



Characteristics and source apportionment of winter black carbon aerosols in two Chinese megacities of Xi'an and Hong Kong

Qian Zhang^{1,2} · Zhenxing Shen^{2,3} · Zhi Ning⁴ · Qiyuan Wang³ · Junji Cao³ · Yali Lei² · Jian Sun² · Yaling Zeng² · Dane Westerdahl⁴ · Xin Wang² · Linqing Wang² · Hongmei Xu²

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Abstract

Black carbon (BC) aerosols were observed over Xi'an (XA) and Hong Kong (HK) to better compare its properties and sources in two geographically separate regions in China. High-BC ($7.9 \pm 3.3 \mu\text{g}\cdot\text{m}^{-3}$) and $\text{PM}_{2.5}$ ($182 \pm 80.5 \mu\text{g}\cdot\text{m}^{-3}$) concentrations were observed in XA, and these were much higher than those in HK (BC, $3.2 \pm 0.9 \mu\text{g}\cdot\text{m}^{-3}$; $\text{PM}_{2.5}$, $34.5 \pm 9.3 \mu\text{g}\cdot\text{m}^{-3}$). The contribution of BC to $\text{PM}_{2.5}$ in HK reached 10.7%, which was ~ 1.5 times than that in XA (7.6%). The results emphasized that BC played an important role in HK $\text{PM}_{2.5}$. The diurnal distribution of HK BC was highly correlated with vehicle emissions during the daytime; it peaked during heavy traffic times. Whereas XA BC exhibited flat distribution owing to stable BC sources. It is not markedly driven by traffic patterns. Additionally, the potential source contribution function (PSCF) analysis showed that XA BC mainly originated from local emissions while nearly half of the HK BC originated from distant sources, such as industrial emissions from northeastern regions and ship emissions from marine regions. These anthropogenic BC sources were found to be regional in nature based on multilinear engine (ME-2) analysis. Specifically, the XA BC sources were dominated by three factors: 22.5% from coal burning, 19.6% from biomass burning, and 32.9% from vehicle emissions. In HK, the majority of BC contributions originated from vehicle and ship emissions (78.9%), while only 14.5% and 1.5% originated from coal and biomass burning from residential combustion, as well as industrial and power plants in inland China.

Keywords Black carbon · Urban atmosphere · Potential source contribution function · Multilinear engine · Source identification

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✉ Zhenxing Shen
zxshen@mail.xjtu.edu.cn

¹ School of Environmental & Municipal Engineering, Xi'an University of Architecture and Technology, Xi'an 710055, China

² Department of Environmental Science and Engineering, Xi'an Jiaotong University, Xi'an 710049, China

³ Key Lab of Aerosol Chemistry & Physics, Institute of Earth Environment, Chinese Academy of Sciences, Xi'an, China

⁴ School of Energy and Environment, City University of Hong Kong, Hong Kong, China

Introduction

Black carbon (BC) emissions have caused environmental concerns, contributed to climate change on local, regional, and worldwide scales, and have become a major focus for research (Bond et al. 2013; Ding et al. 2016; Cooke and Wilson 1996; Ramanathan and Carmichael 2008). BC can be used as a primary tracer for the anthropogenic pollution sources of fossil fuel combustion and biomass burning, because it is abundant in the combustion of carbon-based fuels when oxygen is insufficient and can also be produced when adequate oxygen is present in combustion with poorly mixed reactants (Reddy et al. 2002; Cooke and Wilson 1996). WHO (2012) reported that severe BC pollution has also attracted considerable scientific concern because of its effects on public health. In the study of Shindell et al. (2012), the global health benefits of USD 5142 billion from

the reduction of BC were estimated which were far larger than those from CH₄ in the year 2030 due to the implementation of several BC measures. Scientists have conducted many experiments to identify the specific role of BC in environmental problems and have determined that it is a dominant contributor to visibility degradation through light absorption (Lee and Sequeira 2002; Lin et al. 2014; Huang et al. 2012). In general, BC particles absorb visible and infrared wavelengths in the atmosphere and among carbonaceous aerosols are second only to CO₂ in their production of a positive force of +0.2 to +1.1 W·m⁻² (Lloyd and Cackette 2001; Ramanathan and Carmichael 2008). BC radiative forcing values vary among source combustions, such as those of fossil fuel (+0.29 W·m⁻²), biofuel (+0.22 W·m⁻²), and open burning (+0.20 W·m⁻²) (Li et al. 2016). Moreover, BC plays a significant role in severe air pollution; in their studies, both Kirchstetter et al. (2008) and Allen et al. (1999) observed similar and significant linear relationships ($R > 0.98$, $P < 0.001$) between BC and coefficient of haze.

Wang et al. (2014) reconstructed emission inventories using a bottom-up approach based on 64 sources, and identified an increasing trend in total global emissions of BC since 1960 that reached 9000 Gg·year⁻¹ in 2007. Numerous studies have confirmed that the distributions and characteristics of BC differ among regions according to the specific sources of BC. For example, a study determined that approximately 64% of global BC emissions originated from various sources in the open environment, such as burning forests, grasslands, and agricultural residues. Approximately, 60–80% of BC emissions were produced by the residential combustion of coal and biofuels in Asia and Africa, and 70% were generated by fresh and aged diesel combustion in traffic-dominated areas in Europe (Bond et al. 2013; Wang et al. 2014). BC emissions in Asia caused direct radiative forcing three times higher than that in Europe. In China, annual BC emissions have increased constantly since 1960 because of increasing emissions from residential-, industrial-, and motor vehicle-related combustion (Wang et al. 2012a). Scientists modeled the trend of total BC emissions in China from 1949 to 2050, which estimated that the BC emissions would increase to a peak value of 2273 Gg·year⁻¹ in 2041 due to the increase of anthropogenic BC emissions by factors of 1.6–3.6, including motor vehicles, off-road diesel machineries, coal combustions, and industrial productions (Wang et al. 2012b).

