

1 **Author's Response**

2 Dear Editor,

3 We sincerely thank for your helpful comments and guidance. We have provided responses
4 to your comment below in blue.

5
6 **Co-Editor's comments:**

7 Thanks for submitting the revised manuscript. It could be accepted for publication after
8 addressing one remain issue. The data presented in the paper is valuable for the
9 community and I strongly suggest to deposit data to a public data repositories and add a
10 data availability statement in the manuscript. For your reference, please check the data
11 policy of ACP.

12 https://www.atmospheric-chemistry-and-physics.net/about/data_policy.html

13
14 **RESPONSE:**

15 In the revised MS, we add the data availability statement as follows,

16 *'Data availability.* The chemical composition data of the main sources used in this
17 publication has been deposited to the Mendeley Data and can be downloaded freely from
18 <http://dx.doi.org/10.17632/x8dfshjt9j.1>.'

19

20 **Characteristics of the main primary source profiles of particulate matter**
21 **across China: from 1987 to 2017**

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29

30 **Abstract**

31 Based on the published literatures and typical profiles from the source library of Nankai
32 University, a total of 3326 chemical profiles of the main primary sources of ambient
33 particulate matter across China from 1987 to 2017, are investigated and reviewed to trace
34 the evolution of their main components and identify the main influencing factors to the
35 evolution. In general, the source chemical profiles are varied with sources and influenced
36 by different sampling methods. The most complicated profiles are likely attributed to coal
37 combustion and industrial emissions. The profiles of vehicle emissions are dominated by
38 organic carbon (OC) and elemental carbon (EC), and varied with the changing standards
39 of sulfur and additives in the gasoline and diesel as well as the sampling methods. In
40 addition to sampling methods, the profiles of biomass burning and cooking emissions are
41 also impacted by the biofuel categories and cooking types, respectively. The variations of

42 the chemical profiles of different sources, and the homogeneity of the sub-type source
43 profiles within the same source category were examined with uncertainty analysis and
44 cluster analysis. As a result, a relatively large variation has been found in the source
45 profiles of coal combustion, vehicle emissions, industry emissions and biomass burning,
46 indicating that these sources have the priority to establish the local profiles due to their
47 high uncertainties. The presented results highlight the need for increasing investigation of
48 more specific markers (e.g., isotopes, organic compounds and gaseous precursors) beyond
49 routine measured components to discriminate sources. Although the chemical profiles of
50 main sources have been reported previously in literatures, it should be noted that some of
51 these chemical profiles are out of date currently, which needs to be updated immediately.
52 Additionally, specific focus should be placed on the sub-type of source profiles in the
53 future, especially for local industrial emissions in China.

54 **Keywords:** Source profiles; particulate matter; source apportionment.

55
56

57 **1. Introduction**

58 In light of preventing us from being exposure to high level of PM, source apportionment
59 technique is a critical tool to help us in quantitative recognition of the source contributions
60 of ambient particulate matter (PM) and developing efficient and cost-effective abatement
61 policy. Given the thousands of PM sources in real-world, localized source information is
62 crucial to accurate source identification and contribution estimation. The physical and
63 chemical characterization of primary sources, termed source profile, is of great
64 importance in the application of receptor models for source apportionment study as it
65 characterizing specific sources from the physicochemical point of view that revealing the

66 signatures of source emissions (Watson, 1984; Bi et al., 2007; Simon et al., 2010; Hopke,
67 2016). Since the real-world measurement of source samples is costly and tough, many
68 studies used factor analytical models (source-unknown models, such as positive matrix
69 factorization (PMF), principle component analysis (PCA) etc.) instead of chemical mass
70 balance (CMB) model (source profiles need to be known *a priori*) to estimate source
71 contributions. However, the measurement of sources is essentially a very important basic
72 work to help obtain source signatures and then makes source identification and
73 apportionment possible. It should be noted that the interpretation of factors deduced from
74 PMF analysis is based on the available source profiles (Shi et al., 2009; Simon et al., 2010;
75 Liu et al., 2017; Hopke, 2016). In addition to source apportionment study, source profiles
76 have also played an important role in calculating source-specific emissions of individual
77 compounds and converting total emissions from sources into the speciated emissions for
78 air quality models, which can further provide effective strategies for environmental
79 management (Reff et al., 2009; Simon et al., 2010).

80 In the past decades, source profiles of PM from a variety of source types were
81 substantially developed all over the world, especially in USA (Simon et al., 2010), Europe
82 (Pernigotti et al., 2016) and East Asia (Liu et al., 2017). The time evolution of source
83 profiles is partly determined by the source apportionment techniques. In general, the
84 receptor model was developed based on the assumption of mass conservation (Winchester
85 and Nifong, 1971; Miller et al., 1972). A mass balance equation represents that the
86 measured particle mass can be regarded as the linear sum of the mass of all chemical
87 components contributed from several sources (Cooper and Watson, 1980; Watson, 1984).

