Chemical composition, sources and formation mechanism of urban PM$_{2.5}$ in Southwest China: A case study at the beginning of 2023

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Abstract. Despite significant improvements in air quality in recent years, the Sichuan Basin (SCB) is still facing frequent haze pollution in winter, and the causes of severe haze formation have not yet been fully investigated. In this study, the chemical components of PM$_{2.5}$ in a typical pollution period at the beginning of 2023 in Chengdu, a megacity in the SCB, were characterized by bulk-chemical and single-particle analysis, and the PM$_{2.5}$ sources and formation mechanism of pollution were analyzed. The average mass concentration of PM$_{2.5}$ during the study period was 95.6±28.7 μg m^{-3}. Organic matter (OM) was the most abundant component (35.3%), followed by nitrate (22.0%), sulfate (9.2%) and ammonium (7.8%). The individual aerosol particles were classified into five categories: mineral, OM, secondary inorganic aerosol (SIA), soot and fly ash/metal particles, and most of them were in the state of being internally mixed. The entire observation period could be divided into two non-pollution periods (NP-1 and NP-2) and two haze periods (Haze-1 and Haze-2). With the evolution of pollution, the bulk-chemical and single-particle analysis exhibited similar characteristics, suggesting that Haze-1 was mainly caused by pollutants related to fossil fuel combustion, especially local mobile sources, while Haze-2 was triggered by the rapidly increasing secondary pollutants, which mainly came from regional transmission. The PM$_{2.5}$ sources included dust (8.5%), biomass burning (3.5%), coal combustion (15.4%), industrial processes (6.5%), vehicular emissions (25.6%) and secondary sources (40.5%). Analysis of WRF-Chem model results showed that the average contributions of local sources and regional transmission to pollution in Chengdu were the same (50% vs 50%). In addition, the source composition and WRF-Chem simulation results in different periods confirmed our analysis of the formation mechanisms of the two haze events. This study confirms that further significant reductions in PM$_{2.5}$ in Chengdu are still needed, and more effective policies for local emissions reduction or joint prevention and control of regional air pollution are necessary in the future.

1 Introduction

In the past few decades, large quantities of pollutants have been emitted during the rapid urbanization, socioeconomic development and associated increase in motorized vehicles in China, which have caused frequent haze events, particularly for some of the highly industrialized and densely populated regions, such as the North China Plain (NCP), Pearl River Delta (PRD), Yangtze River Delta (YRD), Fenwei Plain (FWP) and Sichuan Basin (SCB) (Zhang et al., 2017b; Ji et al., 2014; Liu et al., 2016; Zhu et al., 2016; An et al., 2019; Huang et al., 2014; Xu et al., 2016; Zhang et al., 2015; Wang et al., 2018b). $PM_{2.5}$ (i.e., particulate matter with an aerodynamic diameter less than 2.5 μm) is the most important species that causes haze, and comprises a complex mixture of species either emitted directly into the atmosphere (primary) or produced in the air via gas-to-particle conversion (secondary). Many studies have pointed out that elevated levels of $PM_{2.5}$ can reduce visibility, adversely affect human health and ecosystems, and influence climate change directly by absorbing and reflecting solar radiation and indirectly by modifying cloud formation and properties (Pöschl, 2005; Seinfeld and Pandis, 2006; Group, 2016).

Accurate analysis of $PM_{2.5}$ sources and clarification of pollution formation mechanisms are considered important prerequisites for formulating effective science-based pollution reduction policies (Huang et al., 2017; Wang et al., 2014; Zhang et al., 2020a; Wang et al., 2018a; Zhang et al., 2020b). Therefore, much research on these scientific issues has been conducted, with extremely valuable results obtained. For example, it has been noted that stagnant meteorological conditions (e.g., low wind speed (WS), high relative humidity (RH) and a shallow boundary layer), primary emissions (e.g., industry, households and vehicular emissions), secondary formation (e.g., homogeneous or heterogeneous reactions) and regional air transport can initiate the rapid formation and persistent evolution of haze episodes in China (Wang et al., 2014; Huang et al., 2014; Song et al., 2022; Zhang et al., 2020b; Zhang et al., 2015). Moreover, the two-way feedback between the accumulation of air pollutants and depression of the atmospheric boundary layer can also aggravate haze pollution (An et al., 2019). The results of these studies have helped guide the formulation of China's air quality improvement policies in recent years, such as the "Atmospheric Pollution Prevention and Control Action Plan (APPCAP)" during 2013–2017 and the "Three-year Action Plan to Win the Blue Sky Defense War (BSDW)" during 2018–2020 (Geng et al., 2019; Huang et al., 2014; Huang et al., 2021b; Wang et al., 2022a), and eventually led to a reduction in $PM_{2.5}$ mass concentrations in various regions across China. For example, the annual mean $PM_{2.5}$ mass concentration in China and its three key polluted areas, namely the Beijing-Tianjin-Hebei (BTH) and its surrounding areas, YRD and FWP, has decreased from 39, 60, 44 and 58 μg m^{-3} in 2018 to 29, 44, 31 and 46 μg m^{-3} in 2022, respectively. Meanwhile, the concentration of SO_2, one of the important gaseous precursors of $PM_{2.5}$, has decreased from 14, 20, 11 and 24 μg m^{-3} to 9, 10, 7 and 9 μg m^{-3}, respectively (https://www.mee.gov.cn/hjzl/sthjzk/zghjzkgb/, last access: 20 January 2024).

Analyzing the sources and formation mechanisms of $PM_{2.5}$ pollution is intrinsically linked to its physicochemical

characteristics, such as the chemical composition, particle size distribution and mixing state, and a variety of methods have been used in this regard. Among these methods, bulk-chemical and single-particle analysis are two important methods used currently, which can characterize $PM_{2.5}$ from different perspectives. Bulk-chemical analysis methods, such as filter sampling or using instruments like an aerosol mass spectrometer, can accurately determine the mass concentration of $PM_{2.5}$ and its chemical components (e.g., organic matter (OM), inorganic components and metals) (Zhang et al., 2014; Wang et al., 2022a; Xu et al., 2018). Since the air quality standard is based on the mass concentration of pollutants, these quantitative measurements can be directly related to the evaluation of air quality and play a vital role in the air quality improvement process. However, bulk-chemical analysis methods provide an overall analysis of the $PM_{2.5}$ samples collected and therefore miss some critical microscopic particle information such as their morphology and mixing state, which is important for simulating and evaluating the impacts of $PM_{2.5}$ on climate and human health. Thinking specifically about the mixing state of $PM_{2.5}$, a change in it may cause pronounced changes to its secondary effects (such as optical properties, health effects, hygroscopicity or cloud condensation nuclei activity), even contrary to its initial state (Liu et al., 2021). For example, Zhang et al. (2008) found that coating with sulfuric acid and subsequent hygroscopic growth led to a tenfold increase in the light-scattering coefficient of black carbon (BC) particles, and a near twofold increase in the light absorption coefficient at a RH of 80%, as compared to uncoated BC particles. Fortunately, this microscopic information can be obtained by some single-particle analysis methods, such as the aerosol time-of-flight mass spectrometer, single particle aerosol mass spectrometer, transmission electron microscopy (TEM) or nanoscale secondary ion mass spectrometry (Zhang et al., 2020b; Li and Shao, 2009; Li et al., 2016; Liu et al., 2021). Due to the complementarity of the bulk-chemical and single-particle analysis methods in the determination of the physicochemical characteristics of $PM_{2.5}$, an increasing number of studies have combined these two methods to study haze processes. Doing so provides more detailed information on the evolution, formation mechanisms and sources of $PM_{2.5}$ pollution (Zhang et al., 2020b; Zhang et al., 2021a). For example, Zhang et al. (2020b) integrated filter sampling and TEM methods to investigate the formation mechanisms of two types of haze processes in northeast China and found that one type of haze process was mainly induced by the accumulation of primary OM and deteriorated by secondary aerosol formation, while the other type was caused by the long-range transport of agricultural biomass burning emissions.

Across the different regions or cities of China, haze formation mechanisms will differ because of the different characteristics of emissions and meteorological conditions (Wang et al., 2021). The SCB, located in southwest China, is not only one of China's most economically developed and industrialized regions, but is the area that most frequently experiences haze events. Chengdu is the largest city in the SCB, with a population of well over 20 million. Meanwhile, Chengdu is the city with the highest number of motor vehicles in China (over 6 million, https://www.mps.gov.cn/n2254098/n4904352/c9244719/content.html, last access: 20 January 2024). Topographically, Chengdu is located in the west part of the SCB, which is surrounded by the Qinghai–Tibet Plateau, Yunnan–Guizhou Plateau,

Qinling–Daba Mountains and Wushan Mountains in the west, south, north and east, respectively (Peng et al., 2020). Air pollution is a serious issue for this city, presumably due to its large amount of pollutant emissions, unfavorable atmospheric diffusion conditions and relatively high humidity (Chen et al., 2022; Huang et al., 2018; Liao et al., 2017; Wang et al., 2018a). Although the concentration of $PM_{2.5}$ had reduced to 39.8 $\mu g\ m^{-3}$ in 2021, it still did not meet the secondary grade of the Chinese National Ambient Air Quality Standard (CNAAQS; annual average of 35 $\mu g\ m^{-3}$), and was eight times the World Health Organization (WHO) guideline value (annual average of 5 $\mu g\ m^{-3}$). At the same time, heavy haze pollution still occurs frequently in winter in Chengdu, which has a serious impact on the daily lives of local residents. Despite numerous studies having used multiple methods to investigate the physical, chemical and seasonal characteristics of $PM_{2.5}$ during haze processes in Chengdu (Chen et al., 2022; Huang et al., 2018; Huang et al., 2021a; Tao et al., 2014; Wang et al., 2018a), our knowledge of its sources, evolutionary processes and formation mechanisms is still incomplete. At the same time, recent research found that, with the reduction in pollution, $PM_{2.5}$ in China has shown many new features, such as a higher nitrate contribution, enhanced atmospheric oxidizing capability and a stronger secondary source contribution (Feng et al., 2021; Geng et al., 2019; Huang et al., 2021b; Song et al., 2022). This means that the formation mechanism of haze pollution in Chengdu may also be different from previous reports.

At the beginning of 2023, Chengdu experienced several severe haze events. The longest pollution process lasted for 12 days, and the highest daily average of $PM_{2.5}$ mass concentration reached 156 $\mu g\ m^{-3}$, which is 2.1 times the CNAAQS (daily average of 75 $\mu g\ m^{-3}$). Meanwhile, the proportion of mild and more severe pollution days in January and February reached 37.3%. So far, the sources, evolutionary processes and formation mechanisms of these haze events remain unclear. Since the development of effective air pollution control policies relies on such knowledge, in-depth research on these heavy haze events is urgently needed. Accordingly, in this study, a continuous observation campaign at the beginning of 2023 was carried out in the field. The formation mechanisms of two haze events were analyzed based on bulk-chemical and single-particle methods as well as air quality model simulations. Here, we report (1) the mass concentration of $PM_{2.5}$ and its chemical composition measured by bulk-chemical analysis; (2) the number composition of particulate matter and its mixing state measured by the single-particle method (i.e., TEM); and (3) the formation mechanisms of the two haze events by analyzing them via a combination of chemical component and source apportionment results along with model simulations. This case study may provide valuable information for understanding the formation mechanism of haze in this megacity, and even in the broader SCB area, which can then serve as transferrable knowledge to help the government in adopting a scientific approach to forecasting and eliminating the occurrence of haze events in China.

2 Materials and methods

2.1 Observational site

The field campaign was performed at a Air Quality Super Observatory, which is located in Qingyang District in the center of Chengdu (30.65° N, 104.03° E). Sampling was conducted on the roof of a building (approximately 25 m above the ground) from 26 January to 7 February 2023. The site has no surrounding tall buildings within 200 m and is affected by multiple local emissions, including nearby shopping malls, parks, restaurants, traffic and a variety of residential sources. Thus, the site is representative of a typical urban environment in Chengdu.

2.2 Aerosol chemical components, air pollutants and meteorological parameters

The mass concentrations of the main chemical components of $PM_{2.5}$ (i.e., carbonaceous components, water-soluble inorganic ions and elements) were measured. The carbonaceous components, i.e., organic carbon (OC) and elemental carbon (EC), were measured with a semi-continuous OC/EC analyzer (Model 4, Sunset Laboratory, USA). The air was drawn through two quartz-fiber filters packed together with a flow rate of 8 L min^{-1}, and $PM_{2.5}$ was collected onto a sampling spot of 1.31 cm^2. The collected sample was subsequently analyzed by the thermal–optical method. The cations (Na^+, NH_4^+, K^+, Mg^{2+} and Ca^{2+}) and anions (Cl^-, NO_3^- and SO_4^{2-}) were measured with an In-situ Gas and Aerosol Composition Monitor (IGAC, Model S-611, Fortelice International Co., China), which is a semicontinuous monitor that separates gases and aerosols into liquid effluent for online chemical analysis at an hourly temporal resolution. The IGAC system mainly consists of three components, including a wet annular denuder, an aerosol collector and two ion chromatography systems. Air samples were pumped into the system at a flow rate of 16.7 L min^{-1}. Gaseous and aerosol samples were alternately collected, evacuated and analyzed with a temporal resolution of 30 min. The elements (K, Al, Si, Ca, Ti, V, Cr, Mn, Fe, Co, Ni, Cu, Zn, As, Cd, Ba and Pb) were monitored by an Xact 625 Ambient Metals Monitor (Cooper Environmental Services LLC, USA). The ambient air was sampled on a Teflon filter tape through a $PM_{2.5}$ cyclone inlet at a flow rate of 16.7 L min^{-1}. Then, the sample was automatically analyzed by nondestructive energy-dispersive X-ray fluorescence to determine the mass of metals.