Although previous studies have examined temporal and spatial variations in BC concentrations in several individual Chinese urban areas, few studies have observed or comparatively analyzed data from various areas of China with regard to the emission sources (Ding et al. 2016; Pérez et al. 2010; Wang et al. 2015; Zhang et al. 2015). To characterize the distribution and sources of BC in urban atmospheres in China, this study investigated the temporal and spatial distribution of BC in two geographically distinct parts of China,

Xi'an (XA) and Hong Kong (HK), in 2016. To understand the BC sources and transport paths, we modeled the relationship between the concentration of BC and meteorological parameters and determined and compared the transport pathways and possible sources of BC for XA and HK using the potential source contribution function. Finally, an advanced source analysis model of multilinear engine 2 (ME-2) was used to quantify the source contributors of BC in XA and HK.

Methodology

Sampling site

We conducted field observations in two representative sites for two geographically separate regions in China XA and HK to better compare the BC properties and sources (Fig. 1). One was a typical urban near-source roadside site in HK representing the relatively fresh emissions from combustion sources and the other was a typical urban ambient site near downtown of XA, China, which is heavily affected by abundant combustion emissions from local and regional sources. Both sites have been included in our previous investigations:

XA site: The site is located in the southeast area of downtown XA (34° 16' N, 108° 54' E) that is surrounded by complex sources. Residential areas and the campus of Xi'an Jiaotong University are nearby. Two roads with heavy traffic (the South Second Ring and Xingqing Road) include large number of diesel-powered trucks and busses (Shen et al. 2012; Zhang et al. 2015).

HK site: The site is situated about 5 m away from the curb of Lai Chi Kok (LCK) Road in HK (22° 19' N, 114° 9' E), one of the busiest traffic arteries in the city, with average vehicle counts of 5000–6000 per hour and diesel vehicles accounting for nearly 40% of the traffic volume (Cheng et al. 2010; Ning et al. 2013). Moreover, residential buildings of 8–10 stories bound both sides of this site. This topography is typical of the city and results in street canyon effects and suppressed dispersion of on-road emissions.

BC measurement and source identification

Real-time BC measurement was conducted during the sampling periods. The BC concentration was determined using a seven-wavelength Aethalometer-31 (Model-AE31, Magee Scientific Inc., USA). The AE31 flow rate was calibrated prior to deployment in the field and the sampling air flow rate was 5.0 L·min⁻¹. The AE31 was programmed to automatically measure the light attenuation (ATN) at seven wavelengths (370, 470, 520, 590, 660, 880, and 950 nm) in micrograms per cubic meter at 5-min intervals over the sampling period from a location near the PM_{2.5} samplers. The ATN data from

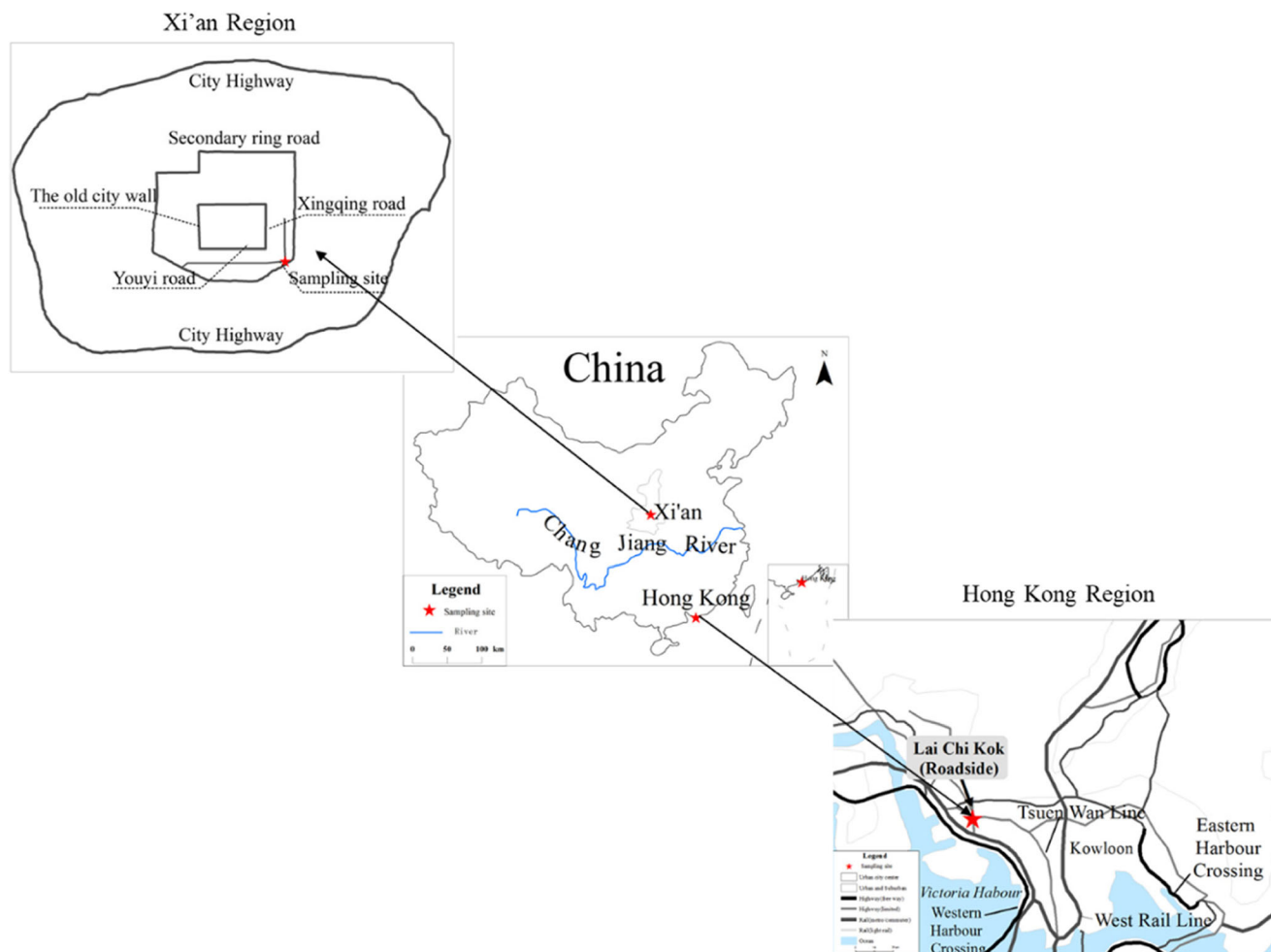


Fig. 1 The location of the sampling site for parallel observations between Xi'an and Hong Kong