88 Initially, the mass balance equations were deployed for a couple of specific elements and
89 source types in America (Miller et al., 1972; Hopke, 2016). Elements, ions and carbon
90 materials gradually tend to be the routine chemical species in the source apportionment of
91 PM. With the development of advanced sampling and chemical analysis techniques, more
92 valuable information, such as organic compounds (Schauer and Cass, 2000; Simoneit et
93 al., 1999), isotopic measurement of radiocarbon (Wang et al., 2017), sulfur (Han et al.,
94 2016) and nitrogen (Pan et al., 2016), high-resolution aerosol mass spectra (Zhang et al.,
95 2011) and particle size distribution (Zhou et al., 2004) etc., have been explored to further
96 expand the existing or new profiles. These information have been proved to provide
97 source specificity capable of being incorporated into receptor models as new markers
98 (Zheng et al., 2002), constraining source contributions (Amato et al., 2009), and
99 developing new models (Ulbrich et al., 2012; Dai et al., 2019). For example, Dai et al.
100 (2019) developed a size-resolved CMB approach for source apportionment of PM based
101 on the size profiles of sources. The new valuable information improves the performance
102 of source apportionment models to obtain more precise and reliable results.

103 Since the 1980s, source profile studies were initially implemented in China (Dai et al.,
104 1987). During the past three decades, hundreds of source profiles have been achieved
105 across China (Zhao et al., 2006; Bi et al., 2007; Zhao et al., 2007; Kong et al., 2011; Kong
106 et al., 2014; Qi et al., 2015; Wang et al., 2015; Zhang et al., 2015; Zhao et al., 2015; Pei et
107 al., 2016; Tian et al., 2017; Guo et al., 2017). These profiles covered more than forty cities
108 and several source types. The main ubiquitous sources of atmospheric PM in China during
109 the past three decades can be roughly divided into coal combustion sources (CC, with

110 sub-type sources of coal-fired power plants, coal-fired industrial boiler and residential
111 coal combustion), vehicle exhaust (VE, gasoline and diesel engines), industrial processes
112 emissions (IE), biomass burning (BB), cooking emissions (CE), fugitive dust (FD, with
113 sub-type sources of soil fugitive dust, construction dust and road dust) and other localized
114 specific sources. These available profiles have filled the gap of the knowledge of source
115 compositions and provided effective markers for the source apportionment studies.
116 However, the current state and potential issues of pre-existing primary source profiles of
117 PM in China are still unclear, it is time to overview these source profiles along the time
118 line and add more profile knowledge to the atmospheric research community.

119 In fact, more real-world measured profiles in China were actually not published. A
120 database of particulate source profiles founded by Nankai University contains 2870
121 profiles measured across China since the 1980s. In this paper, the characteristics and time
122 evolution of the published primary profiles and some typical profiles of particulate matter
123 founded by Nankai University were discussed. To collect the potential published data
124 related to source profiles, a two-round literature search work covering literature from
125 1980 to 2018 was done in this work. In the first round of searching, two authors are
126 responsible for the same source to ensure every source category has been searched twice
127 independently. The search keywords depend on source category. The following keywords
128 for each source were used individually or in combination. As for *CC* sources, the key
129 words are “coal combustion/coal burning/coal-fired boiler/coal-fired power
130 plant/residential coal” and “source profile/chemical profile/particle composition”. The key
131 words for other sources are shown as follows. IE: “industrial emission” and “source

132 profile/chemical profile/particle composition”; VE: “vehicle emission/exhaust
133 emission/traffic emission/diesel engine/truck emission/gasoline engine/on-road
134 vehicle/tunnel experiment/chassis dynamometer/portable emission measurement system”
135 and “source profile/chemical profile/particle composition”; CE: “cooking emission” and
136 “source profile/chemical profile/particle composition”; BB: “biomass burning/bio-fuel
137 boiler” and “source profile/chemical profile/particle composition”; FD: “soil/fugitive
138 dust/crustal material/construction dust/road dust” and “source profile/chemical
139 profile/particle composition”. Papers and dissertations in Chinese on China National
140 Knowledge Infrastructure (CNKI) and papers in English on the web of science were
141 searched using above keywords, respectively. The duplicated paper was then
142 double-checked and excluded. The papers with topic related to source profiles but without
143 providing any information of real-measured sources were also excluded. For example,
144 papers reported source apportionment results with the use of PMF and CMB but without
145 reporting local profiles were not taken into account. As a result, a total of 193 papers have
146 been collected from these efforts. In the second round of searching, the valid papers with
147 available source profile data and detailed source sampling and chemical analysis methods
148 were counted and used for post-analysis. Finally, a total of 456 published source profiles,
149 coupled with the database of source profiles (2870 profiles) founded by Nankai University
150 are reviewed in this work.

151 This review is based on the following ideas. In Section 2.1, we summarized the types and
152 the number of particulate source profiles in China published since the 1980s, and
153 reviewed the technological development of the sampling and chemical analytical methods

154 for source samples. In Section 2.2, the characteristics and time evolutions of the
155 ubiquitous source profiles in China (CC, VE, IE, BB, CE and FD) in terms of the marker
156 species of each main source and the effect of various impact factors on source profiles
157 have been discussed. In section 2.3, the homogeneity of the sources within the same
158 source category and the heterogeneity between different source categories were further
159 investigated by using the coefficient of variation (CV, the standard deviation divided by
160 the mean) and cluster analysis, respectively. In Section 3, we summarized the main
161 findings and a few issues of current source profiles, as well as the future requirements for
162 the on-going development of source profiles in China.

