of the atmospheric chemistry of carbonaceous aerosol during foggy days is important to develop effective air quality management and technological advancements in the region.

# Data availability statement

The raw data supporting the conclusions of this article will be made available by the authors, without undue reservation.

# Author contributions

SS wrote the full text of manuscript. SS and PS involved in conceptualization and design of the work. PS contributed in acquisition, analysis and interpretation of data for the work, helped in manuscript writing, and coordinated and supervised the entire team. AS involved in acquisition and interpretation of data and critically reviewed the manuscript. All authors contributed to the article and approved the submitted version.

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# **Conflict of interest**

The authors declare that the research was conducted in the absence of any commercial or financial relationships

that could be construed as a potential conflict of interest.

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## Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/ frsc.2022.951340/full#supplementary-material

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