the AE31 are converted to BC mass by assuming a fixed BC-specific attenuation coefficient (σ) at 880 nm of $16.6 \text{ m}^2 \cdot \text{g}^{-1}$ (Virkkula et al. 2007). The accuracy of BC data from the Aethalometer is impacted by two factors: non-linear response as loading levels on the filter media increase (loading factor) and light scattering by the fiber filter substrates (Collaud et al. 2010). These factors were considered and corrected as described in a study of Shen et al. (2017).

The light absorption coefficient (b_{abs}), which is the most important parameter for BC determination, can be obtained from AE31 (Zhang et al. 2017). Sandradewi et al. (2008) built the Aethalometer model using b_{abs} and absorption Angstrom exponent (AAE, which indicates the spectral dependence) data to quantify the contributions of two typical BC sources (includes fossil fuel burning (BC_FF) and biomass burning (BC_BB)) to total BC concentrations. Healy et al. (2017) segregated $b_{\text{abs_FF}}$ and $b_{\text{abs_BB}}$ by projecting the absorption at higher wavelengths (880 nm) to lower wavelengths of the spectrum measured by the AE31. The b_{abs} values at 880 nm and 370 nm were assumed to be the sum of $b_{\text{abs_FF}}$ and $b_{\text{abs_BB}}$, respectively. The simple extrapolation method using

an AAE has been described in detail by Healy et al. (2017). We get the following equations:

$$\frac{b_{\text{abs}}(370\text{nm})_{\text{FF}}}{b_{\text{abs}}(880\text{nm})_{\text{FF}}} = \left(\frac{370}{880}\right)^{-(\text{AAE_FF})} \tag{1}$$

$$\frac{b_{\text{abs}}(370\text{nm})_{\text{BB}}}{b_{\text{abs}}(880\text{nm})_{\text{BB}}} = \left(\frac{370}{880}\right)^{-(\text{AAE_BB})} \tag{2}$$

$$b_{\text{abs}}(370\text{nm}) = b_{\text{abs}}(370\text{nm})_{\text{FF}} + b_{\text{abs}}(370\text{nm})_{\text{BB}} \tag{3}$$

$$b_{\text{abs}}(880\text{nm}) = b_{\text{abs}}(880\text{nm})_{\text{FF}} + b_{\text{abs}}(880\text{nm})_{\text{BB}} \tag{4}$$

$$BC_{\text{FF}} = \frac{b_{\text{abs}}(880\text{nm})_{\text{BB}}}{\sigma_{880\text{nm}}} \tag{5}$$

$$BC = BC_{\text{FF}} + BC_{\text{BB}} \tag{6}$$

where $b_{\text{abs}}(\lambda)$ is the absorption coefficient, λ is the wavelength, $b_{\text{abs}}(\lambda)_{\text{FF}}$ a fossil fuel fraction, and $b_{\text{abs}}(\lambda)_{\text{BB}}$ a biomass burning fraction of absorption coefficient. In this equation, b_{abs} is expressed in the unit of Mm^{-1} (or 10^{-6} m^{-1}), while the $\text{AAE_FF} = 0.9$ for fossil fuel and $\text{AAE_BB} = 2.09$ for biomass burning (Zotter et al. 2017). $\sigma_{880\text{nm}}$ here refers to the

attenuation coefficient of BC ($16.6 \text{ m}^2 \cdot \text{g}^{-1}$) at the wavelength of 880 nm.

PM_{2.5} collection and chemical analysis

For parallel sampling, ambient 24-h (10:00 a.m.–10:00 a.m., + 1 day) PM_{2.5} samples were simultaneously collected over XA and HK on Whatman 47 quartz filters (Whatman Inc., Maidstone, UK) using a MiniVol ambient air particulate sampler (BGI Inc., USA) at a flow rate of $5 \text{ L} \cdot \text{min}^{-1}$ from 15 Dec. 2016 to 15 Jan. 2017. The filter samples were weighed three times on a high-precision ($\pm 1 \text{ } \mu\text{g}$) microbalance (ME-5, Sartorius Inc., Germany) to determine PM mass. After weighing, all samples were stored in a freezer at $-20 \text{ } ^\circ\text{C}$ to prevent the evaporation of volatile compounds (Shen et al. 2016).