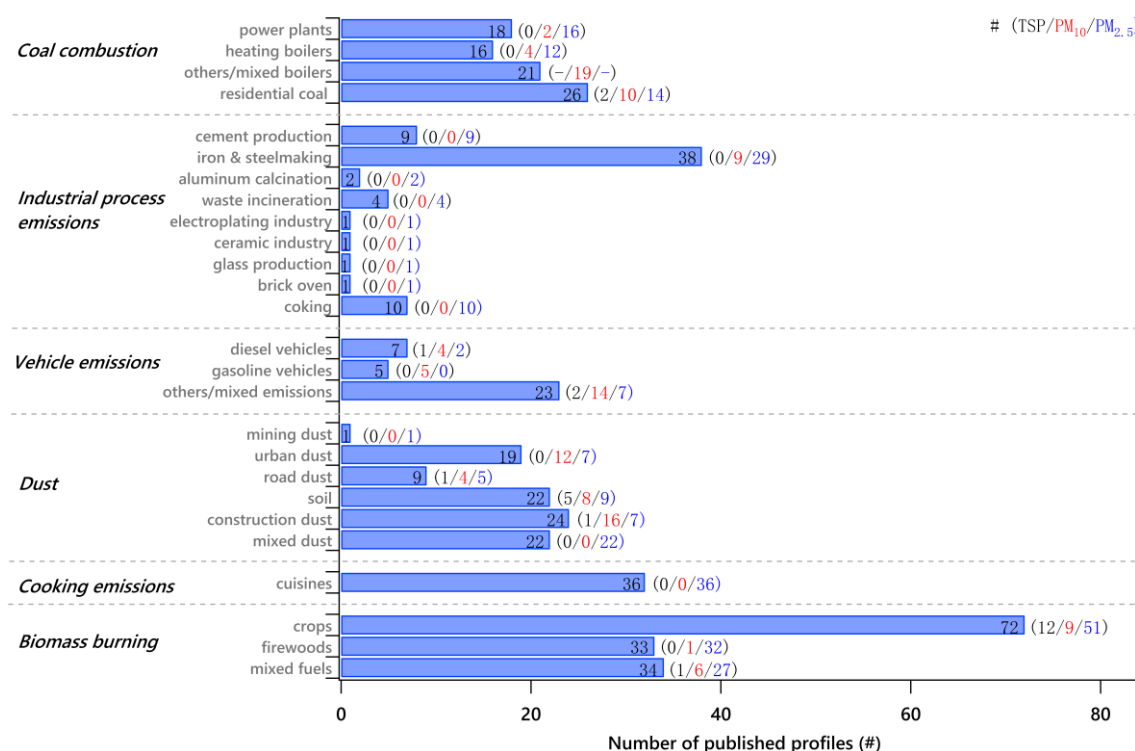
163

164 **2. Overview of source profiles across China**

165 After literature searching (peer-reviewed papers published in international and Chinese
166 journals), a total of 456 published source profiles since the 1980s across China were
167 collected. In general, all of these profiles were subjectively divided into the above six
168 source categories, with 81 of them attributed to CC, 67 to IE, 35 to VE, 98 to FD, 36 to
169 CE, and 139 to BB. For the certain aerodynamic sizes, we obtained a total of 306 PM_{2.5}
170 profiles, 123 PM₁₀ profiles, and 27 for other sizes. The overview of these profiles are
171 shown in Fig. 1.

172 These published profiles were detected in different parts of China. In eastern China, there
173 are published profiles of 35 CC (excluded residential coal combustion), 14 IE, 14 VE, 18
174 BB, 2 CE, and 14 FD; in northern China, there are published profiles of 16 CC, 23 IE, 9
175 VE, 8 BB, 13 CE, and 62 FD; in western China, there are only profiles of 20 CC; in

176 southern China, there are published profiles of 10 VE, 10 CE, and 5 FD; in central China,
 177 there are published profiles of 17 BB. The profiles of residential coal combustion are
 178 mainly detected in the regions that have obvious activities of residential coal burning,
 179 such as the northern and western China. The region of different parts of China was
 180 defined by Zhu et al. (2018).



181
 182 **Figure 1.** Overview of the published source profiles across China.