The hourly mass concentrations of several air pollutants ($PM_{2.5}$, PM_{10}, CO, SO_2, O_3 and CO) were downloaded from the website of the China National Environmental Monitoring Centre (http://www.cnemc.cn/, last access: 20 January 2024). Meteorological parameters, including air temperature (T), RH, WS, wind direction (WD) and visibility, were obtained from the meteorological station (WS600-UMB, Lufft, Germany) of the Sichuan Academy of Eco-Environmental Sciences, approximately 3.5 km away from the air quality observation station.

In addition, in order to analyze the interannual evolution of pollution in Chengdu and its pollution level in China, we also compared the main meteorological parameters (T, RH and WS, downloaded from https://www.timeanddate.com/, last access:

20 January 2024) and pollutants ($PM_{2.5}$, CO, SO_2, O_3 and CO, downloaded from http://www.cnemc.cn/, last access: 20 January 2024) observed in the same time period as this study in 2015 and 2018 in Chengdu and in 2023 in some typical cities in various regions of China, including Beijing (representing the NCP), Shanghai (YRD), Guangzhou (PRD) and Xi'an (FWP) (Table S1). Unless otherwise specified, all online observation results in this paper are presented at a 1 h resolution, and expressed in Beijing standard time, which is 8 h ahead of coordinated universal time.

2.3 Single particle aerosol collection and analysis

Individual aerosol particles were collected onto copper TEM grids coated with carbon film (carbon type-B, 300-mesh copper; Tianld Co., China) using a DKL-2 sampler (Genstar Electronic Technology Co., Ltd., China) with a single-stage cascade impactor equipped with a 0.5 mm diameter jet nozzle at a flow rate of 1.0 L min^{-1} in four periods (two non-pollution periods and two haze periods; see section 3.1.1). Sampling times varied from 30 s to 3 min, depending on the particle loading as estimated from the $PM_{2.5}$ mass concentration. The collection efficiency of the impactor is 50% for particles with an aerodynamic diameter of 0.1 mm and a density of 2 g cm^{-3} (Li and Shao, 2009; Marple et al., 1993). Individual particle samples were placed in a clean, airtight container with controlled T (25 °C) and RH (20 ± 3%) before being analyzed via TEM.

Individual aerosol particle samples were analyzed by a TEM at 200 kV accelerating voltage (JEM-2100, JEOL Ltd., Japan) equipped with an energy-dispersive X-ray spectrometer (EDS, INCA X-MaxN 80T, Oxford Instruments, United Kingdom). The morphology and mixing state of the aerosol particles were determined by TEM, while the EDS can detect elements with atomic weights corresponding to C and above. Cu was not quantified because the Cu grids would have led to interferences. Detailed information on individual particle analysis can be found in previous studies (Li et al., 2016; Deng et al., 2021; Zhang et al., 2021b). Ultimately, a total of 1325, 1159, 995 and 1870 particles in four periods with a diameter < 2.5 μm were analyzed via TEM-EDS.

2.4 Data analysis

2.4.1 Chemical mass closure

According to previous studies (Huang et al., 2017; Zhan et al., 2023), the chemically reconstructed $PM_{2.5}$ mass (PM_{chem}) was calculated as comprised of eight categories, which can be expressed as follows:

$$[PM_{chem}]=[OM]+[EC]+[Cl^-]+[NO_3^-]+[SO_4^{2-}]+[NH_4^+]+[Mineral\ dust]+[Trace\ metals] \tag{1}$$

In estimating OM, an OC to OM conversion factor of 1.6 was adopted for the aerosols at urban sites (Turpin and Lim, 2001). The calculation of mineral dust was performed on the basis of crustal element oxides. The Ti content was very low (0.01 μg

m^{-3}). Thus, eliminating the Ti content has an almost negligible influence on the estimation of the mineral dust. Mineral dust was calculated as follows:

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$$[\text{Mineral dust}]=2.14\times[\text{Si}]+1.89\times[\text{Al}]+1.40\times[\text{Ca}]+1.58\times[\text{Mn}]+1.43\times[\text{Fe}]+1.21\times[\text{K}]+1.67\times[\text{Mg}]+1.35\times[\text{Na}] \qquad (2)$$

Trace metals reflects the sum of 12 different heavy metals and is expressed as:

$$[\text{Trace metals}]=\text{V}+\text{Cr}+\text{Mn}+\text{Fe}+\text{Co}+\text{Ni}+\text{Cu}+\text{Zn}+\text{As}+\text{Cd}+\text{Ba}+\text{Pb} \qquad (3)$$

Similar to results in the YRD (Zhan et al., 2023) and BTH (Huang et al., 2017) regions in China, we found that the PM$_{chem}$ concentration was lower than that of the online PM$_{2.5}$ mass concentration (PM$_{on\text{-}line}$), and the discrepancy between them can be

185 considered as a chemical component that we did not measure, which we define as Unknown, i.e.,

$$\text{Unknown}=[\text{PM}_{online}]-[\text{PM}_{chem}] \qquad (4)$$

2.4.2 WRF-Chem simulation

The Weather Research and Forecasting model coupled with chemistry (WRF-Chem) was used to investigate the contributions of local sources and regional transmission during different periods in Chengdu. Specifically, we set up two simulation scenarios.

190 The first was the baseline scenario, for which the model setup and validation of the scenario are detailed in the supplementary information (S1); and the second was the external emissions scenario (sensitivity scenario), in which we eliminated all anthropogenic emissions in the D03 region (Chengdu administrative area). The model settings for the two scenarios were consistent except for the emission differences. By subtracting the sensitivity scenario from the baseline scenario, the contributions of local sources could be obtained. The calculation formulas for the relative contribution of local sources and

195 regional transmission is as follows:

$$\text{Regional transmission (PM}_{2.5})=\frac{\text{Sensitivity scenario (PM}_{2.5})}{\text{Baseline scenario (PM}_{2.5})}\times100\% \qquad (5)$$

$$\text{Local sources (PM}_{2.5})=1-\text{Regional transmission (PM}_{2.5}) \qquad (6)$$

It is worth noting that this study mainly focuses on the contribution of anthropogenic sources, without considering the contribution of natural emissions, such as biogenic sources.

2.4.3 Backward trajectory and source contribution analysis

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The National Oceanic and Atmospheric Administration (NOAA) Hybrid Single Particle Lagrangian Integrated Trajectory

(HYSPLIT) model has been widely used to simulate and analyze the movement, deposition and diffusion of airflow (Zhang et al., 2014; Luo et al., 2020). In this study, this model was used to simulate 48-h backward trajectories every hour for the study period at the sampling site. The starting height for the back trajectories was 300 m. The reanalysis data with a spatial resolution of 1° and a temporal resolution of 1 h were obtained from the Global Data Assimilation System (https://rda.ucar.edu/datasets/, last access: 20 January 2024). To identify the pollutant characteristics in the different dominant transport patterns, cluster analysis was performed on the trajectories using HYSPLIT, and six clusters were identified according to the similarity in their spatial distributions (Fig. S3).

The concentration-weighted trajectory (CWT) analysis method was further used to calculate the trajectory-weighted concentration. In the CWT method, the whole study area was divided into $i \times j$ grid cells, with the number of endpoints falling in the ijth cell, designated as n_{ij}. Then, each grid cell is assigned a weighted concentration by averaging the sampled pollutants concentrations that have associated trajectories crossing the grid cell, as follows:

$$C_{ij} = \frac{\sum_{l=1}^{M} c_l \tau_{ijl}}{\sum_{l=1}^{M} \tau_{ijl}} \tag{7}$$

where C_{ij} is the average weighted concentration in the ijth cell; l is the trajectory index; M is the total number of trajectories; and c_l and τ_{ijl} are the pollutant concentration and residence time of trajectory l, respectively.

To reduce the effect of small values of n_{ij}, the CWT values were multiplied by an arbitrary weighting function W_{ij}, i.e.,

$$W_{ij} = \begin{cases} 1.00 & (n_{ij} \geq 3n_{ave}) \\ 0.70 & (3n_{ave} > n_{ij} \geq 1.5n_{ave}) \\ 0.42 & (1.5n_{ave} > n_{ij} \geq n_{ave}) \\ 0.17 & (n_{ave} > n_{ij}) \end{cases} \tag{8}$$

where n_{ave} is the average number of trajectory endpoints for each grid cell. Finally, the weighted CWT is expressed as $\mathrm{WCWT}_{ij} = W_{ij} \times C_{ij}$.

2.4.4 Positive Matrix Factorization (PMF)

The U.S. Environmental Protection Agency's PMF 5.0 software was used in this work to perform the $PM_{2.5}$ source apportionment. PMF is a multivariate factor analysis tool based on a weighted least-squares fit, where the weights are derived from the analytical uncertainty (Paatero and Tapper, 1994; Paatero and Hopke, 2003). The best model solution is obtained by minimizing the residuals obtained between modelled and observed input species concentrations. The uncertainty was set to 5/6 the method detection limit (MDL) when the data were less than or equal to the provided MDL. When the concentration

was greater than the provided MDL, the calculation was defined as:

$$Uncertainty = \sqrt{(Error\ Fraction \times Concentration)^2 + (0.5MDL)^2} \qquad (9)$$

To reduce the error, samples with missing values for individual species were excluded rather than replaced by the mean concentrations of the remaining observations. In this study, a total of 23 species were used in the model (OM, EC, Na^+, Mg^{2+}, Ca^{2+}, Cl^-, NO_3^-, SO_4^{2-}, NH_4^+, K, Al, Si, Mn, Fe, Co, Cu, Zn, Cd, Ba, Pb, NO_2, SO_2 and CO). Detailed information on factor selection and determination can be found in our previous studies (Zhang et al., 2024; Huang et al., 2017; Huang et al., 2021b).

3 Results and discussion

3.1 Overall characteristics of the study period

3.1.1 Meteorological and pollution characteristics

As shown in Table S1, the average T and RH during the observation period were 11.0±3.0°C and 62.4±11.6%, respectively, which are significantly higher than those observed in the same period in North China, such as Beijing and Xi'an. Due to the direct influence of T and RH on the homogeneous and heterogeneous generation processes of $PM_{2.5}$ chemical components, such as nitrates, sulfates and secondary organic compounds (Wang et al., 2021; An et al., 2019). Therefore, this difference inevitably leads to differences in the formation mechanisms of air pollution between the north and south of China. Meanwhile, the average WS was only 0.5±0.4 m s^{-1}, which means that the meteorological conditions were stagnant and unfavorable for the diffusion of pollutants.

The concentration of SO_2 (3.6±1.4 µg m^{-3}) is far lower than the CNAAQS (60 µg m^{-3}), as well as previous winters' concentrations in the same period in Chengdu, such as 16.1±12.1 µg m^{-3} in 2015 and 8.5±3.3 µg m^{-3} in 2018. Compared with the value of 49.6±20.0 µg m^{-3} in 2015, the NO_2 concentration in this study (43.5±19.2 µg m^{-3}) is only 12.3% lower, which is much less than the reduction for SO_2 (77.6%). At the same time, the NO_2 mass concentration in this study is higher than in all other considered cities except Xi'an. The O_3 mass concentration increased by 175.6% from 2015 to 2023. This is consistent with the increasing atmospheric oxidizing capacity reported in many regions of China (Feng et al., 2021; Wang et al., 2023). In addition, significant correlation between CO and NO_2 was observed ($r = 0.81$), indicating they have common sources, i.e., motor vehicles. In particular, at the beginning of 2023, Chengdu has become the city with the highest number of motor vehicles in China. Therefore, motor vehicles and the increasing atmospheric oxidizing capacity in Chengdu may have an important impact on local air pollution. The average mass concentration of $PM_{2.5}$ was 95.6±28.7 µg m^{-3}, which is 2.7 times the CNAAQS (35 µg m^{-3}) and 19.1 times the WHO guideline value (5 µg m^{-3}). Although the concentration of $PM_{2.5}$ decreased by 12.6% from 2015 to 2018, it had rebounded sharply by 2023, with an increase of 33.3%. At the same time, the result in this study is

2.9, 3.1 and 3.0 times that of Beijing, Shanghai and Guangzhou, respectively. This directly reflects that Chengdu still faces

huge challenges in $PM_{2.5}$ pollution control. In addition, the increasing $PM_{2.5}/PM_{10}$ ratio from 2015 (0.68) to 2023 (0.77)

emphasizes the more important role of fine particles in air pollution.

As shown in Fig. 1, during the observation period, Chengdu experienced multiple alternations between non-pollution and haze

days. There were two obvious haze events that occurred during the observation period. The first of these started in the early

afternoon (13:00) on 27 January. $PM_{2.5}$ rose slowly in a fluctuating manner with obvious accumulation characteristics. After

106 h, the $PM_{2.5}$ mass concentration reached its highest value of the first haze event, which was 125 $\mu g\ m^{-3}$. The $PM_{2.5}$ growth

rate was 0.92 $\mu g\ m^{-3}\ h^{-1}$. Subsequently, in the afternoon of 1 February, short-term weak precipitation occurred. Meanwhile,

the wind transformed into a stable easterly wind, and the WS was significantly higher than that in the period of high $PM_{2.5}$.