A 0.5-cm^2 punch of each sample was analyzed for Thermo-EC and OC of PM_{2.5} in this study following the Interagency Monitoring of Protected Visual Environments (IMPROVE) thermal/optical reflectance (TOR) protocol using a DRI Model 2001 Thermal and Optical Carbon Analyzer (Atmoslytic Inc., California, USA). Four OC fractions (OC1, OC2, OC3, and OC4 at $140 \text{ } ^\circ\text{C}$, $280 \text{ } ^\circ\text{C}$, $480 \text{ } ^\circ\text{C}$, and $580 \text{ } ^\circ\text{C}$, respectively, in a helium atmosphere) and three EC fractions (EC1, EC2, and EC3 at $580 \text{ } ^\circ\text{C}$, $740 \text{ } ^\circ\text{C}$, and $840 \text{ } ^\circ\text{C}$, respectively, in a 2% oxygen/98% helium atmosphere) were also determined. During volatilization of organic carbon, part of the organic carbon was converted pyrolytically to EC (this fraction of OC was named as OP) (Chow et al. 2004). Hence, OC is the sum of OC1, OC2, OC3, OC4, and OP, and EC is the sum of EC1, EC2, and EC3 and then minus OP. Additional quality assurance and quality control procedures have been described in detail by Cao et al. (2003). In general, BC and EC were used interchangeably (Jeong et al. 2004). In terms of different analytical methodology, thermal EC and optical BC were determined by TOR analysis and optical attenuation methods (AE31) as mentioned before, respectively. To evaluate the agreement between thermal EC and optical BC concentrations in this study, an inter-comparison was conducted in Fig. S1. Twenty-four-hour average BC data were calculated to match the daily EC samples. Both strong correlations ($R=0.80$ in XA and $R=0.71$ in HK) and appropriate slopes ($S=1.10$ in XA and $S=0.95$ in HK) of the least-squares regression line passing through the origin of the plot, indicating that the concentrations were similar, and therefore, the two techniques produce results demonstrated a very good agreement of the TOR-EC and Optical-BC methods.

The PM_{2.5} water-soluble potassium (K^+) concentrations were determined using a two-step protocol, including extraction of the WS- K^+ from the PM_{2.5} water-soluble components and detection of the WS- K^+ concentration by an ion chromatograph (IC, Dionex 600, Dionex Corp, USA). Descriptions of the pretreatment of PM_{2.5} filters for IC

analysis and IC detection limitation are provided in our earlier studies (Shen et al. 2007; Zhang et al. 2015).

Potential source contribution function

The potential source contribution function (PSCF) can distinguish the different positions of the BC sources and their relative contributions. Based on the statistics of the backward air mass trajectories using the TrajStat software from the open-source GIS component MapWindow GIS ActiveX control (MapWindow open-source team, 2007) (Wang et al. 2009) and meteorological data from the NCEP Global Data Assimilation System (GDAS) ($1^\circ \times 1^\circ$). The trajectory endpoints were 34.62° N and 108.93° E in XA and was 22.25° N and 114.25° E in HK, respectively, with a height of 500 m above ground level (i.e., the potential sources of different grid points can be estimated by Eq. 7 (Ashbaugh 1983)). The PSCF value for each grid point can be calculated as

$$\text{PSCF} = M/N \quad (7)$$

where the PSCF was computed as a ratio of the selected grid points of high-BC events (M) to the total grid points of BC (N). The high-BC events were selected when the sample concentrations at the receptor site are higher than the criterion value (Wang et al. 2016). The PSCF results for the Aethalometer-generated BC source contributions (including BC_BB and BC_FF) were plotted in Fig. 4a–d. The criterion values for ambient BC_BB and BC_FF were chosen for the 75% percentile value for the entire period between XA and HK. Thus, the higher PSCF index in this study corresponds to the greater possible sources of BC_BB and BC_FF (Fleming et al. 2012; Karaca et al. 2009; Petroselli et al. 2018). The geographic area covered by the trajectories was divided into 814 grid cells of 0.5° latitude \times 0.5° longitude in XA and 436 grid cells with the same resolution in HK.

The ME-2

Positive matrix factorization (PMF) is a widely used source apportionment model (Jaekels et al. 2007; Kim et al. 2003; Xu et al. 2016a). This model solves a non-negativity constrained bilinear mass balance model using a weighted explicit least-squares equation (Paatero 1997). The principle of this model was listed in the following Eq. (8):

$$x_{ij} = \sum_{k=1}^p g_{i,k} f_{kj} + e_{ij} \quad (8)$$

where x_{ij} represents the j th species concentration measured in the i th sample, which can be decomposed into the i^*k matrix of g and k^*j matrix of f . The subscript i corresponds to the number of samples, j to the number of species, and p to the appropriate number of the sources. e_{ij} represents to i^*j matrix of residuals.

However, Paatero et al. (2002) found that the PMF model solution was not unique due to rotational ambiguity. Thus, the algorithm of ME-2 was developed to tackle PMF limitation when analyzing the structure of the energy sources and other environmental parameters. The key point of ME-2 was to minimize the objective function Q using a structural equation (Amato et al. 2009; Kuo et al. 2014; Paatero 1999):

$$Q = \sum_{i=1}^m \sum_{j=1}^n \left(\frac{e_{ij}}{\sigma_{ij}} \right)^2 \tag{9}$$

where σ_{ij} is the measurement uncertainties of the j th species concentration in the i th sample, n is the number of samples, and m is the number of species. The calculation of σ_{ij} was described in detail in Kuo et al. (2014) study.

Results and discussion

BC levels and relationship to PM_{2.5} mass concentration

The time-resolved (1 h) variations of online PM_{2.5} and BC at the two sampling sites and the BC/PM_{2.5} ratio during sampling days were shown in Fig. 2. Large differences in PM_{2.5} and BC mass concentration were observed between XA and HK. Moreover, the XA site had higher levels of BC and PM_{2.5} mass loadings than the HK site. During sampling days (Table 1), XA daily PM_{2.5} levels varied from 19 to 635 μg·m⁻³, with an average of 182 ± 80.5 μg·m⁻³. Additionally, XA

BC concentration averaged 7.9 ± 3.3 μg·m⁻³, and ranged from 0.8 to 25.3 μg·m⁻³. The daily and diurnal trend between PM_{2.5} and BC at XA was quite similar (Fig. 2). Specifically, it peaked during two heavily polluted periods of 18–21 Dec. 2016 and 30 Dec. 2016–6 Jan. 2017, when the meteorological conditions were stable. However, much lower values of PM_{2.5} and BC were observed (34.5 ± 9.3 and 3.2 ± 0.9 μg·m⁻³) in HK during the measurement periods. In comparison, the daily HK PM_{2.5} and BC concentrations showed narrow concentration distributions, and both closely tracked the diurnal pattern of vehicle emissions, peaking during morning (7:00–10:00) and evening (16:00–18:00) rush hours, respectively (Fig. 2).