183
 184 **2.1 Development of sampling and analysis techniques**

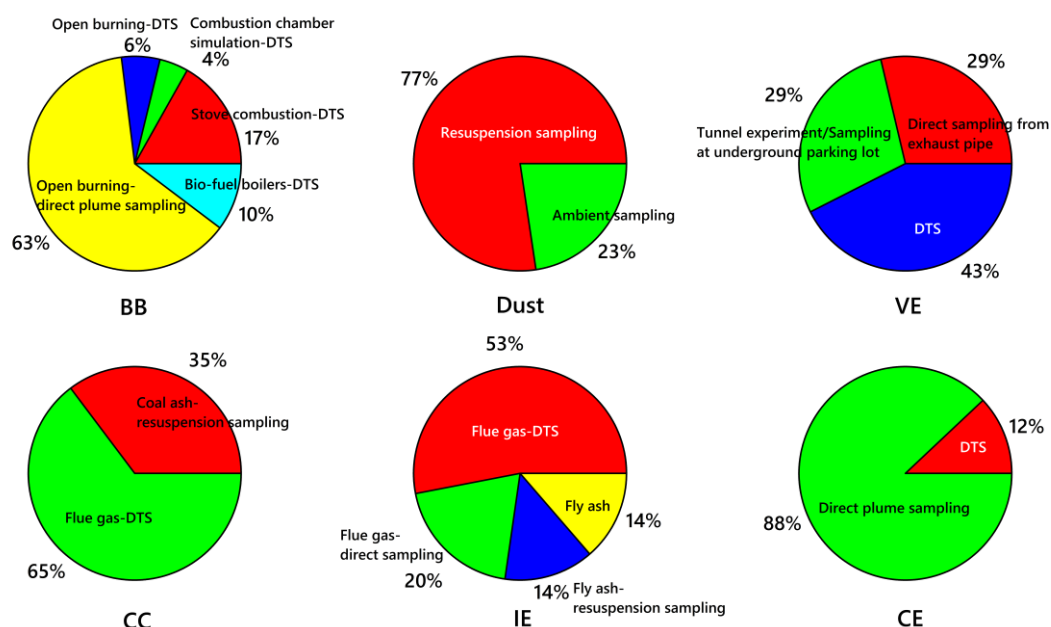
185 *Sampling for source emissions.* In the past three decades, the sampling techniques used in
 186 the source apportionment research in China have been significantly improved to catch the
 187 real-world emissions of particles from various complex primary sources. In the 1980s, CC
 188 is the predominant sources of PM in China (Dai et al., 1987). The source measurement of
 189 CC was mainly performed by collecting the dust directly from the precipitators. Source

190 samples of FD were collected from the surface of fugitive dust sources (soil, road dust, et
191 al.) (Dai et al., 1987; Qu, 2013). Apparently, such sampling method cannot catch the
192 real-world emissions from the sources to the ambient air, especially for the CC or other
193 emission sources with humid and high-heat fume. The compositions of the PM in such
194 fume appears to be changing due to the physical condensation and chemical reactions
195 during their dispersion process in the ambient air. Since the 1970s, dilution tunnel
196 sampling method (DTSM) has been developed to originally obtain source samples from
197 vehicle emissions that could be close to the real compositions from the sources
198 (Hildemann et al., 1989). Subsequently, various dilution tunnels have been developed
199 with different tunnel materials, resident time, dilution ratios, diameter of effective mixing
200 lengths to collect particles emissions from stationary sources (Houck et al., 1982; Smith et
201 al., 1982; Hildemann, 1989). The development and application of such technique in China
202 was after 2000 (Ge et al., 2001; Ge et al., 2004), while it has been widely used nowadays
203 (England et al., 2000; Lind et al., 2003; Ferge et al., 2004; Zhou et al., 2006; Li et al.,
204 2009; Wang et al., 2012).

205 As for fugitive dust, another problem is to collect the particle samples with certain
206 aerodynamic size from the dust samples. In the 1980s-1990s, the Barco
207 particle size analyzer was used to obtain the size distributions from the source samples
208 (Kauppinen et al., 1991). Due to the low efficiency and potential safety risk of Barco
209 sampler, a new sampling technique called the resuspended chamber (RSM) was
210 developed in the 1990s by Chow et al. (1994), which has been widely used since 2000 in
211 China. This method is capable of obtaining the particle sample with certain aerodynamic

212 sizes from the dust powder collected from the source field. Nowadays, most source
 213 samples with the particle aerodynamic size of 2.5 μm or 10 μm of fugitive dust were
 214 collected by the resuspended sampling method in China (Ho et al., 2003; Zhao et al.,
 215 2006). Although the resuspended chamber couldn't completely simulate the real
 216 environment, it still is the best available choice for the collection of fugitive dust samples
 217 until now.

218



219

220 **Figure 2.** Share of sampling methods for the samples collection of each source type in China from
 221 literatures. DTS denotes dilution tunnel sampling method.

222

223 Except for stationary sources, the moving sources like vehicle emissions are gradually
 224 becoming the dominant source in megacities of China. A variety of measurement methods
 225 for vehicle emissions have been developed over the world, such as directly measurements
 226 on the exhaust emissions of on-road vehicle and chassis dynamometer, portable emission

227 measurement system as well as tunnel experiment.

228 As for biomass burning and residential coal combustion, with the use of DTSM, the
229 measurements involved in different combustion ways. For example, indoor/lab simulation
230 with fuel burned with stove/chamber, and open burning/field measurement. In addition to
231 this, the biomass fuel can be burned in bio-fuel boilers, which is on the way to
232 industrialize recently.