Accordingly, the $PM_{2.5}$ mass concentration decreased rapidly. It only took 31 h to reduce the maximum $PM_{2.5}$ concentration

(125 $\mu g\ m^{-3}$) to the minimum (40 $\mu g\ m^{-3}$), and the reduction rate reached 2.74 $\mu g\ m^{-3}\ h^{-1}$. However, at noon on 2 February,

with the decrease in WS and the erratic WD, $PM_{2.5}$ accumulated rapidly. In a short period of 37 h, the $PM_{2.5}$ mass concentration

increased from 40 $\mu g\ m^{-3}$ to more than 150 $\mu g\ m^{-3}$. The growth rate reached 2.97 $\mu g\ m^{-3}\ h^{-1}$. From 4 to 7 February, the mass

concentration of $PM_{2.5}$ fluctuated but remained at a high level, with a daily average of more than 115 $\mu g\ m^{-3}$. Finally, the

pollution process ended with the appearance of an easterly wind in the early morning of 8 February. Based on the above

description and the daily average value of $PM_{2.5}$ being lower or higher than the CNAAQS (daily average of 75 $\mu g\ m^{-3}$), the

whole observation period can be divided into four stages: (1) non-pollution period 1 (NP-1); (2) Haze-1; (3) non-pollution

period 2 (NP-2); and (4) Haze-2. The evolutionary and pollution formation mechanisms will be analyzed and discussed later.
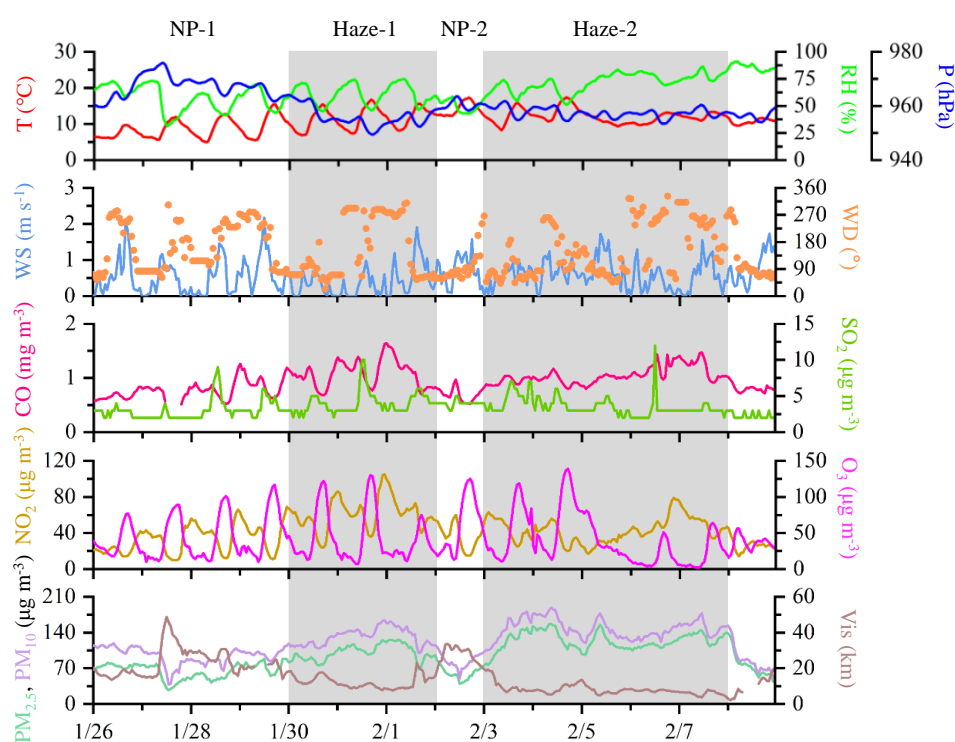
Figure 1: Time series of the meteorological conditions and mass concentrations of pollutants in the study period.

In addition, it is worth noting that on 4 February the daily and highest hourly $PM_{2.5}$ concentration reached 116 and 150 µg m^{-3}, respectively, leading to the "orange" haze alarm (see S2) issued by the Chengdu Government and the subsequent strict emission controls implemented during this period; for example, the time limit for motor vehicles was tightened, all open-air operations and all kinds of construction were prohibited and industrial enterprises were instructed to cease production or had limitations imposed on their production depending on the type of goods they were producing. Due to these emission reduction measures mainly targeting pollution sources that occur during the daytime. Therefore, although there was a significant increase in pollution at night, the pollution level in the daytime in the following days was lower than that on 3 February. This indicates that the various policies issued to reduce pollutant emissions during the "orange" haze alarm period had a positive effect, which can be further demonstrated by the significantly reduced contributions of relevant pollution sources, such as industrial processes, vehicle emissions and dust (see section 3.4). However, the $PM_{2.5}$ mass concentration remained at a high level during this period, which means that there were other pollution sources or formation mechanisms strongly affecting the formation of haze, and so the coverage of the emission reduction policies during the alarm period was not sufficiently wide or stringent. Therefore, in order to further reduce similar heavy pollution events in future, more comprehensive and powerful pollution reduction measures would be needed.

3.1.2 PM$_{2.5}$ chemical composition

As shown in Fig. 2a, OM constituted the largest component of $PM_{2.5}$, accounting for 35.3% of the total mass, and the contributions of three secondary inorganic species, i.e., SO_4^{2-}, NO_3^- and NH_4^+ (SNA), were 9.2%, 22.0 % and 7.8%, respectively. Compared with previous winters' observation results in Chengdu, such as when the order of contribution was OM (24.3%) > SO_4^{2-} (15.1%) > NO_3^- (12.9%) > NH_4^+ (9.0%) in January 2015, the contributions of OM and NO_3^- are 11.0% and 9.1% higher, respectively, whereas the contributions of SO_4^{2-} and NH_4^+ are 5.9% and 1.2% lower in this study. This indicates the growing significance of OM and nitrate, as well as the diminishing significance of sulfate, in winter in Chengdu. This is consistent with the trends of change in their precursors; that is, the concentration of SO_2 has decreased year on year and been at a very low level. Although NO_2 has decreased in recent years, it is at a high level and frequently exceeds the CNAAQS. In fact, due to the greater reduction in emissions of SO_2 than NO_2 and the negligible change in NH_3 since the implementation of APPCAP and BSDW, a considerable increase in the nitrate fractions in aerosols has been observed during pollution events in most regions in China, and thus the transition from sulfate-dominated to nitrate-dominated haze will likely have a significant impact on the mechanism of pollution formation, which is also worthy of attention when developing future pollution control measures (Huang et al., 2021b; Geng et al., 2019; Wang et al., 2022a; Zhang et al., 2020a).
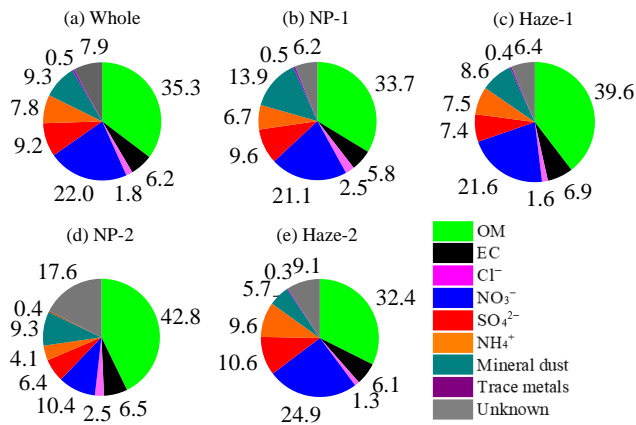
Figure 2: PM$_{2.5}$ chemical composition in different periods (%).

In addition, it is worth noting that the contribution of OM is significantly higher than observed in previous winters in Chengdu, such as 27.8% in 2014, as well as in other cities in China, such as 14.5% in Beijing (Lv et al., 2022), 26.0% in Shanghai (Zhang et al., 2020a) and 23.6% in Xi'an (Wang et al., 2022b). In fact, our own recent research on the interannual evolution of PM$_{2.5}$ in winter in Chengdu also found that the proportion of OM in PM$_{2.5}$ increased year on year, and its contribution to heavy pollution was also increasing (Zhang et al., 2024). Therefore, compared with other cities, the measures introduced to reduce emissions leading to air pollution in Chengdu need to pay attention not only to the high pollution levels of nitrate (similar to in other cities), but also those of OM.

The mass ratio of NO$_3^-$/SO$_4^{2-}$ is used to indicate the relative importance of mobile and stationary sources in the atmosphere. In this study, the NO$_3^-$/SO$_4^{2-}$ mass ratio during the whole study period was 2.4, which is significantly higher than that in winter 2011 (0.5) (Tao et al., 2014) and winter 2014 (1.1) (Wang et al., 2018a) in Chengdu. Such an increasing NO$_3^-$/SO$_4^{2-}$ mass ratio is also apparent in other regions of China, especially in cities. For example, the NO$_3^-$/SO$_4^{2-}$ mass ratio in Beijing was 0.9 in 2011, which increased to 1.7 in 2020 (Wang et al., 2022a). This indicates that the role of mobile sources has become increasingly significant owing to the rapid expansion of transportation. Previous studies have suggested that when sulfur oxidation rate (SOR = $n(SO_4^{2-})/[n(SO_4^{2-}) + n(SO_2)]$, n is the molar concentration) and nitrogen oxidation rate (NOR = $n(NO_3^-)/[n(NO_3^-) + n(NO_2)]$) are greater than 0.2 and 0.1, respectively, intense conversion and formation of secondary inorganic aerosols (SIA) takes place (Yang et al., 2015). In this study, the average values of SOR and NOR during the whole observation period were 0.64 and 0.28, respectively, which means that a strong secondary generation process had occurred, and this value is higher than that in winter 2018 in Chengdu (SOR: 0.39, NOR: 0.13) (Song et al., 2022). This enhanced secondary generation process explains why the concentrations of the two species (SO$_4^{2-}$ and NO$_3^-$) were still at a high level in spite of the reduced concentrations of their precursors (SO$_2$ and NO$_2$).

Overall, although the air quality in Chengdu has improved significantly in recent years, it still faces serious air pollution in winter, especially in terms of PM$_{2.5}$ and gaseous pollutants related to mobile sources (such as NO$_2$) and the stronger secondary generation. Similar to in other cities, the increasing contribution of nitrate is particularly noteworthy. Moreover, the OM is significantly higher than in other cities, which must not be ignored.

3.2 Classification and mixing state of individual particles

Based on the morphology and elemental composition of individual particles, the particulate matter in winter in Chengdu can be classified into five major aerosol components: mineral, OM, SIA, soot and fly ash/metal particles. Figure 3 shows the TEM images and EDS spectra of various particle types.
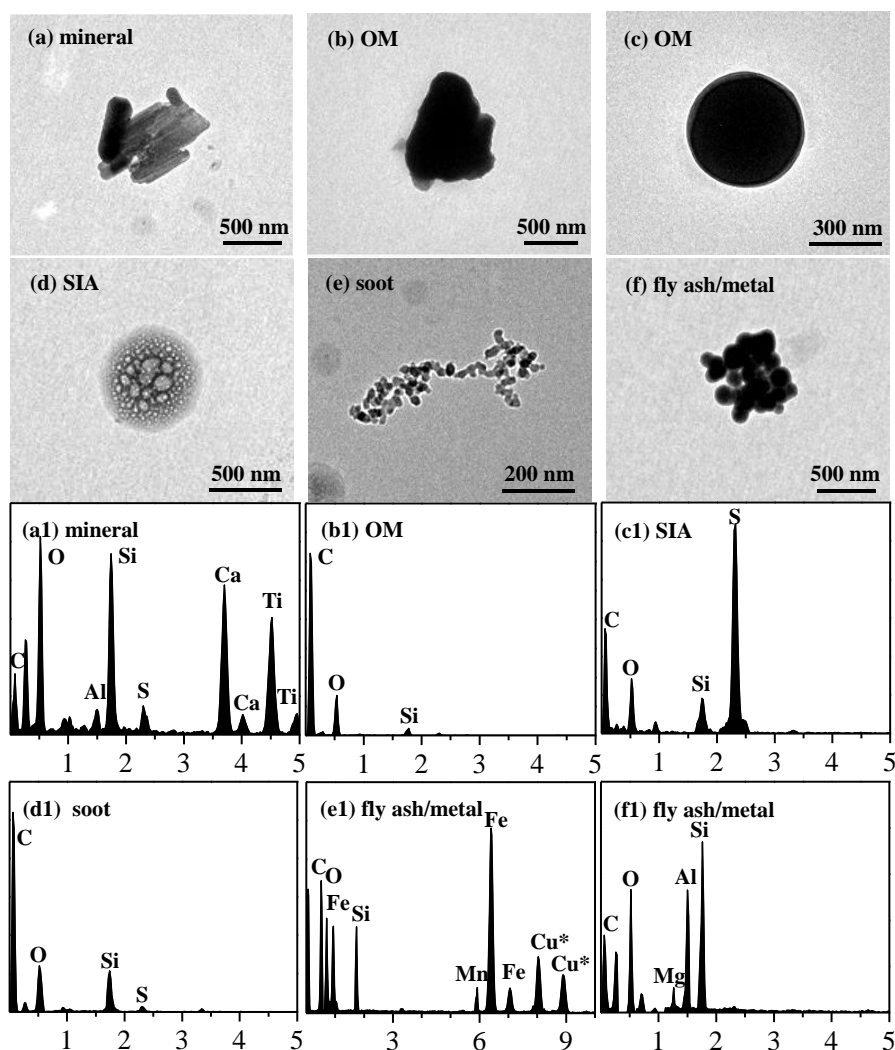
Figure 3: (a–f) TEM images and (a1–f1) EDS spectra of individual particles.