On average, the contribution of BC to PM_{2.5} in HK was 10.7%, which was ~1.5 times that in XA (7.6%). Interestingly, lower XA BC/PM_{2.5} ratios were observed on heavier polluted days, such as 2.9% on 21 Dec. 2016. In contrast, relatively higher XA BC/PM_{2.5} ratios occurred during light-polluted periods, such as 22 Dec. (23%) and 27 Dec. (18%). These phenomena indicated that XA BC presented at fairly constant levels as a primary pollutant during sampling periods and was a major constituent of PM_{2.5} during light-polluted periods. In HK, the relative high BC/PM_{2.5} was observed during clear (on 27 Dec., 61.4% with low-PM_{2.5} value) and polluted periods (on 21 Dec., 20.7% with high-PM_{2.5} value), indicating that BC was an important component in HK PM_{2.5}.

The diurnal patterns of XA and HK BC were divided into three specific time periods: including daytime (6:00–18:00), nighttime (18:00–6:00), and peak traffic times (6:00–10:00

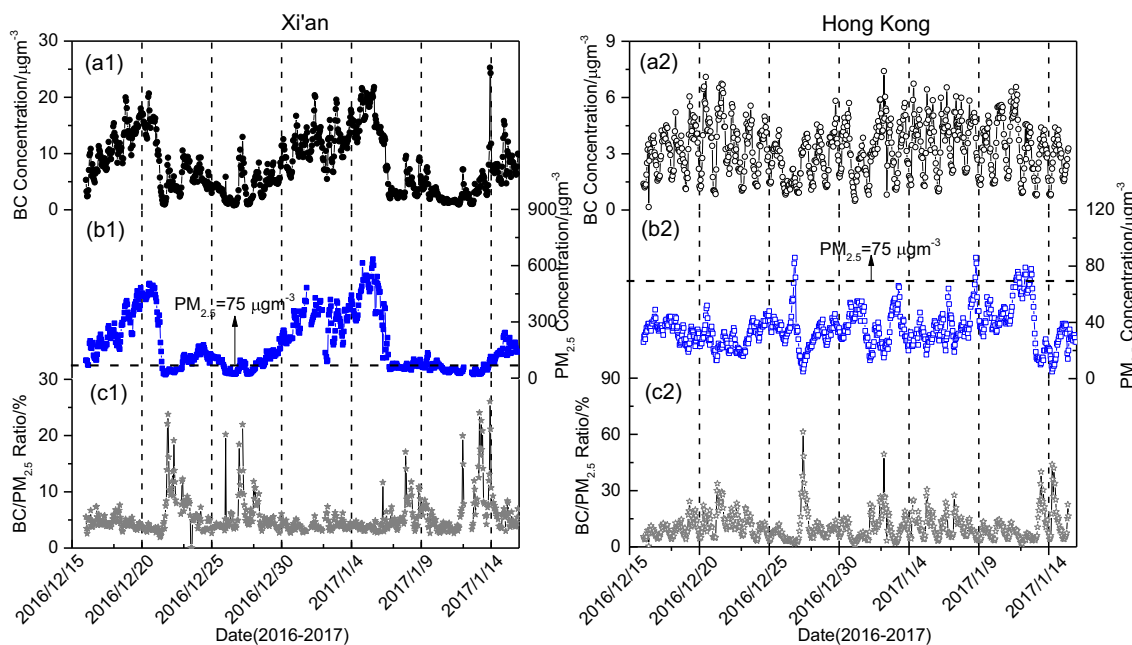


Fig. 2 Time-series plots of hourly averaged (a) BC concentrations, (b) PM_{2.5} mass concentrations, and (c) BC/PM_{2.5} ratios between Xi'an and Hong Kong. The horizontal black dashed line shows the grade 2 standard

value for daily PM_{2.5} concentration (75 μg m⁻³) promulgated as the China National Ambient Air Quality Standard (GB 3095–2012)

Table 1 Concentrations for the major chemical species in PM_{2.5} between Xi'an and Hong Kong

	Xi'an (<i>n</i> = 30)		Hong Kong (<i>n</i> = 30)	
	Mass, $\mu\text{g}\cdot\text{m}^{-3}$		Mass, $\mu\text{g}\cdot\text{m}^{-3}$	
	Average	SD	Average	SD
PM _{2.5}	182.0	80.5	34.5	9.3
BC	8.0	3.3	3.2	0.9
K ⁺	2.6	2.0	0.4	0.2
OC1	2.1	1.5	0.4	0.2
OC2	5.5	3.1	1.4	0.3
OC3	7.7	4.4	1.7	0.6
OC4	5.0	2.6	0.7	0.1
EC1	16.6	13.2	5.9	1.3
EC2	0.4	0.1	0.3	0.0
EC3	0.0	0.0	0.0	0.0
OP2	7.2	7.0	0.9	0.6

n sample numbers, *SD* standard deviation

and 17:00–21:00) (as shown in Fig. 3). In XA (Fig. 3a), similar values of BC can be found during different time periods with slightly higher values at night: nighttime ($7.2 \pm 3.0 \mu\text{g}\cdot\text{m}^{-3}$) > peak traffic ($6.1 \pm 2.8 \mu\text{g}\cdot\text{m}^{-3}$) and daytime ($6.1 \pm 2.9 \mu\text{g}\cdot\text{m}^{-3}$). These phenomena suggested that the XA BC was relatively stable across different time periods. However, the relative high nighttime BC values in XA emphasized the contribution of diesel trucks in construction sites, which were allowed work only in the evening (Xu et al. 2016b). As shown in Fig. 3b, HK BC during all sampling days was nearly three-fold lower than in XA. Unlike the XA BC pattern, the HK BC