233 In the published profiles, 65% coal combustions, 53% industrial emissions, 12 cooking
234 emissions, 43% vehicle emissions, and 37% biomass burning profiles were obtained with
235 DTSM (as shown in Fig. 2).

236 ***Chemical analysis.*** The chemical analysis methods have been significantly improved
237 since the 1980s. A typical source profile from literature data usually contains elements
238 (e.g., Al, As, Ca, Cd, Cr, Cu, Fe, K, Mg, Mn, Na, Pb and Zn), organic carbon (OC),
239 elemental carbon (EC), and water-soluble ions (WSI, e.g., Cl^- , NO_3^- , SO_4^{2-} , NH_4^+ , K^+ ,
240 Na^+ , Mg^{2+} and Ca^{2+}) in China. Detailed procedures in terms of the establishment of
241 different source profiles are available in previous publications (Chow et al., 1994; Chow et
242 al., 2004; Hou et al., 2008b; Pei et al., 2016).

243 PM samples collected on Teflon filters were mostly analyzed for elements by Inductively
244 Coupled Plasma Optical Emission Spectrometer (ICP-OES) or Inductively Coupled
245 Plasma Atomic Emission Spectrometer (ICP-AES) in China. In recent years, Inductively
246 Coupled Plasma Mass Spectrometry (ICP-MS) and X Ray Fluorescence were also used,
247 which have lower threshold/higher accuracy and quick response, respectively (Tsai et al.,
248 2004). The total carbon (TC) mass is typically determined using thermal or
249 thermal-optical methods. With the use of thermal/optical carbon analyzer, there are two
250 widely used approaches to divide organic carbon (OC) and elemental carbon (EC) from

251 TC, named DRI IMPROVE_A and NIOSH 5040, which are operationally defined by the
252 time-temperature protocols, the OC/EC split approaches by optical
253 reflectance/transmittance. (Chow et al., 1994;Ho et al., 2003;Chow et al., 2004;Zhang et
254 al., 2007;Phuah et al.,2009). Quartz fiber filters were normally used for the determination
255 of WSI by different types of Ion Chromatography (IC) with high-capacity
256 cation-exchange column and anion-exchange column (Qi et al., 2015).

257 Organic tracer species, that can be used as an indicator of a particular source, play an
258 important role in estimating source contributions. However, most of the source profiles in
259 China are reported with inorganic species, with only a few studies providing information
260 of organic compounds. Organic tracers are of great value in source apportionment studies,
261 as it provides more source-specific information in addition to inorganic species. For
262 example, levoglucosan is a well-known organic tracer represents for biomass burning (Lee
263 et al., 2008), azzaarenes as markers of inefficient coal combustion (Junninen et al., 2009;
264 Bandowe et al., 2016), sterols, monosaccharide anhydrides and amides as a marker of
265 cooking emissions (Schauer et al., 1999; Schauer et al., 2002; He et al., 2004; Zhao et al.,
266 2007a,b; Cheng et al., 2016;). Furthermore, for better discriminating sources, Pb stable
267 isotopes, which are not obviously influenced by ordinary chemical, physical or biological
268 fractionation processes (Gallon et al., 2005; Cheng and Hu, 2010), were determined with
269 an ICP-MS. Additionally, some other isotope measurements, for example radiocarbon
270 (Wang et al., 2017), sulfur (Han et al., 2016), and nitrogen (Pan et al., 2016), as well as
271 natural silicon (Lu et al., 2018), have also been reported to be used as source indicators
272 recently.

273 The above efforts indicate that the reported source profiles were collected by various
274 sampling methods and chemically analyzed by different instruments, making the source
275 profiles a high uncertainty of comparability. It is necessary to establish standards for the

276 procedures of source sampling, chemical analysis and QA/QC to ensure the
277 representativeness, validation and comparability of source profiles in China.

278

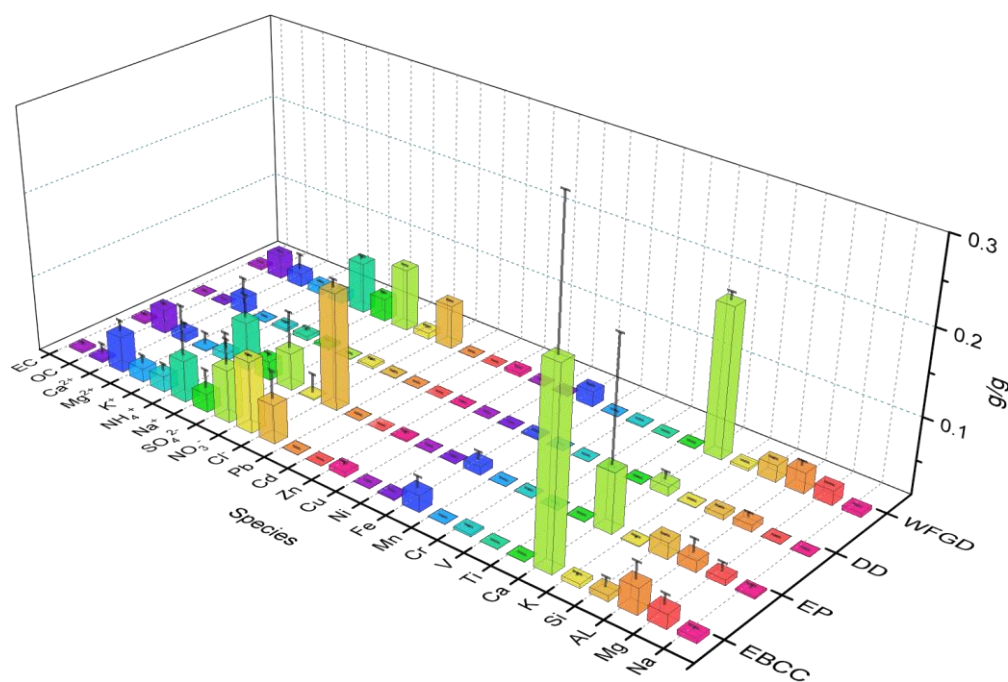
279 **2.2 Characteristics and evolution of source profiles**