Mineral particles presented an irregular shape (Fig. 3a and 4c), mainly contained the elements C, O, Al, Si, Ca and Ti (Fig. 3a1), and largely occurred in the coarse size range (> 1 μm). Mineral particles are considered to have arisen from deserts, roads and construction activities. OM particles existed in various forms and could be further classified into irregular OM, spherical

OM and OM coating, based on their morphology (Fig. 3b, 3c and 4), and were mainly composed of C and O (Fig. 3b1). The irregular and spherical OM are usually considered as primary organic matter (POM), which is directly emitted from coal or biomass burning. OM-coating, meanwhile, is usually considered to be secondary organic matter (SOM), which is produced

340 from the chemical oxidation of volatile organic compounds (VOCs) (Liu et al., 2018). SIA particles were mainly composed of C, O, Si and S (Fig. 3c1) and formed from the oxidation of SO_2, NOx and NH_3. SIA particles normally represent the mixture of $(NH_4)_2SO_4$ and NH_4NO_3 (Li et al., 2016). Soot particles (i.e., BC or EC) presented a chain-like morphology consisting of an aggregate of carbonaceous spheres with diameters from 10 to 150 nm (Fig. 3e, 4b and 4f). Soot particles mainly contained C and minor amounts of O and Si (Fig. 3d1), and are generated from incomplete combustion processes of biomass burning

345 and fossil fuels. Fly ash/metal particles, with spherical morphology (Fig. 3f, 4d and 4e), were mainly composed of C, O, Si and metallic elements (e.g., Al, Fe and Mn) (Fig. 3e1 and f1). These particles mainly fall within the ultrafine size range (< 100 nm), and normally are emitted from coal-fired power plants and heavy industrial activities. A detailed introduction to the various types of particles can been found in previous studies (Li and Shao, 2009; Li et al., 2016; Deng et al., 2021; Liu et al., 2018).

350 Numerous studies have shown that aerosol particles from different sources tend to internally mix (mixed with other types of particles) in the atmosphere (Li and Shao, 2009; Li et al., 2016; Li et al., 2015b; Zhang et al., 2021b). Accordingly, we found many different kinds of internally mixed particles; for example, OM or SIA particles were mixed with almost all other types of particles, as the core or coating of particles. Meanwhile, mineral, fly ash/metal and soot particles were usually coated by OM or SIA particles as the core of particles. Therefore, based on particle types and mixing states, aerosol particles were further

355 classified into nine groups: OM, soot, mineral, fly ash/metal, OM-SIA, OM-soot, OM-mineral, OM-fly ash/metal and OM-SIA-soot particles (Fig. 4).
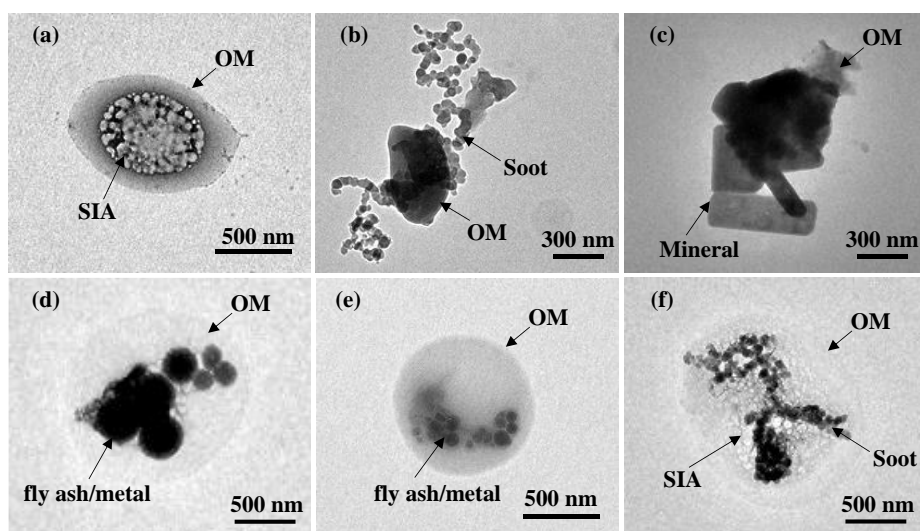
Figure 4: TEM images of different types of internally mixed particles: (a) SIA coated by OM; (b) mixture of OM and

soot; (c) mixture of OM and mineral; (d, e) fly ash/metal coated by OM; and (f) mixture of OM, SIA and soot particles.

3.3 Exploring the formation mechanism of haze events

According to section 3.1, the study period was divided into four sub-periods: NP-1, Haze-1, NP-2 and Haze-2 (for ease, referred to simply as periods rather than sub-periods hereafter). This section analyzes the evolution in pollution characteristics during these four periods, with a focus on the formation mechanisms of the haze events, in order to provide scientific data that can be used to help formulate measures to reduce heavy pollution in winter in Chengdu.

3.3.1 Meteorological conditions

Given the duration of NP-2 was only one day and the meteorological conditions on that day were characterized by rainfall and subsequent strong winds, this period was therefore an unconventional NP period, and its corresponding meteorological conditions were unsuitable for comparing with the results of the haze events to explore the formation mechanism of haze. Therefore, the comparison of meteorological conditions in this section mainly focuses on the two haze events and the more conventional NP period, i.e., NP-1. As shown in Fig. S4, the diurnal variations of T and RH in the three periods (NP-1, Haze-1 and Haze-2) were similar, i.e., with the highest and lowest T values appeared at 16:00 and 07:00–08:00, and the highest and lowest RH values appeared at 07:00–09:00 and 15:00–16:00, respectively. However, the difference between the daily maximum and minimum values in each period was different, in which the T and RH in Haze-2 changed most smoothly, with the difference values being 3.9°C and 12.2%, respectively, which was significantly lower than in the other periods—namely, 6.8°C and 22.5% in NP-1, and 8.4°C and 27.4% in Haze-1, respectively. As shown in Fig. S5, the T and RH of the haze events (11.5±2.9°C and 61±9% in Haze-1, 12.1±1.9°C and 72±8% in Haze-2) were higher compared with those in NP-1 (8.7±2.7°C and 57±12%), making it more conducive to the secondary generation of pollutants through photochemical and liquid-phase reactions. The synchronous increase in T and RH during haze period in this study is different from a previous report in winter in Beijing (T decreased, RH increased) (Liu et al., 2013). This highlights the differences in the formation mechanisms of haze in different regions of China. In addition, the atmospheric pressure in the two haze periods (956 and 957 hPa in Haze-1 and Haze-2, respectively) was lower than in NP-1 (967 hPa), and the WSs in the three periods were close and at very low levels (0.4–0.6 m s^{-1}). Overall, compared to NP-1, the meteorological conditions during the two haze periods were more conducive to the accumulation and secondary generation of pollutants.

Figure 5 shows the WCWT analysis results of PM$_{2.5}$ in different periods. It can be found that, from NP-1 to Haze-1, although the potential source area in the eastern areas of Sichuan Province had disappeared, the potential source area in the southern areas had expanded and the high-value areas of PM$_{2.5}$ had significantly increased, with almost half of the area having a contributing concentration that exceeded 90 μg m^{-3}. From Haze-1 to Haze-2, the potential source area in the south further

expanded, covering not only the southeastern region of Sichuan Province but also the western region of Guizhou Province. Meanwhile, the potential contribution concentration of PM$_{2.5}$ in the vast majority of areas exceeded 90 μg m^{-3}. Three secondary inorganic components, i.e., SNA, exhibited the same trend of evolution as PM$_{2.5}$ (Fig. S6). This reflects the significant impact of regional transmission on local pollution in Chengdu, especially during haze periods.
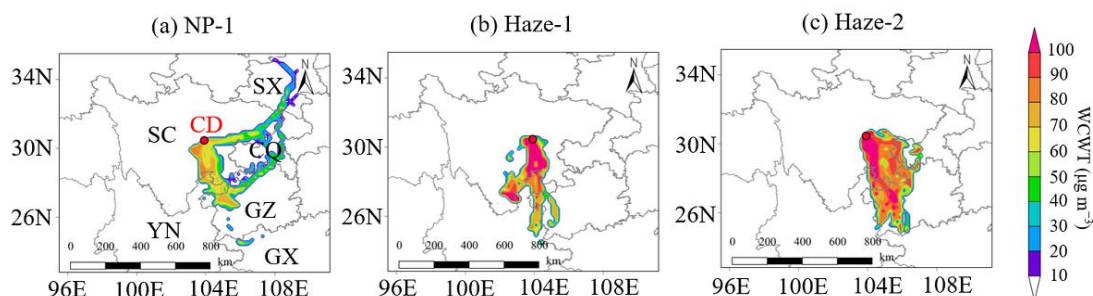
Figure 5: WCWT maps of PM$_{2.5}$ in the (a) NP-1, (b) Haze-1 and (c) Haze-2 period (CD: Chengdu; SC: Sichuan Province; SX: Shaanxi Province; CQ: Chongqing; GZ: Guizhou Province; GX: Guangxi Province; YN: Yunnan Province).

Figure S3 shows the transmission characteristics of air masses in Chengdu during the study period. It can be seen that all air masses during the observation period can be grouped into six clusters, i.e., C1, C2, C3, C4, C5 and C6, which originated from southern Sichuan Province, Guizhou Province, Chongqing or Shaanxi Province. According to the WCWT analysis results, the southern area was the most important potential source area for pollutants in Chengdu. Correspondingly, the four clusters (i.e., C1, C2, C3 and C4) originated from the southern areas corresponded to high PM$_{2.5}$ mass concentrations (98.3 to 107.6 μg m^{-3}), which were significantly higher than the concentrations of C5 (51.5 μg m^{-3}) and C6 (58.6 μg m^{-3}) that the areas they passed through did not belong to the main potential source areas of pollutants. Referring to the CNAAQS, we defined C1 to C4 as "polluted" air masses, while C5 and C6 were defined as "clean" air masses. From the bar chart in the Fig. S3, it can be seen that, during the NP1 period, the proportion of "clean" air masses reached 50%, while during the two haze periods all air masses were "polluted" air masses. This is consistent with the pollution levels of the three periods.

3.3.2 Gaseous pollutants

As shown in Fig. S7, compared with the NP periods, the main gaseous precursors, such as NO$_2$, SO$_2$ and CO, increased during the two haze events, which provided an important basis for the formation of PM$_{2.5}$ chemical components, such as nitrate, sulfate and OM. At the same time, O$_3$ concentrations during the two haze events were close to those of NP-1, and also showed obvious diurnal variations, with the highest values of Haze-1 and Haze-2 reaching 108.7 and 83.0 μg m^{-3}, respectively (Fig. S8). Thus, the contribution of photochemical reactions cannot be ignored in the formation of these heavy haze events. This is different to previous research findings for North China, where the concentration of O$_3$ during haze periods was found to have decreased significantly or remained at nearly zero for several days, and the contribution of photochemical reactions could be

ignored (Lin et al., 2022; Yang et al., 2015).

3.3.3 PM$_{2.5}$ and individual particle composition

415 The average PM$_{2.5}$ mass concentration during the two NP periods was 64.9±15.0 µg m^{-3} (NP-1) and 61.6±14.1 µg m^{-3} (NP-2), which increased to 101.5±15.2 µg m^{-3} (Haze-1) and 123.5±17.8 µg m^{-3} (Haze-2) during the two haze events. Accordingly, the chemical composition of PM$_{2.5}$ also showed obvious differences with the evolution of pollution. As can be seen from Fig. 2, from NP-1 to Haze-1, the contribution of the carbonaceous component showed the most significant increase, with OM and EC increasing by 5.9% and 1.1%, respectively. However, the mineral dust contribution showed the greatest decrease (by 5.3%).

420 The changes in chemical components suggests that the formation of this haze event was closely related to the combustion of fossil fuels. Meanwhile, compared to NP-1, the significantly increased NO$_3^-$/SO$_4^{2-}$ mass ratio (from 2.2 to 2.9) and NO$_2$ concentration (61.5±18.2 µg m^{-3}, highest of the four periods) during Haze-1 further suggests that the contribution of mobile sources—the most important fossil fuel combustion source in urban areas—may have dominated. In addition, the correlation between the concentrations of PM$_{2.5}$ and CO was strong in Haze-1 ($R^2 = 0.59$), suggesting a strong impact of local emissions

425 on Haze-1.

In the afternoon of 1 February, short-term weak precipitation occurred. At the same time, the winds were generally easterly and the WS was higher than that in the period of high PM$_{2.5}$. Subsequently, the PM$_{2.5}$ mass concentration decreased rapidly, and the chemical composition of PM$_{2.5}$ changed significantly in NP-2. Compared to Haze-1, the proportion of OM further increased by 3.2%, while the proportion of the three secondary inorganic components, i.e., SNA, decreased by 15.6%, with

430 the largest decrease being for NO$_3^-$ at 11.2%. This is mainly because of the difference in hygroscopicity, i.e., the strongly hygroscopic SNA would have been more easily removed by precipitation, while precipitation would have been less efficient at removing the weakly hygroscopic, even hydrophobic carbonaceous components (Zhang et al., 2018).