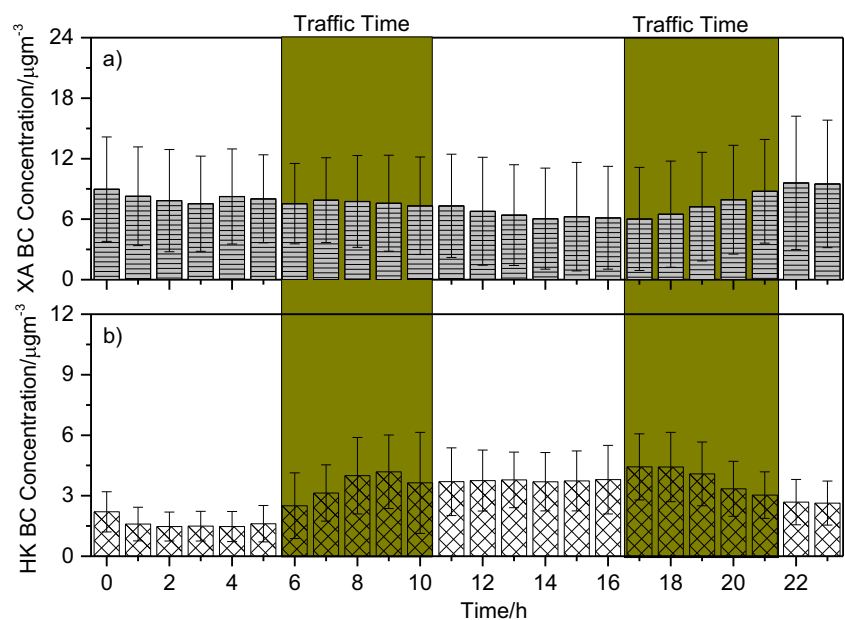
displayed distinct levels during different sampling periods. For example, the mean values of HK BC in daytime and peak traffic times were 3.8 ± 1.1 and $3.7 \pm 1.2 \mu\text{g}\cdot\text{m}^{-3}$, which were ~ 2.2 times higher than the nighttime HK BC value ($1.6 \pm 0.4 \mu\text{g}\cdot\text{m}^{-3}$). It indicated that traffic emissions had a significant effect on their ambient BC concentration. Specifically, much wider ranges were apparent during peak traffic times ($2.5 \mu\text{g}\cdot\text{m}^{-3}$ (minimum) and $4.4 \mu\text{g}\cdot\text{m}^{-3}$ (maximum)), while the changes in BC distribution during non-traffic time at night were stable, mainly due to the lower traffic density.

Potential sources of BC between XA and HK

Using the results of data from procedures performed in the section “BC measurement and source identification,” the sources of ambient BC in this study can be divide into two fractions, including fossil fuel combustion (i.e., vehicle exhaust and other industrial activities) and biomass burning (Cao et al. 2006a; Li et al. 2016; VanderWerf et al. 2006). Based on Eqs. 1–6 results, the high-BC_FF fractions (> 70%) were calculated in XA and HK, indicating that fossil fuel combustion was the dominant contributor to ambient BC at sampling site. The relatively high BC_BB of 25.8% was observed in XA during our sampling periods. Conversely, the lowest HK BC_BB fraction (16.4%) was obtained in HK with minimal biomass burning contributions.

In XA, high-criterion values of BC_FF (refer to the 75% of all XA BC_FF data, $> 3.6 \mu\text{g}\cdot\text{m}^{-3}$) and BC_BB ($> 1.2 \mu\text{g}\cdot\text{m}^{-3}$) were used to improve the resolution of PSCF source identifications. As shown in Fig. 4a, b, the XA PSCF results with 500-m height were slightly different between BC_FF and BC_BB. The XA sampling site was surrounded by the region with high-PSCF (0.8–1) values, emphasizing that the local

Fig. 3 The diurnal variations of BC between **a** Xi'an and **b** Hong Kong (The red dots represent the diurnal BC range and the error bars represent one standard deviation of BC concentration)