280 **2.2.1 Coal combustion**

281 Coal is the main fuel used in China which has been widely used in coal-fired power plants,
282 coal-fired industrial boilers and residential household stoves, on average accounted for
283 more than 60% of the total energy consumed in China (CESY,2015). Thus, it was the
284 main cause of air pollution particularly during heating-season in Northern China. The
285 source profiles of CC sources are influenced by many factors, such as coal type and
286 property, boiler/stove type and efficiency, burning conditions (burning rate and fuel
287 loading), decontamination devices etc. (Shen, 2010), making it appears to be the most
288 complicated type among the primary sources. The source profiles of CC in China are
289 mainly consisted of crustal materials, OC, EC, SO_4^{2-} and trace metals, indicating the
290 chemical nature of coal burning.

291 *Coal-fired power plants.* Within the same sampling method (dilution tunnel sampling
292 method) and the same boiler type, the characteristics of the source profiles of coal-fired
293 power plants equipped with different dust removal and desulfurization facilities are
294 compared (Fig. 3). OC, EC, and Cl^- in the profiles of the electrostatic precipitators (EP)
295 are higher than that in the electric bag compound dust collectors (EBCC), with average
296 values of 0.0289 ± 0.0342 , 0.0036 ± 0.0033 g/g and 0.1403 ± 0.1686 g/g, respectively.
297 Higher Ca, NO_3^- , Ca^{2+} in the source profiles obtained by the EBCC is found as well.

298 Comparing data from different desulfurization facilities (Fig. 3), SO_4^{2-} and Ca in $\text{PM}_{2.5}$
 299 profiles from the wet flue gas desulfurization (WFGD) is much higher than that from dry
 300 desulfurization (DD). It is reported that SO_4^{2-} is converted from SO_2 in the flue gas
 301 through a limestone slurry washing reaction and then discharged with the fume (Ma et al.,
 302 2015). Ca is also infused in the fume when the flue gas went through the limestone
 303 washing process. OC in $\text{PM}_{2.5}$ profiles from the WFGD is also higher than that from DD,
 304 suggesting the possible conversion of gaseous or liquid organics to the particulate state in
 305 the lime slurry. NH_4^+ , Na^+ , and Cl^- are also higher in WFGD profiles than that in DD. The
 306 formation mechanism of these species in the WFGD needs further investigation.
 307