By the beginning of 3 February, Chengdu had entered the Haze-2 period, featuring a higher PM$_{2.5}$ pollution level and longer duration. Compared with the NP-2 period, the proportion of OM decreased by 10.4%, while SNA increased by 24.2%,

435 especially NO$_3^-$ (by 14.5%). This indicates that secondary generation was an important cause of Haze-2. Meanwhile, the NO$_3^-$/SO$_4^{2-}$ mass ratio and NO$_2$ were lower than that in the Haze-1 period, and the correlation between PM$_{2.5}$ and CO was weak (0.09), allowing us to infer that secondary generation led to this more serious haze pollution event. The different contributions of secondary generation to the two haze events can be further confirmed by analyzing the SOR and NOR results. As shown in Fig. S7, the SOR and NOR in Haze-2 (0.75 and 0.38) were higher than those in the other periods, while their

440 ratios in the Haze-1 period (0.58 and 0.22) were close to those in the NP-1 period (0.60 and 0.23).

As shown in Fig. 6, from NP-1 to Haze-1, although the contribution of externally mixed (separated from other types of particles) OM particles decreased by 4.0%, the contribution of internally mixed OM particles, such as OM-SIA, increased by 5.8%. At the same time, the proportion of OM-soot, the internally mixed product of two types of carbonaceous particles, increased by 1.7%. Therefore, during this stage, not only did the proportion of OM-related particles increase, but so did the mixing of carbonaceous particles with secondary inorganic components. From Haze-1 to NP-2, the occurrence of precipitation and sustained easterly winds reduced the total contribution of particles related to SIA particles (including OM-SIA and OM-SIA-soot) from 46.8% to 19.7%. This would have been mainly due to the stronger hygroscopicity of SIA particles, which determines their susceptibility to precipitation and strong winds (Zhang et al., 2018). On the contrary, the contributions of weakly hygroscopic or hydrophobic carbonaceous particles, such as OM, soot and OM-soot particles, increased by 14.4%, 2.9% and 6.4%, respectively (Zhang et al., 2018). When entering the Haze-2 period, the proportions of SIA-related particles and internally mixed particles reached their highest levels among the four periods, with contributions of 62.1% and 70.0%, respectively. Therefore, in this period, particles experienced the strongest secondary aging and internal mixing. In addition, due to the limitations imposed by the pollution reduction measures during the "orange" haze alarm period on industrial sources, the total proportion of particulate matter related to fly ash/metal (fly ash/metal and OM-fly ash/metal) decreased from 7.2% to 2.0%. It can be seen that although single-particle and bulk-chemical methods analyzed the chemical composition of particulate matter from two different perspectives, and there were differences in the contribution changes of similar species (such as SIA particles and SNA) with pollution evolution, but the two types of data exhibited similar trends. By combining these results, we can have a clearer understanding of the formation mechanism of pollution.
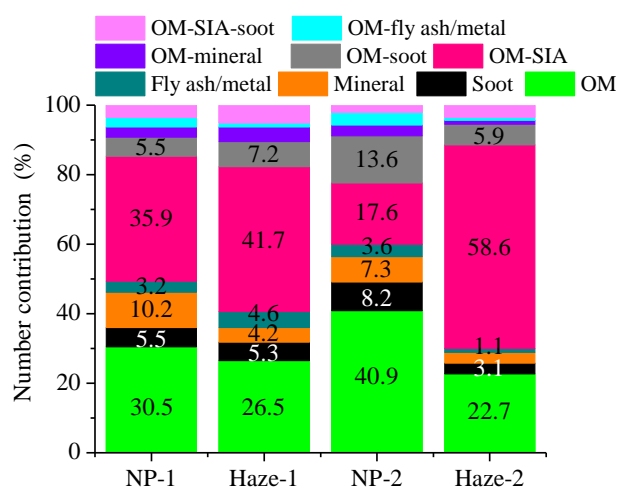
Figure 6: Relative abundance of different particle types in different periods (%).

3.3.4 Aging characteristics of individual aerosol particles during two haze events

The mixing structure of individual particles can reflect their sources and formation mechanism. Here, we focus on analyzing the mixing structure of carbonaceous particles (i.e., OM and soot) and SIA particles, which were highly abundant in this study,

during two haze periods.

As reported in previous studies, the irregular and spherical OM particles belong to POM particles (Yuan et al., 2020) and have generally been considered to be "tarballs" (Adachi et al., 2019), which mainly come from the combustion process. OM coatings, meanwhile, have tended to be perceived as SOM particles and are normally considered to form from the chemical transformation of VOCs in the atmosphere, which are typical secondary particles with a much stronger degree of aging than POM particles (Zhang et al., 2017a). As shown in Fig. 7, there were a large number of tarball particles during the Haze-1 period, and most of them existed in an externally mixed form or were partly coated by other particles. However, during the Haze-2 period, we found only a few tarball particles and they were almost entirely embedded within secondary particles, such as SIA. Meanwhile, OM particles appeared more frequently in the form of OM coating (i.e., SOM).
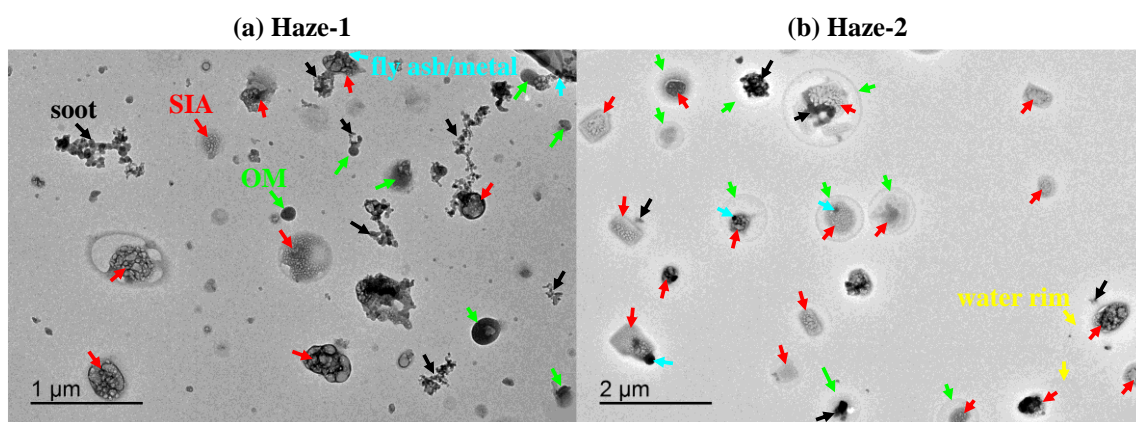
Figure 7: Mixing characteristics of individual particles in the (a) Haze-1 and (b) Haze-2 periods.

The morphology of another frequently occurring carbonaceous particle, i.e., soot, also showed significant differences between the two haze periods. In the Haze-1 period, the vast majority of soot particles existed in the form of chain-like particles or particles partially embedded with other species. However, in the Haze-2 period, almost all soot particles were completely coated by other components, especially SIA, and existed in a fully embedded form. At the same time, compared to Haze-1, their fractal morphologies had transformed into compact shapes, suggesting that secondary aerosol coating formation can significantly compress the fractal morphology of soot particles. Therefore, the high humidity in the Haze-2 period (78±8%) led to phase changes of secondary aerosols and further caused the morphological compactness of soot aggregations.

Compared to Haze-1, SIA particles with OM coating were the dominant particles during the Haze-2 period. Li et al. (2014) pointed out that this mixing structure could determine the hygroscopic properties of the aerosol particles, i.e., OM coatings on inorganic particles can induce an early deliquescence of particle surfaces compared to those of pure inorganic particles. Mikhailov et al. (2015) also found that the semi-solid state of the OM coating can lead to kinetic limitations of water uptake

and release during hydration and dehydration cycles. Gas (e.g., SO$_2$, NO$_2$ and VOCs) condensation on the existing particles is an important chemical process for formation of this type of particulate matter (Li et al., 2015b). Zhang et al. (2021b) also pointed out that more SIA and SOM in fine particles mainly result in earlier deliquescence and larger hygroscopic growth factor values of haze particles, which further implies that aged haze particles can provide aqueous surfaces for the formation of secondary aerosols via heterogeneous reactions.

In addition, we also found that, with the influence of high levels of RH during Haze-2, some particles had a clear water rim around individual particles (Fig. 7b), suggesting that these secondary particles were in an aqueous phase in ambient air (Li et al., 2016b). This result suggests that haze particles in the polluted air retained the wet or liquid phase during the Haze-2 period.

3.4 Source contributions

Based on PMF, there were six factors identified in this study: dust, biomass burning, coal combustion, industrial processes, vehicular emissions and secondary sources (S3). Except for secondary sources, the other five factors can be referred to as primary sources. As shown in Fig. 8, secondary sources were the highest contributor to PM$_{2.5}$ during the whole study period, accounting for 40.5%. According to its source profile (Fig. S9), secondary sources included SOM and secondary inorganic matter. Therefore, we can infer that secondary aerosols were produced by secondary reactions of their precursors (SO$_2$, NOx, NH$_3$ and VOCs) in the atmosphere. Vehicular emissions constituted the highest contributing factor among the primary sources, accounting for more than a quarter of the total PM$_{2.5}$ mass (25.6%). This high contribution is directly related to the level of vehicle ownership in Chengdu. The contribution of coal combustion (15.4%) was more than four times that of biomass burning (3.5%), which was mainly because the study period did not cover the traditional biomass burning season (late spring and early summer (Tao et al. (2013)); whereas, the pollutants emitted from coal combustion from certain industries (such as industrial furnaces and power plants) around Chengdu or other cities, may have had a serious impact on the air quality of Chengdu. In addition, the contribution of dust was 8.5%.
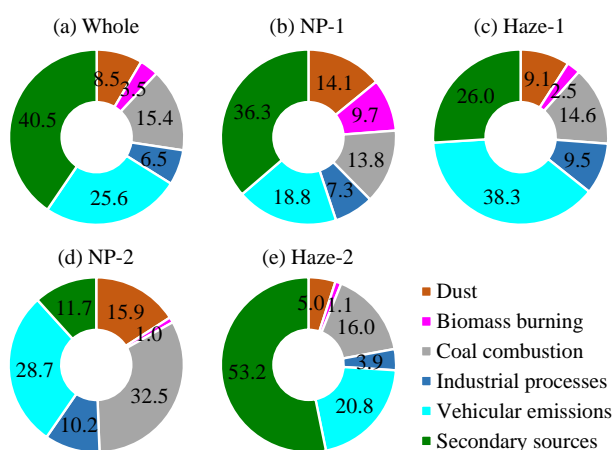
Figure 8: Composition of PM$_{2.5}$ sources in different periods (%).

Due to the impact of pollution reduction measures, urbanization and changes in pollutant formation mechanisms in recent years, the contributions of the various sources identified in this study are markedly different compared to previous winters. For example, the contributions of coal combustion, biomass burning and industrial processes in this study are lower than those reported in winter 2011 (18%, 16% and 18%, respectively) (Tao et al., 2014). This is mainly related to the various pollution reduction measures implemented in Chengdu, and even the broader SCB, in the past decade, such as the optimization of industrial infrastructure and the restructuring of energy, the improvements in industrial source pollutant emission standards, the widespread use of various pollutant treatment technologies and the strict controls imposed on outdoor biomass burning in rural areas (http://sthjt.sc.gov.cn/sthjt/c106120/2018/12/28/8f2a9dead56c4605ad2d26fe2e2fac43.shtml, last access: 20 January 2024). The minimal reduction in coal combustion sources may be due to the rapid development of industry offsetting the effects of pollution reduction. At the same time, it is worth noting that although the contribution of coal combustion in this study is close to results reported in Beijing (13.3%) (Lv et al., 2022), compared to Beijing, there is no coal-fired heating in winter in Chengdu. Therefore, coal combustion in Chengdu still deserves attention. The contribution of vehicular emissions increased by 12.0% compared to 2018 (13.6%) (Song et al., 2022), and is significantly higher than that of other medium-sized cities in the SCB (8.6%–11.7%) (Zhang et al., 2023b). In addition, the contribution of secondary sources is close to the results in 2011 (44.0%) (Tao et al., 2014) and 2018 (43.4%) (Song et al., 2022) in Chengdu, and slightly lower than that in winter in Beijing (47.7%) (Lv et al., 2022). Therefore, high levels of secondary sources are one of the common problems faced by many cities in China in reducing PM$_{2.5}$.