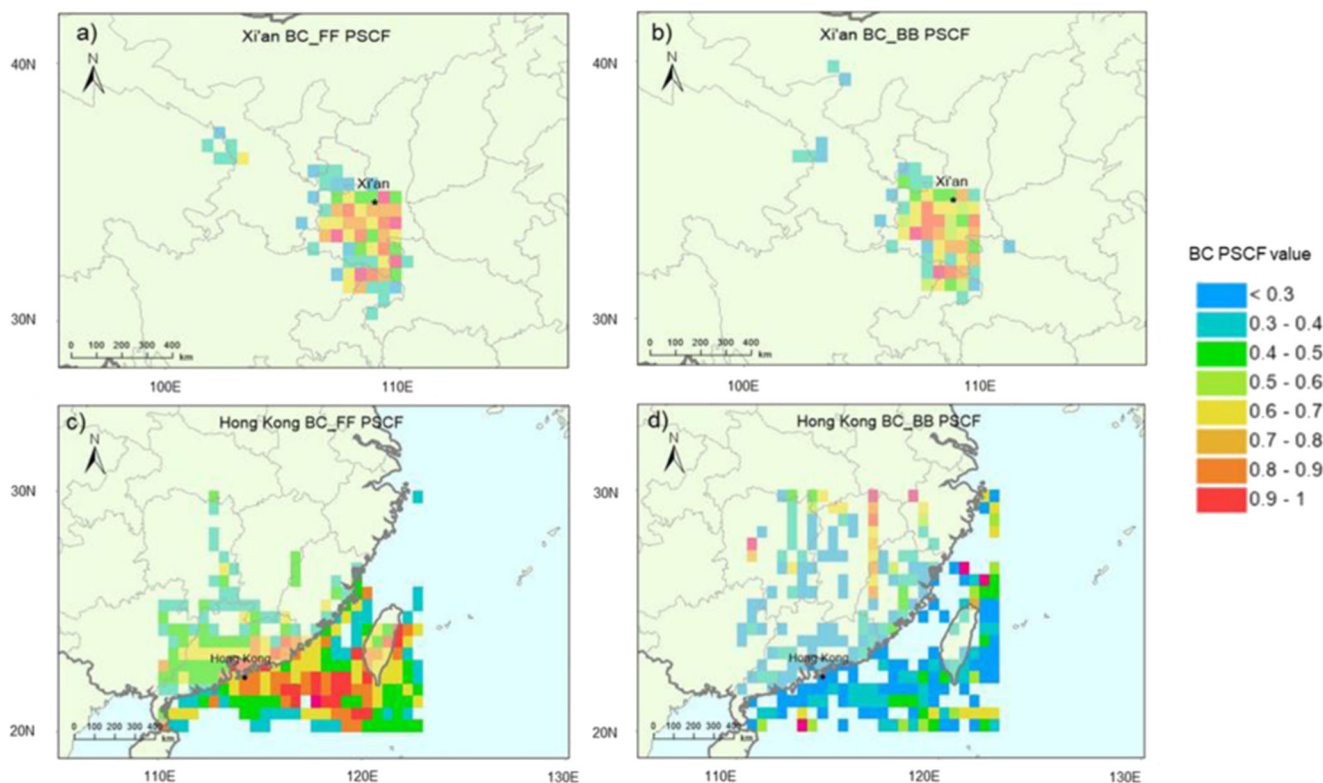


Fig. 4 Seventy-fifth percentile PSCF probabilities of Aethalometer-generated BC fractions computed using respectively **a** Xi'an BC_FF, **b** Xi'an BC_BB, **c** Hong Kong BC_FF, and **d** Hong Kong BC_BB

trajectories reaching the sites during sampling periods. The trajLevel smoothing was disabled to better identify the originating trajectories

emissions play an important role in both BC_FF and BC_BB loadings. In addition, the highest BC_BB PSCF values of 0.7–0.9 were observed in the southwest XA. These areas include the suburbs, where there is a high-amount biomass burning (Sun et al. 2017).

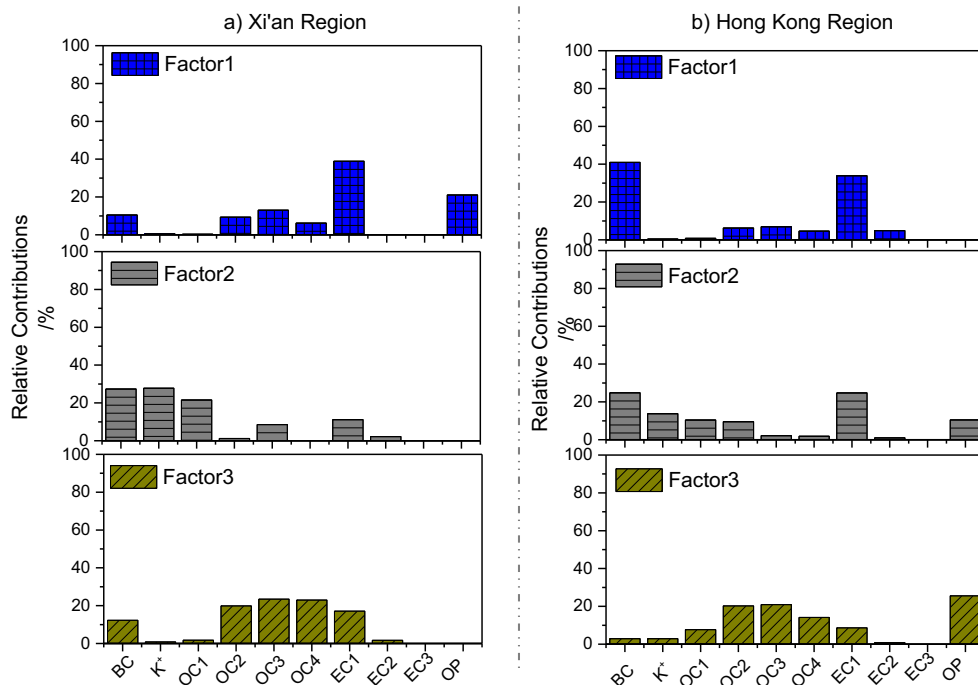
As shown in Fig. 4c, d, the range of important potential source region for BC observed in HK was wider than those in XA at the height of 500 m. The values of $1.4 \mu\text{g}\cdot\text{m}^{-3}$ and $0.5 \mu\text{g}\cdot\text{m}^{-3}$ were calculated as criterion values for HK BC_FF and BC_BB PSCF analysis, respectively. High-HK BC_FF PSCF range (0.6–1.0) was addressed, of which area was regarded as short-range flow from the northeast of HK. This area includes the coastal cities of Xiamen, Shantou, and Shanwei, which are known to have high and numerous industrial fossil fuel BC sources (Wang et al. 2016; Zhang et al. 2009). It should also be noted that in addition to the influences from these cities, there are possible maritime contributions to BC_FF by heavy commercial shipping traffic in coastal waters (Lack and Corbett 2012). The highest HK BC_FF PSCF regions observed in the eastern direction of HK. These heavily polluted BC_FF mass clusters generally originated from Taiwan at a high altitude, then mixed down when traveling above the sea. Further, both west and NW directions were the important potential source regions for HK BC_FF, verifying that heating emissions (i.e., coal combustion) from northern

China also contribute to HK BC_FF. As concluded in Fig. 4d, the concentration of biomass burning to BC was limited due to low-PSCF BC_BB values (0.2–0.3). A few areas with high-PSCF ranges of BC_BB (greater than 0.7) were observed in the northern directions of HK possibly because the rural areas in Jiangxi and Fujian province emissions of anthropogenic contaminants (wood combustion/biomass burning) and those pollutants could be carried by north-prevailing winds to HK BC_BB.