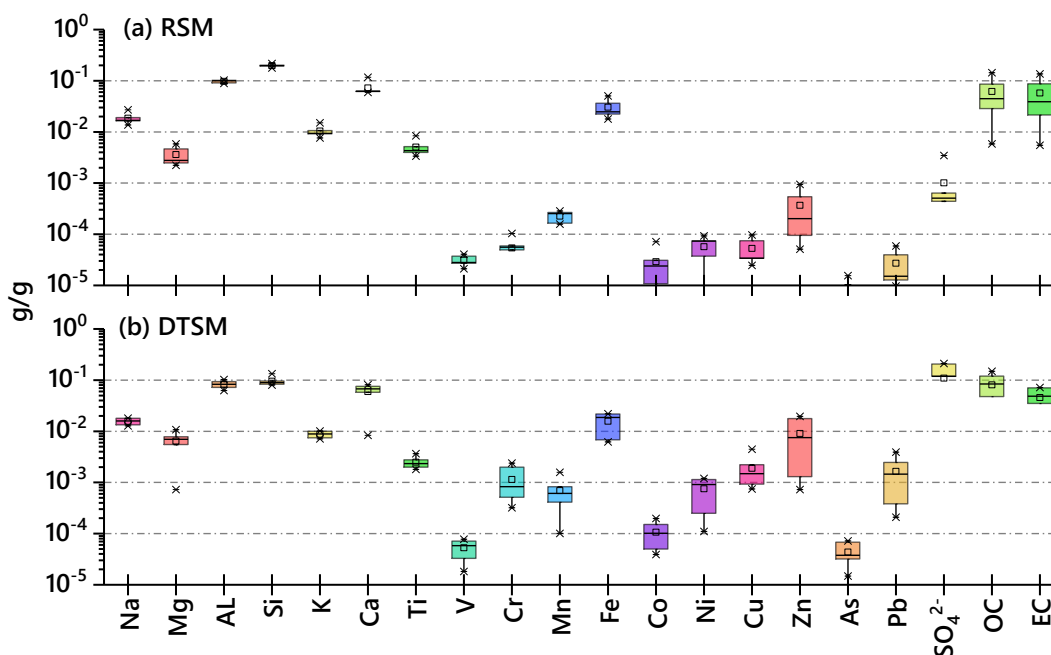


308
 309 **Figure 3.** Comparison of $\text{PM}_{2.5}$ source profiles collected under different dust removal and
 310 desulfurization facilities. EP denotes electrostatic precipitators, EBCC denotes electric bag
 311 compound dust collectors, WFGD denotes wet flue gas desulfurization, DD denotes dry
 312 desulfurization. Data from the source library of Nankai University) were counted.

313

314 To evaluate the impact of different sampling methods on the contents of source profiles,
315 measurements with the coal ash resuspension sampling method (RSM) and the stack gas
316 DTSM were simultaneously used for source sampling at a coal-fired power plant in Wuxi,
317 China. The results of the obtained PM₁₀ source profiles are shown in Fig. 4. For RSM, the
318 crustal elements (Si, Mg, Al and Ti) are significantly higher than DTSM, while the SO₄²⁻
319 fraction of DTSM is significantly higher than RSM, reaching 0.1643 g/g. V, Cr, Mn, Co,
320 Ni, Cu, Zn, Pb and other trace metal fractions are strongly enriched in DTSM, which is
321 1.7 to 60.7 times that in RSM, suggesting that these trace metal elements have a low
322 melting point and are easily liquefied or gasified during combustion, and then condensed
323 on the surface of the particles in the flue or after exiting the flue (where small particles
324 have a large specific surface area and are more prone to enrichment) (Dai et al., 1987).
325 The similar results were also reported earlier elsewhere (Meij, 1994; Meij and Winkel,
326 2004; Zhang et al., 2009b).

327



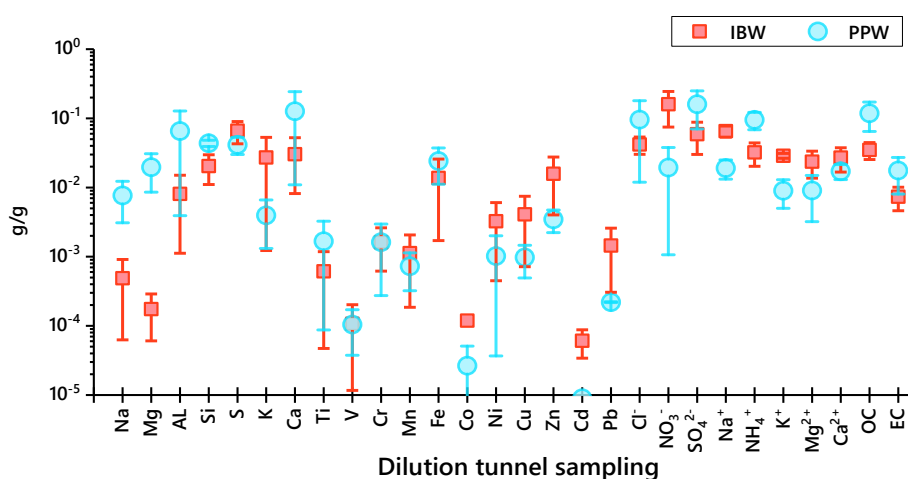
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329 **Figure 4.** Characteristics of chemical profiles for PM₁₀ emitted from coal-fired power plant
 330 obtained by different sampling methods in Wuxi city. RSM and DTSM denote resuspension
 331 sampling method and the dilution tunnel sampling method, respectively. Data were from the
 332 source library of Nankai University.

333

334 **Coal-fired industrial boiler.** The coal-fired industrial boilers are used for providing hot
 335 water or steam for industry or municipal heating. These boilers consumed about 1.1
 336 billion tons of coal annually in China, accounting for 25% of the total coal consumption
 337 and only have the average capacity of 2.7 MW (ERI, 2013). Comparing with the profiles
 338 detected in coal-fired power plants, there are substantial differences in the source profiles
 339 of the coal-fired industrial boilers. Fig.5 shows the difference of the chemical
 340 compositions of source profiles between coal-fired industrial boilers with wet
 341 desulfurization (IBW) and power plant boilers with wet desulfurization (PPW) with PM
 342 samples collected using the same method. Mg, Al, Si, Ca, SO₄²⁻, NH₄⁺ and OC in the

343 profiles of PPW are higher than that of IBW, which was likely resulted from the
 344 combustion efficiency and desulfurization efficiency, as PPW was required to operate
 345 with high efficiency of desulfurization by the government while IBW was less under
 346 controlled.