As shown in Figs. 8b–e, from NP-1 to Haze-1, the contributions of secondary sources, biomass burning and dust decreased by 10.3%, 7.2% and 5.0%, respectively. On the contrary, the contribution of vehicular emissions increased by 19.5%; and meanwhile, the contribution from industrial processes—most of which derives from the suburbs of Chengdu—increased by 2.2%. During the NP-2 period, the precipitation and strong easterly winds not only reduced the contribution of secondary sources rich in hygroscopic species (such as SNA) by 14.3%, but also effectively cleared (decreased by 9.6%) a large amount of accumulated vehicular emissions pollutants during Haze-1. On the contrary, the contributions of coal combustion and dust sources increased by 17.9% and 6.8%, respectively. This is because the continuous easterly winds carried pollutants related to coal combustion in eastern Sichuan Province and Chongqing, and greatly increased the contribution of coal combustion. At the same time, this continuous easterly wind also drove the contribution of dust in NP-2 to reach its highest level across the four periods (15.9%). After entering the Haze-2 period, with the implementation of various emission reduction policies during the "orange" haze alarm period, compared with NP-2, the contributions of various primary sources decreased significantly. For example, the contributions of industrial processes, coal combustion and vehicular emissions decreased by 6.3%, 16.5%

and 7.9%, respectively. With the decrease in wind power and vehicular emissions, the contribution of dust sources was also lowest among the four periods (5.0%). Contrary to the decrease in contributions from other sources, the secondary sources in the Haze-2 period reached their highest value among the four periods (53.2%), which may be attributable to a large amount of secondary generation in Chengdu under the high humidity conditions and regional transmission (Lv et al., 2021). In fact, the source composition of $PM_{2.5}$ and its chemical components (both bulk-chemical and single-particle analysis) exhibited very similar characteristics during the evolution of the four periods, i.e., although the contribution of regional transmission cannot be ignored, Haze-1 was mainly caused by the gradual accumulation of pollutant emissions from sources related to local fossil fuel combustion, especially mobile sources, while Haze-2 was mainly triggered by high concentrations of secondary pollutants, which mainly came from regional transmission.

We found that the formation mechanism of haze in this study is different from previous winter study results in other regions in China, such as northern China. For example, Zhang et al. (2020b) found that residential coal burning and biomass burning were important factors causing winter haze in Northeast China. While, the contribution of industrial emissions to the formation of winter haze in the NCP region was much higher than that in Northeast China (Ma et al., 2016). Meanwhile, compared to previous winter studies in Chengdu (Liao et al., 2017; Li et al., 2017; Tao et al., 2013), the haze formation in this study presented some new characteristics. For example, (1) the key potential source areas during the haze period have shifted from the southeast in 2013 to the south; (2) mobile sources played a more important role, while the contributions of biomass burning and dust sources were significantly weaker; (3) the contribution of nitrate to the formation of heavy pollution was more prominent. This means that in order to develop efficient pollution reduction policies, it is very necessary to conduct targeted and timely research on the characteristics, sources and formation mechanisms of haze in the areas of concern.

3.5 Contribution of local sources versus regional transmission

Figure S10 shows the relative contributions of local sources and regional transmission in the WRF-Chem model results during the whole study period and different pollution periods. It can be seen that, during the whole study period, the contributions of local sources and regional transmission were the same (50% vs. 50%). This means that pollution control in Chengdu still needs to involve strict joint prevention and control of regional air pollution on the basis of local pollutant emissions reduction. In terms of the two haze events, the contribution of regional transmission during Haze-2 was higher than that during Haze-1, with contribution ratios of 55% and 44%, respectively. This further confirms our conclusion that regional transmission was key for the formation of Haze-2. It is worth noting that, during the Haze-2 period, Chengdu and surrounding areas adopted control measures during the "orange" haze alarm period. However, due to the lack of timely source information, we may have overestimated the contribution of local sources during the Haze-2 period, and accordingly the actual contribution of regional transmission during this period may have been higher. In addition, compared with simulation results during heavy haze periods

in other cities in China, the contributions of regional transmission during Haze-2 are close those in Beijing (56%) (Li and Han, 2016) but higher than those in Shanghai (37%) and Suzhou (44%) (Li et al., 2015a).

4 Summary and implications

4.1 Summary

The aerosol mass and chemical composition, morphology and mixing state, and sources and evolutionary processes at the beginning of 2023 in Chengdu were investigated with bulk-chemical and single-particle analysis along with numerical model simulations. Although the air quality in Chengdu has improved significantly in recent years, it still faces serious air pollution in winter, especially from $PM_{2.5}$ (95.6±28.7 µg m^{-3}) and gaseous pollutants related to mobile sources (such as NO_2). Compared with other cities in China, $PM_{2.5}$ reduction in Chengdu not only needs to focus on the increasing contribution of nitrate, but also needs more attention paid to the high levels of OM. Based on the morphologies and elemental compositions of individual particles, these particles could be classified into mineral, OM, SIA, soot and fly ash/metal particles, with most existing in a state of being internally mixed in the atmosphere.

The whole study period included two non-pollution periods (NP-1 and NP-2) and two haze periods (Haze-1 and Haze-2). As pollution evolved, the chemical composition results obtained based on bulk-chemical and single-particle analysis exhibited strong consistency. From NP-1 to Haze-1, the mass contributions of OM and EC increased by 5.9% and 1.1%, and the number contributions of OM-SIA and OM-soot particles increased by 5.8% and 1.7%, respectively. Meanwhile, the correlation coefficient (R^2) between $PM_{2.5}$ and CO (indicator of local emissions) reached 0.59, and the NO_3^-/SO_4^{2-} mass ratio and NO_2 concentration (indicators of mobile sources) reached their highest values across the four periods. The short-term precipitation and sustained easterly winds led to a significant decrease in secondary inorganic species, i.e., SNA (by 15.6%) and SIA particles (by 27.1%). As pollution evolved from NP-2 to Haze-2, the contributions of SNA and SIA particles experienced explosive growth, with growth rates of 24.2% and 42.4%, respectively. Meanwhile, the R^2 between $PM_{2.5}$ and CO was only 0.09, and the NO_3^-/SO_4^{2-} mass ratio and NO_2 concentration were lower than in Haze-1, while the SOR and NOR both reached their highest values across the four periods. It can therefore be inferred that Haze-1 was mainly caused by the pollutant emissions from sources related to local fossil fuel combustion, especially mobile sources, while Haze-2 was mainly triggered by high concentrations of secondary pollutants, which mainly came from regional transmission. The differences in the sources and the comparison between local sources and regional transmission across the four periods further validated the different formation mechanisms of the two haze events. Based on the above analysis results, we have drawn a conceptual model of pollution evolution during the study period (Fig. 9).
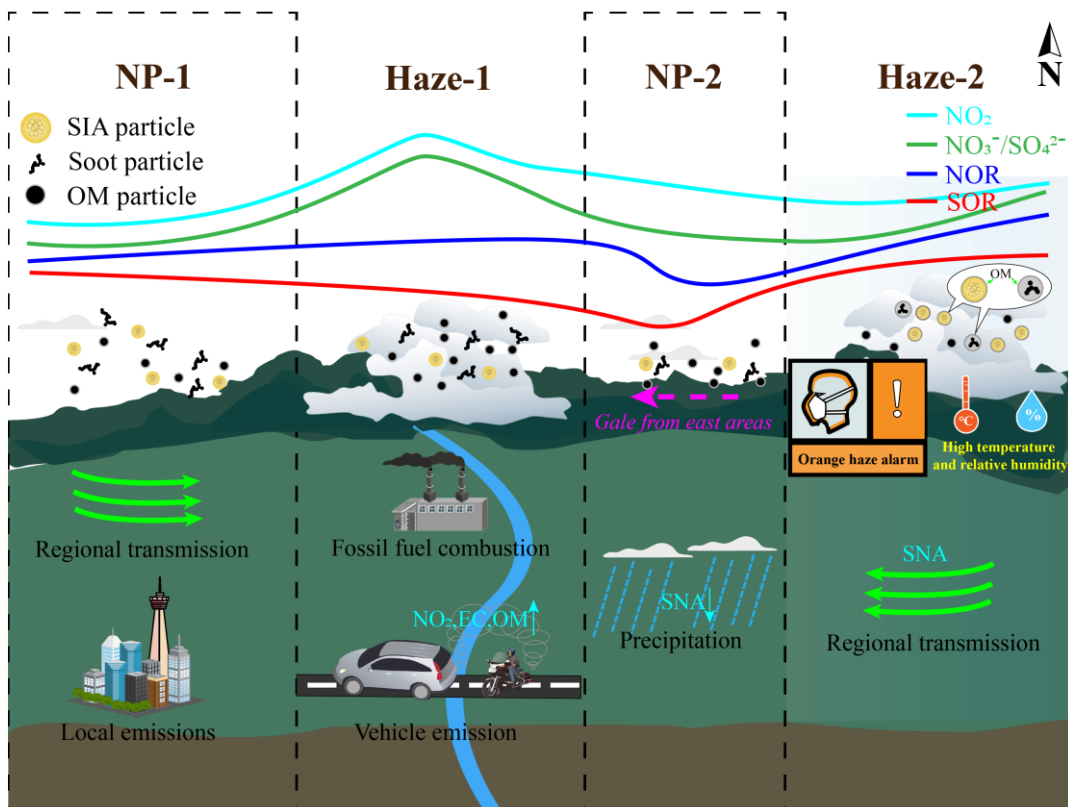
Figure 9: Conceptual model of the pollution evolution characteristics and formation mechanism in this study.

4.2 Implications

At present, the PM$_{2.5}$ concentration in Chengdu is still higher than the CNAAQS and WHO guidance standards. Therefore, reducing PM$_{2.5}$ emissions in Chengdu remains one of the important tasks to be faced in the future. Meanwhile, with the reduction of pollution and the enhancement of atmospheric oxidation in recent years, the formation mechanism of haze is also undergoing dynamic changes. This requires us to conduct timely research on the characteristics of PM$_{2.5}$ and provide the latest information for formulating new pollution reduction policies. This study investigated two different haze processes in Chengdu and revealed their formation mechanism, and the results emphasize that future pollution reduction not only needs to focus on local sources, especially motor vehicle emissions, but also on the contribution of regional transmission, which may be an important factor causing serious pollution.

The TEM-EDS results further emphasized the importance of studying individual aerosol particles and their mixing states. This is mainly reflected in: (1) The impact on health. Our study found that high levels of carbonaceous (OM- and soot-related) and fly ash/metal-related particles were present in the atmosphere of Chengdu, which include polycyclic aromatic hydrocarbons and various toxic metals (e.g., Pb, Zn, Cr, and Mn), both of which can pose serious risks to human health (Chen et al., 2017; Zhang et al., 2020b). Oberdörster et al. (2004) indicated that such ultrafine particles can have adverse health impacts via deposition in human lungs and further penetration into the blood. Meanwhile, as they age and mix in the atmosphere, their

health effects may also change. Li et al. (2013) found that the internal mixing of metals and acidic constituents likely solubilize metals and modify metal inclusion shapes, which can extend their toxicity into nontoxic parts in the particles. (2) The impact on climate. The light-absorbing particles (i.e., soot/BC and brown carbon (BrC)) have been proven to reduce solar radiation reaching the ground and further influence regional climate and crop production (Zhang et al., 2020b). In this study, we found that the number contribution of soot-related particles in each period was 12.5%–23.9%, which is much higher than the mass contribution of EC to $PM_{2.5}$ (5.8%–6.9%). With the aggravation of pollution, soot particles mixed with other particles, and their particle sizes and morphologies undergone significant changes, which will further lead to changes in their hygroscopicity and optical properties, meaning that, ultimately, their climatic and environmental effects may differ significantly from when they exist alone (Adachi et al., 2010; Zhang et al., 2018). For example, Zhang et al. (2023a) found that the formation of organic coatings under the high RH could induce soot redistribution from the particle center to the edge in embedded soot-containing particles compared to partly coated soot-containing particles, and the soot redistribution reduces ∼13% optical absorption enhancement of long-range transported soot particles, and the radiative absorption of long-range transported soot particles with a core-shell structure is overestimated by ∼20% in the traditional Mie optical model. Meanwhile, tarball particles, as the primary BrC type, have a wide absorption spectrum from visible to ultraviolet wavelengths (Hoffer et al., 2016) and were frequently detected in this study. Therefore, an accurate understanding of their contribution and secondary mixing would be of great value for evaluating the climatic effects of organic aerosol. Therefore, the single-particle analysis can provide in-depth information for studying the climatic and environmental effects of aerosol particles, which is crucial for numerical models applied in the evaluation of the impact of air pollution. However, current research on the mixing state of atmospheric particulate matter in Chengdu, even in Southwest China, is still insufficient, which leads to a serious lack of consideration of the mixing state of particulate matter in the current model.

Data availability. The data involved in this study are available online at a public data repository of Figshare via https://doi.org/10.6084/m9.figshare.24745581.

Author contribution: JZ and DS planned this campaign; JZ wrote the paper and led this research; YS, CC and WG performed the data analysis and wrote the manuscript together with JZ; QT, MF, TJ, QC, YL, WL and YW conducted experiments and instrument maintenance; XH, LH, WW and GW helped with the data analysis. All authors reviewed and edited the manuscript.

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

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Acknowledgements. We would like to thank Analysis and Testing Center of Southwest Jiaotong University for the technical support in the single particle sample determination.

Financial support. This research has been supported by the National Natural Science Foundation of China (grant no. U23A2030, 42205100 and 41805095), the Basic Research Cultivation Support Plan of Southwest Jiaotong University (2682023ZTPY016) and the Natural Science Foundation of Sichuan Province (2022NSFSC0982).

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References

Adachi, K., Chung, S. H., and Buseck, P. R.: Shapes of soot aerosol particles and implications for their effects on climate, J. Geophys. Res-Atmos., 115, D152061, https://doi.org/10.1029/2009jd012868, 2010.

Adachi, K., Sedlacek, A. J., Kleinman, L., Springston, S. R., Wang, J., Chand, D., Hubbe, J. M., Shilling, J. E., Onasch, T. B.,

650 Kinase, T., Sakata, K., Takahashi, Y., and Buseck, P. R.: Spherical tarball particles form through rapid chemical and physical changes of organic matter in biomass-burning smoke, Proc. Natl. Acad. Sci. U.S.A., 116, 19336–19341, https://doi.org/10.1073/pnas.1900129116, 2019.