BC source apportionment

As mentioned above, the primary sources contributed significantly to the BC concentration between XA and HK regions. To assess the contributions from these sources, the typical source markers are believed to be of low volatility and reasonably stable in the atmosphere under wintertime conditions for use as fitting species. The concentration and relative standard deviation data of water-soluble non-organic ion (K^+), eight thermal carbonaceous fractions (i.e., OC1, OC2, OC3, OC4, EC1, EC2, EC3, and OP), and BC were listed in Table 1 and input into the ME-2 software. After analysis, three anthropogenic sources of BC over sampling sites were selected: (1) coal emissions, (2) motor vehicle emissions, and (3) biomass burning.

Fig. 5 Comparisons of fractional contributions of the factors retrieved by ME-2 to the primary PM_{2.5}'s markers between **a** Xi'an and **b** Hong Kong

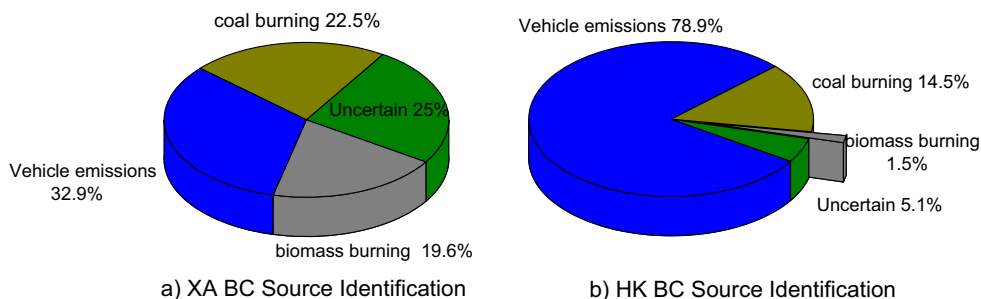


In Fig. 5a, the factors of XA BC can be identified as follows: (1) factor 1 had high loadings of OC2 (9.3%), OC3 (13.0%), OC4 (6.2%), and EC1 (38.9%), and it was identified as vehicle source because these species are typically emitted by motor vehicles (Cao et al. 2005; Chow et al. 2004). (2) Factor 2 representing open or smoldering burns of various types of wood or maize straw burning contained an abundance of water-soluble K⁺, marker for vegetative burning (Cheng et al. 2013; Cheng et al. 2014; Shen et al. 2007), at the level of 27.8%. Sun et al. (2017) have pointed out that smoldering straw burning in winter in suburban areas of XA produces more OC1, and this could explain a larger OC1 fraction (21.6%) in factor 2. (3) Factor 3 in this study was highly loaded with OC2, OC3, and OC4, and it was identified as coal burning because these species are typically enriched in coal-fired boiler and residential stoves burning coal samples (Cao et al. 2005; Chow et al. 2004). The results of Primary-HK PM_{2.5} were also summarized in Fig. 5b. The proportions of EC1 + OC2 + OC3 and

OC4 + EC2 were high in factor 1 in HK, which appear to represent gasoline and diesel exhaust, respectively (Cao et al. 2006b). Similar to XA factor 2, high loadings of water-soluble K⁺ and OC1 indicated the biomass burning (Chow et al. 2005). Also, pyrolyzed OC (OP) was reported to be a slightly high in factor 2, which has to be proven to be associated with water-soluble OC (Ni et al. 2015; Yang and Yu 2002) and was mainly emitted from smoldering, straw-residue fires (Sun et al. 2017; Sun et al. 2018). In HK PM_{2.5}, factor 3 was highly loaded with OC2, OC3, and OC4, which appears to represent coal burning.

Based on ME-2 analysis, the source contributions to XA BC were assessed in Fig. 6a. In XA, vehicle emissions were the largest source of BC, accounting for 32.9% of the BC mass. This may have been induced by the rapidly increased vehicle traffic and energy consumption during the past several decades in XA. Moreover, coal combustion during winter was the second largest contributor of BC, accounting for 22.5%. Further, 19.6% of XA BC originated from biomass burning.

Fig. 6 Source contributions to **a** XA and **b** HK BC



The majority of biomass burning in this area consisted of traditional maize straw burning during winter to heat rural residences. Indeed, maize straw moldering in “Heated Kang” leads to a great deal of rural and urban air pollution (Sun et al. 2017). As shown in Fig. 6b, vehicle emissions accounted for the largest fraction of BC (78.9%) in HK. However, low but non-neglected fractions of biomass (1.5%) and coal burning (14.5%) were observed in HK BC, which can be attributed to transport the mainland that would bring these emissions to HK. These conclusions were also supported by the HK BC transport pathways from northern China.

Conclusion

The results showed that the mean concentration of BC was $7.9 \mu\text{g}\cdot\text{m}^{-3}$ in XA and was $3.2 \mu\text{g}\cdot\text{m}^{-3}$ in HK during the sampling periods. In XA, the highest BC concentration was $25.3 \mu\text{g}\cdot\text{m}^{-3}$, while the lowest value was $0.8 \mu\text{g}\cdot\text{m}^{-3}$, indicating that XA BC varied greatly on a daily scale. In contrast, the daily HK BC concentration distribution showed much lower variations. For the temporal variations of BC, stable and high-BC levels were obtained in XA compared to those in HK. However, the distribution of HK BC was more sensitive to traffic flow. PSCF analysis showed that XA BC was mainly influenced by local anthropogenic sources while HK BC was heavily influenced by transport of emissions from remote coastal cities and ocean ships. We quantified the BC sources according to the relationships among BC, $\text{PM}_{2.5}$ chemical compositions, and various sources and found that the main sources of XA BC were biomass burning, coal burning, and mobile exhaust emissions, while the HK BC was mainly originated from vehicle emissions.

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