An, Z., Huang, R. J., Zhang, R., Tie, X., Li, G., Cao, J., Zhou, W., Shi, Z., Han, Y., Gu, Z., and Ji, Y.: Severe haze in northern China: a synergy of anthropogenic emissions and atmospheric processes, Proc. Natl. Acad. Sci. U.S.A., 116, 8657-8666,

655 https://doi.org/10.1073/pnas.1900125116, 2019.

Chen, L., Zhang, J., Huang, X., Li, H., Dong, G., and Wei, S.: Characteristics and pollution formation mechanism of atmospheric fine particles in the megacity of Chengdu, China, Atmos. Res., 273, 106172, https://doi.org/10.1016/j.atmosres.2022.106172, 2022.

Chen, S., Xu, L., Zhang, Y., Chen, B., Wang, X., Zhang, X., Zheng, M., Chen, J., Wang, W., Sun, Y., Fu, P., Wang, Z., and Li,

660 W.: Direct observations of organic aerosols in common wintertime hazes in North China: insights into direct emissions from Chinese residential stoves, Atmos. Chem. Phys., 17, 1259-1270, https://doi.org/10.5194/acp-17-1259-2017, 2017.

Deng, J., Jiang, L., Miao, W., Zhang, J., Dong, G., Liu, K., Chen, J., Peng, T., Fu, Y., Zhou, Y., Huang, X., Hu, M., Wang, F., and Xiao, L.: Characteristics of fine particulate matter ($PM_{2.5}$) at Jinsha Site Museum, Chengdu, China, Environ. Sci. Pollut. Res. Int., 29, 1173-1183, https://doi.org/10.1007/s11356-021-15743-z, 2021.

665 Feng, T., Zhao, S., Bei, N., Liu, S., and Li, G.: Increasing atmospheric oxidizing capacity weakens emission mitigation effort in Beijing during autumn haze events, Chemosphere, 281, 130855, https://doi.org/10.1016/j.chemosphere.2021.130855, 2021.

Geng, G., Xiao, Q., Zheng, Y., Tong, D., Zhang, Y., Zhang, X., Zhang, Q., He, K., and Liu, Y.: Impact of China's air pollution prevention and control action plan on $PM_{2.5}$ chemical composition over eastern China, Sci. China Earth Sci., 62, 1872-1884, https://doi.org/10.1007/s11430-018-9353-x, 2019.

670 Group, G. M. W.: Burden of disease attributable to Coal-Burning and other major sources of air pollution in China, Special

Report 20, Heal. Effects Inst., Boston, MA, https://doi.org/10.3969/j.issn.1000-3045.2013.03.009, 2016.

Hoffer, A., Tóth, A., Nyirő-Kósa, I., Pósfai, M., and Gelencsér, A.: Light absorption properties of laboratory-generated tar ball particles, Atmos. Chem. Phys., 16, 239-246, https://doi.org/10.5194/acp-16-239-2016, 2016.

Huang, R. J., Zhang, Y., Bozzetti, C., Ho, K. F., Cao, J. J., Han, Y., Daellenbach, K. R., Slowik, J. G., Platt, S. M., Canonaco,
675 F., Zotter, P., Wolf, R., Pieber, S. M., Bruns, E. A., Crippa, M., Ciarelli, G., Piazzalunga, A., Schwikowski, M., Abbaszade, G., Schnelle-Kreis, J., Zimmermann, R., An, Z., Szidat, S., Baltensperger, U., El Haddad, I., and Prevot, A. S.: High secondary aerosol contribution to particulate pollution during haze events in China, Nature, 514, 218-222, https://doi.org/10.1038/nature13774, 2014.

Huang, X., Zhang, J., Zhang, W., Tang, G., and Wang, Y.: Atmospheric ammonia and its effect on $PM_{2.5}$ pollution in urban
680 Chengdu, Sichuan Basin, China, Environ. Pollut., 291, 118195, https://doi.org/10.1016/j.envpol.2021.118195, 2021a.

Huang, X., Zhang, J., Luo, B., Wang, L., Tang, G., Liu, Z., Song, H., Zhang, W., Yuan, L., and Wang, Y.: Water-soluble ions in $PM_{2.5}$ during spring haze and dust periods in Chengdu, China: Variations, nitrate formation and potential source areas, Environ. Pollut., 243, 1740-1749, https://doi.org/10.1016/j.envpol.2018.09.126, 2018.

Huang, X., Tang, G., Zhang, J., Liu, B., Liu, C., Zhang, J., Cong, L., Cheng, M., Yan, G., Gao, W., Wang, Y., and Wang, Y.:
685 Characteristics of $PM_{2.5}$ pollution in Beijing after the improvement of air quality, J. Environ. Sci-China, 100, 1-10, https://doi.org/10.1016/j.jes.2020.06.004, 2021.

Huang, X. J., Liu, Z. R., Liu, J. Y., Hu, B., Wen, T. X., Tang, G. Q., Zhang, J. K., Wu, F. K., Ji, D. S., Wang, L. L., and Wang, Y. S.: Chemical characterization and source identification of $PM_{2.5}$ at multiple sites in the Beijing–Tianjin–Hebei region, China, Atmos. Chem. Phys., 17, 12941–12962, https://doi.org/10.5194/acp-17-12941-2017, 2017.

690 Ji, D., Li, L., Wang, Y., Zhang, J., Cheng, M., Sun, Y., Liu, Z., Wang, L., Tang, G., Hu, B., Chao, N., Wen, T., and Miao, H.: The heaviest particulate air-pollution episodes occurred in northern China in January, 2013: Insights gained from observation, Atmos. Environ., 92, 546-556, https://doi.org/10.1016/j.atmosenv.2014.04.048, 2014.

Li, J. and Han, Z.: A modeling study of severe winter haze events in Beijing and its neighboring regions, Atmos. Res., 170, 87-97, https://doi.org/10.1016/j.atmosres.2015.11.009, 2016.

695 Li, L., Tan, Q., Zhang, Y., Feng, M., Qu, Y., An, J., and Liu, X.: Characteristics and source apportionment of $PM_{2.5}$ during persistent extreme haze events in Chengdu, southwest China, Environ. Pollut., 230, 718-729, https://dx.doi.org/10.1016/j.envpol.2017.07.029, 2017.

Li, L., An, J. Y., Zhou, M., Yan, R. S., Huang, C., Lu, Q., Lin, L., Wang, Y. J., Tao, S. K., Qiao, L. P., Zhu, S. H., and Chen, C. H.: Source apportionment of fine particles and its chemical components over the Yangtze River Delta, China during a heavy
700 haze pollution episode, Atmos. Environ., 123, 415-429, https://doi.org/10.1016/j.atmosenv.2015.06.051, 2015a.

Li, W. and Shao, L.: Transmission electron microscopy study of aerosol particles from the brown hazes in northern China, J.

Geophys. Res-Atmos., 114, D09302, https://doi.org/10.1029/2008jd011285, 2009.

Li, W., Wang, T., Zhou, S., Lee, S., Huang, Y., Gao, Y., and Wang, W.: Microscopic observation of metal-containing particles from Chinese continental outflow observed from a non-industrial site, Environ. Sci. Technol., 47, 9124-9131, https://doi.org/10.1021/es400109q, 2013.

Li, W., Chi, J., Shi, Z., Wang, X., Chen, B., Wang, Y., Li, T., Chen, J., Zhang, D., Wang, Z., Shi, C., Liu, L., and Wang, W.: Composition and hygroscopicity of aerosol particles at Mt. Lu in South China: Implications for acid precipitation, Atmos. Environ., 94, 626-636, https://doi.org/10.1016/j.atmosenv.2014.06.003, 2014.

Li, W., Sun, J., Xu, L., Shi, Z., Riemer, N., Sun, Y., Fu, P., Zhang, J., Lin, Y., Wang, X., Shao, L., Chen, J., Zhang, X., Wang, Z., and Wang, W.: A conceptual framework for mixing structures in individual aerosol particles, J. Geophys. Res-Atmos., 121, 13,784-13,798, https://doi.org/10.1002/2016jd025252, 2016.

Li, W. J., Chen, S. R., Xu, Y. S., Guo, X. C., Sun, Y. L., Yang, X. Y., Wang, Z. F., Zhao, X. D., Chen, J. M., and Wang, W. X.: Mixing state and sources of submicron regional background aerosols in the northern Qinghai–Tibet Plateau and the influence of biomass burning, Atmos. Chem. Phys., 15, 13365-13376, https://doi.org/10.5194/acp-15-13365-2015, 2015b.

Liao, T., Wang, S., Ai, J., Gui, K., Duan, B., Zhao, Q., Zhang, X., Jiang, W., and Sun, Y.: Heavy pollution episodes, transport pathways and potential sources of $PM_{2.5}$ during the winter of 2013 in Chengdu (China), Sci. Total Environ., 584, 1056-1065, https://dx.doi.org/10.1016/j.scitotenv.2017.01.160, 2017.

Lin, Y., Wang, Y., Pan, B., Hu, J., Guo, S., Levy Zamora, M., Tian, P., Su, Q., Ji, Y., Zhao, J., Gomez-Hernandez, M., Hu, M., and Zhang, R.: Formation, radiative forcing, and climatic effects of severe regional haze, Atmos. Chem. Phys., 22, 4951-4967, https://doi.org/10.5194/acp-22-4951-2022, 2022.

Liu, L., Zhang, J., Zhang, Y., Wang, Y., Xu, L., Yuan, Q., Liu, D., Sun, Y., Fu, P., Shi, Z., and Li, W.: Persistent residential burning-related primary organic particles during wintertime hazes in North China: insights into their aging and optical changes, Atmos. Chem. Phys., 21, 2251-2265, https://doi.org/10.5194/acp-21-2251-2021, 2021.

Liu, L., Zhang, J., Xu, L., Yuan, Q., Huang, D., Chen, J., Shi, Z., Sun, Y., Fu, P., Wang, Z., Zhang, D., and Li, W.: Cloud scavenging of anthropogenic refractory particles at a mountain site in North China, Atmos. Chem. Phys., 18, 14681-14693, https://doi.org/10.5194/acp-18-14681-2018, 2018.

Liu, X. G., Li, J., Qu, Y., Han, T., Hou, L., Gu, J., Chen, C., Yang, Y., Liu, X., Yang, T., Zhang, Y., Tian, H., and Hu, M.: Formation and evolution mechanism of regional haze: a case study in the megacity Beijing, China, Atmos. Chem. Phys., 13, 4501-4514, https://doi.org/10.5194/acp-13-4501-2013, 2013.

Liu, Z., Hu, B., Zhang, J., Yu, Y., and Wang, Y.: Characteristics of aerosol size distributions and chemical compositions during wintertime pollution episodes in Beijing, Atmos. Res., 168, 1-12, https://doi.org/10.1016/j.atmosres.2015.08.013, 2016.

Luo, J., Zhang, J., Huang, X., Liu, Q., Luo, B., Zhang, W., Rao, Z., and Yu, Y.: Characteristics, evolution, and regional

differences of biomass burning particles in the Sichuan Basin, China, J. Environ. Sci-China, 89, 35-46, https://doi.org/10.1016/j.jes.2019.09.015, 2020.

735   Lv, L., Wei, P., Hu, J., Chen, Y., and Shi, Y.: Source apportionment and regional transport of $PM_{2.5}$ during haze episodes in Beijing combined with multiple models, Atmos. Res., 266, 105957, https://doi.org/10.1016/j.atmosres.2021.105957, 2022.

Lv, L., Chen, Y., Han, Y., Cui, M., Wei, P., Zheng, M., and Hu, J.: High-time-resolution $PM_{2.5}$ source apportionment based on multi-model with organic tracers in Beijing during haze episodes, Sci. Total Environ., 772, 144766, https://doi.org/10.1016/j.scitotenv.2020.144766, 2021.

740   Ma, L., Li, M., Zhang, H., Li, L., Huang, Z., Gao, W., Chen, D., Fu, Z., Nian, H., Zou, L., Gao, J., Chai, F., and Zhou, Z.: Comparative analysis of chemical composition and sources of aerosol particles in urban Beijing during clear, hazy, and dusty days using single particle aerosol mass spectrometry, J. Clean. Prod., 112, 1319-1329, https://dx.doi.org/10.1016/j.jclepro.2015.04.054, 2016.

Marple, V. A., Rubow, K. L., and Olson, B. A.: Inertial, gravitational, centrifugal, and thermal collection techniques, in Aerosol
745   Measurement, edited by K. Willike and P. A. Baron, 206–233, Van Nostrand Reinhold, New York., 1993.

Mikhailov, E. F., Mironov, G. N., Pöhlker, C., Chi, X., Krüger, M. L., Shiraiwa, M., Förster, J. D., Pöschl, U., Vlasenko, S. S., Ryshkevich, T. I., Weigand, M., Kilcoyne, A. L. D., and Andreae, M. O.: Chemical composition, microstructure, and hygroscopic properties of aerosol particles at the Zotino Tall Tower Observatory (ZOTTO), Siberia, during a summer campaign, Atmos. Chem. Phys., 15, 8847-8869, https://doi.org/10.5194/acp-15-8847-2015, 2015.

750   Oberdörster, G., Sharp, Z., Atudorei, V., Elder, A., Gelein, R., Kreyling, W., and Cox, C.: Translocation of inhaled ultrafine particles to the brain, Inhal. Toxicol., 16, 437-445, https://doi.org/10.1080/08958370490439597, 2004.

Pöschl, U.: Atmospheric aerosols: composition, transformation, climate and health effects, Angew. Chem. Int. Edit., 44, 7520-7540, https://doi.org/10.1002/anie.200501122, 2005.

Paatero, P. and Hopke, P. K.: Discarding or downweighting high-noise variables in factor analytic models, Anal. Chim. Acta.,
755   490, 277-289, https://doi.org/10.1016/s0003-2670(02)01643-4, 2003.

Paatero, P. and Tapper, U.: Positive matrix factorization-a nonnegative factor model with optimal utilization of error-estimates of data values, Environmetrics, 5, 111–126, https://doi.org/10.1002/ENV.3170050203, 1994.

Peng, C., Yang, F., Tian, M., Shi, G., Li, L., Huang, R. J., Yao, X., Luo, B., Zhai, C., and Chen, Y.: Brown carbon aerosol in two megacities in the Sichuan Basin of southwestern China:Light absorption properties and implications, Sci. Total Environ.,
760   719, 137483, https://doi.org/10.1016/j.scitotenv.2020.137483, 2020.

Seinfeld, J. H. and Pandis, S. N.: Atmospheric chemistry and physics: from air pollution to climate change. John Wiley & Sons, New York., 44, 1376-1377, https://doi.org/10.5860/CHOICE.44-4512, 2006.

Song, T., Feng, M., Song, D., Zhou, L., Qiu, Y., Tan, Q., and Yang, F.: Enhanced nitrate contribution during winter haze events

in a megacity of Sichuan Basin, China: formation mechanism and source apportionment, J. Clean. Prod., 370, 133272, https://doi.org/10.1016/j.jclepro.2022.133272, 2022.

Tao, J., Zhang, L., Engling, G., Zhang, R., Yang, Y., Cao, J., Zhu, C., Wang, Q., and Luo, L.: Chemical composition of $PM_{2.5}$ in an urban environment in Chengdu, China: Importance of springtime dust storms and biomass burning, Atmos. Res., 122, 270-283, https://doi.org/10.1016/j.atmosres.2012.11.004, 2013.

Tao, J., Gao, J., Zhang, L., Zhang, R., Che, H., Zhang, Z., Lin, Z., Jing, J., Cao, J., and Hsu, S. C.: $PM_{2.5}$ pollution in a megacity of southwest China: source apportionment and implication, Atmos. Chem. Phys., 14, 8679-8699, https://doi.org/10.5194/acp-14-8679-2014, 2014.

Turpin, B. J. and Lim, H.J.: Species Contributions to $PM_{2.5}$ mass concentrations: revisiting common assumptions for estimating organic mass, Aerosol Sci. Technol., 35, 602-610, https://doi.org/10.1080/02786820119445, 2001.

Wang, H., Tian, M., Chen, Y., Shi, G., Liu, Y., Yang, F., Zhang, L., Deng, L., Yu, J., Peng, C., and Cao, X.: Seasonal characteristics, formation mechanisms and source origins of $PM_{2.5}$ in two megacities in Sichuan Basin, China, Atmos. Chem. Phys., 18, 865-881, https://doi.org/10.5194/acp-18-865-2018, 2018.

Wang, J., Gao, J., Che, F., Wang, Y., Lin, P., and Zhang, Y.: Decade-long trends in chemical component properties of $PM_{2.5}$ in Beijing, China (2011−2020), Sci. Total Environ., 832, 154664, https://doi.org/10.1016/j.scitotenv.2022.154664, 2022a.

Wang, X., Shen, Z., Liu, F., Lu, D., Tao, J., Lei, Y., Zhang, Q., Zeng, Y., Xu, H., Wu, Y., Zhang, R., and Cao, J.: Saccharides in summer and winter $PM_{2.5}$ over Xi'an, Northwestern China: Sources, and yearly variations of biomass burning contribution to $PM_{2.5}$, Atmos. Res., 214, 410-417, https://doi.org/10.1016/j.atmosres.2018.08.024, 2018b.

Wang, Y., Jin, X., Liu, Z., Wang, G., Tang, G., Lu, K., Hu, B., Wang, S., Li, G., An, X., Wang, C., Hu, Q., He, L., Zhang, F., and Zhang, Y.: Progress in quantitative research on the relationship between atmospheric oxidation and air quality, J. Environ. Sci-China, 123, 350-366, https://doi.org/10.1016/j.jes.2022.06.029, 2023.

Wang, Y., Hu, M., Hu, W., Zheng, J., Niu, H., Fang, X., Xu, N., Wu, Z., Guo, S., Wu, Y., Chen, W., Lu, S., Shao, M., Xie, S., Luo, B., and Zhang, Y.: Secondary formation of aerosols under typical high-humidity conditions in wintertime Sichuan Basin, China: a contrast to the North China Plain, J. Geophys. Res-Atmos., 126, D03456, https://doi.org/10.1029/2021jd034560, 2021.

Wang, Y. S., Yao, L., Wang, L. L., Liu, Z. R., Ji, D. S., Tang, G. Q., Zhang, J. K., Sun, Y., Hu, B., and Xin, J. Y.: Mechanism for the formation of the January 2013 heavy haze pollution episode over central and eastern China, Sci. China Earth Sci., 57, 14-25, https://doi.org/10.1007/s11430-013-4773-4, 2014.

Wang, Z., Wang, R., Wang, J., Wang, Y., McPherson Donahue, N., Tang, R., Dong, Z., Li, X., Wang, L., Han, Y., and Cao, J.: The seasonal variation, characteristics and secondary generation of $PM_{2.5}$ in Xi'an, China, especially during pollution events, Environ. Res., 212, 113388, https://doi.org/10.1016/j.envres.2022.113388, 2022b.

Xu, H., Cao, J., Chow, J. C., Huang, R. J., Shen, Z., Chen, L. W. A., Ho, K. F., and Watson, J. G.: Inter-annual variability of

795   wintertime $PM_{2.5}$ chemical composition in Xi'an, China: Evidences of changing source emissions, Sci. Total Environ., 545, 546-555, https://dx.doi.org/10.1016/j.scitotenv.2015.12.070, 2016.

Xu, P., Zhang, J., Ji, D., Liu, Z., Tang, G., Jiang, C., and Wang, Y.: Characterization of submicron particles during autumn in Beijing, China, J. Environ. Sci-China, 63, 16-27, https://doi.org/10.1016/j.jes.2017.03.036, 2018.

Yang, Y. R., Liu, X. G., Qu, Y., An, J. L., Jiang, R., Zhang, Y. H., Sun, Y. L., Wu, Z. J., Zhang, F., Xu, W. Q., and Ma, Q. X.:
800   Characteristics and formation mechanism of continuous hazes in China: a case study during the autumn of 2014 in the North China Plain, Atmos. Chem. Phys., 15, 8165-8178, https://doi.org/10.5194/acp-15-8165-2015, 2015.

Yuan, Q., Xu, J., Liu, L., Zhang, A., Liu, Y., Zhang, J., Wan, X., Li, M., Qin, K., Cong, Z., Wang, Y., Kang, S., Shi, Z., Pósfai, M., and Li, W.: Evidence for large amounts of brown carbonaceous tarballs in the Himalayan atmosphere, Environ. Sci. Technol. Lett., 8, 16-23, https://doi.org/10.1021/acs.estlett.0c00735, 2020.

805   Zhan, Y., Xie, M., Wang, T., Chen, P., Tian, J., Zhu, K., Luo, Y., Zhao, R., Li, S., Zhuang, B., and Li, M.: Quantifying the seasonal variations and regional transport of $PM_{2.5}$ in the Yangtze River Delta region, China: characteristics, sources, and health risks, Atmos. Chem. Phys., 23, 9837-9852, https://doi.org/10.5194/acp-23-9837-2023, 2023.

Zhang, C., Zou, Z., Chang, Y., Zhang, Y., Wang, X., and Yang, X.: Source assessment of atmospheric fine particulate matter in a Chinese megacity: insights from long-term, high-time resolution chemical composition measurements from Shanghai
810   flagship monitoring supersite, Chemosphere, 251, 126598, https://doi.org/10.1016/j.chemosphere.2020.126598, 2020a.

Zhang, J., Huang, X., Yu, Y., Liu, Q., Zhang, J., Song, H., and Wang, Y.: Insights into the characteristics of aerosols using an integrated single particle–bulk chemical approach, Atmos. Res., 250, 105374, https://doi.org/10.1016/j.atmosres.2020.105374, 2021a.

Zhang, J., Li, J., Su, Y., Chen, C., Chen, L., Huang, X., Wang, F., Huang, Y., and Wang, G.: Interannual evolution of the
815   chemical composition, sources and processes of $PM_{2.5}$ in Chengdu, China: insights from observations in four winters, J. Environ. Sci-China, 138, 32-45, https://doi.org/10.1016/j.jes.2023.02.055, 2024.

Zhang, J., Li, W., Wang, Y., Teng, X., Zhang, Y., Xu, L., Yuan, Q., Wu, G., Niu, H., and Shao, L.: Structural collapse and coating composition changes of soot particles during long-range transport, J. Geophys. Res-Atmos., 128, e2023JD038871, https://doi. org/10.1029/2023JD038871, 2023a.

820   Zhang, J., Huang, X., Li, J., Chen, L., Zhao, R., Wang, R., Sun, W., Chen, C., Su, Y., Wang, F., Huang, Y., and Lin, C.: Chemical composition, sources and evolution of $PM_{2.5}$ during wintertime in the city cluster of southern Sichuan, China, Atmos. Pollut. Res., 14, 101635, https://doi.org/10.1016/j.apr.2022.101635, 2023b.

Zhang, J., Liu, L., Xu, L., Lin, Q., Zhao, H., Wang, Z., Guo, S., Hu, M., Liu, D., Shi, Z., Huang, D., and Li, W.: Exploring wintertime regional haze in northeast China: role of coal and biomass burning, Atmos. Chem. Phys., 20, 5355-5372,
825   https://doi.org/10.5194/acp-20-5355-2020, 2020b.

Zhang, J., Liu, L., Wang, Y., Ren, Y., Wang, X., Shi, Z., Zhang, D., Che, H., Zhao, H., Liu, Y., Niu, H., Chen, J., Zhang, X., Lingaswamy, A. P., Wang, Z., and Li, W.: Chemical composition, source, and process of urban aerosols during winter haze formation in Northeast China, Environ. Pollut., 231, 357-366, https://doi.org/10.1016/j.envpol.2017.07.102, 2017a.

Zhang, J., Yuan, Q., Liu, L., Wang, Y., Zhang, Y., Xu, L., Pang, Y., Zhu, Y., Niu, H., Shao, L., Yang, S., Liu, H., Pan, X., Shi, Z., Hu, M., Fu, P., and Li, W.: Trans-regional transport of haze particles from the North China Plain to Yangtze River Delta during Winter, J. Geophys. Res-Atmos., 126, D033778, https://doi.org/10.1029/2020jd033778, 2021b.

Zhang, J. K., Sun, Y., Liu, Z. R., Ji, D. S., Hu, B., Liu, Q., and Wang, Y. S.: Characterization of submicron aerosols during a month of serious pollution in Beijing, 2013, Atmos. Chem. Phys., 14, 2887-2903, https://doi.org/10.5194/acp-14-2887-2014, 2014.

Zhang, J. K., Luo, B., Zhang, J. Q., Ouyang, F., Song, H. Y., Liu, P. C., Cao, P., Schäfer, K., Wang, S. G., Huang, X. J., and Lin, Y. F.: Analysis of the characteristics of single atmospheric particles in Chengdu using single particle mass spectrometry, Atmos. Environ., 157, 91-100, https://doi.org/10.1016/j.atmosenv.2017.03.012, 2017b.

Zhang, Q., Shen, Z., Cao, J., Zhang, R., Zhang, L., Huang, R. J., Zheng, C., Wang, L., Liu, S., Xu, H., Zheng, C., and Liu, P.: Variations in $PM_{2.5}$, TSP, BC, and trace gases (NO_2, SO_2, and O_3) between haze and non-haze episodes in winter over Xi'an, China, Atmos. Environ., 112, 64-71, https://dx.doi.org/10.1016/j.atmosenv.2015.04.033, 2015.

Zhang, R., Khalizov, A. F., Pagels, J., Zhang, D., Xue, H., and McMurry, P. H.: Variability in morphology, hygroscopicity, and optical properties of soot aerosols during atmospheric processing, Proc. Natl. Acad. Sci. U. S. A., 105, 10291-10296, https://doi.org/10.1073/pnas.0804860105, 2008.

Zhang, Y., Yuan, Q., Huang, D., Kong, S., Zhang, J., Wang, X., Lu, C., Shi, Z., Zhang, X., Sun, Y., Wang, Z., Shao, L., Zhu, J., and Li, W.: Direct observations of fine primary particles from residential coal burning: insights into their morphology, composition, and hygroscopicity, J. Geophys. Res-Atmos., 123, 12964-12979, https://doi.org/10.1029/2018jd028988, 2018.

Zhu, X. W., Tang, G. Q., Hu, B., Wang, L. L., Xin, J. Y., Zhang, J. K., Liu, Z. R., Münkel, C., and S., W. Y.: Regional pollution and its formation mechanism over North China Plain: A case study with ceilometer observations and model simulations, J. Geophys. Res-Atmos., 121, D14574, https://doi.org/10.1002/2016JD025730, 2016.