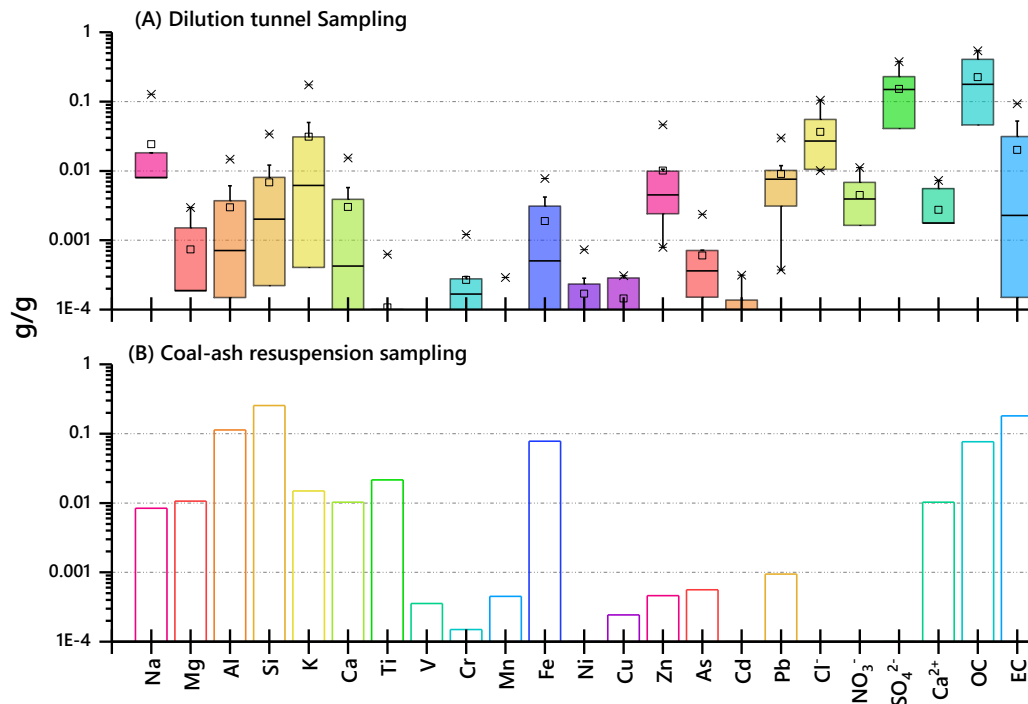


347
 348 **Figure 5.** Average and standard deviation of chemical species in the source profiles of coal-fired
 349 industrial boilers equipped with wet desulfurization (IBW) and power plant boilers equipped with
 350 wet desulfurization device (PPW), respectively. Data were collected from the source library of
 351 Nankai University.

352
 353 **Residential Coal Combustion (RCC).** In 2015, the total amount of coal consumption in
 354 mainland China is about 3970.14 Mt with a total of 93.47 Mt coal consumed in residential
 355 section (CESY, 2015). RCC is an important source of atmospheric PM in rural area,
 356 particularly in heating-season (Duan et al., 2014; Tao et al., 2018; Chen et al., 2005;
 357 Zhang et al., 2007; Chen et al., 2004). Contrary to industrial furnaces and boilers, coal
 358 burned in household stoves has a significant impact on indoor and outdoor air quality in
 359 terms of its low thermal efficiency, incomplete combustion and the lack of air pollutant

360 control devices. It was reported that the emission factors of air pollutants for coal burned
361 in household stoves are more than two orders of magnitude higher than those burned in
362 industrial boilers and power plants (Li et al., 2017), thus pollutants emitted from RCC
363 have drawn great concern in recent years.

364 In general, coals can be classified as anthracite and bituminous coals in the forms of raw
365 chunks and briquettes (Shen, 2015), burning with a movable brick or cast-iron stoves that
366 has been used over centuries in China (Shen et al., 2010). There are many real-world
367 measurements on particle emissions from RCC aiming to investigate its emission nature
368 (Chen et al., 2005). Most studies have rather placed focus on the emission factors than
369 chemical composition as the emission factor of RCC is high uncertain for a given air
370 pollutant. The chemical characteristics of RCC profiles are varied greatly with the
371 sampling techniques. Three decades ago, Dai et al (1987) reported the averaged elemental
372 profile of 15 RCC particle samples in Tianjin in 1985, with the use of Barco analyzer to
373 cut fly ash (collected from the stack of RCC stove) into particles with aerodynamic
374 diameter less than 12 μm . As expected, this sampling technique resulted in a high fraction
375 of crustal elements in the chemical profile. The resuspension chamber has also been used
376 to cut particle size from coal fly ash. However, the coal fly ash is not the particles
377 emission from stack. Thus, the accuracy of RCC source profile has been improved until
378 the DTSM has been introduced into China. As shown in Fig. 6, the fractions of crustal
379 elements (Mg, Al, Si, Ca, Ti) in the profile measured from coal ash are an order of
380 magnitude higher than that in the RCC profile sampled by using DTSM, while the
381 fraction of sulfate, nitrate and OC are two to three orders of magnitude lower in coal ash.



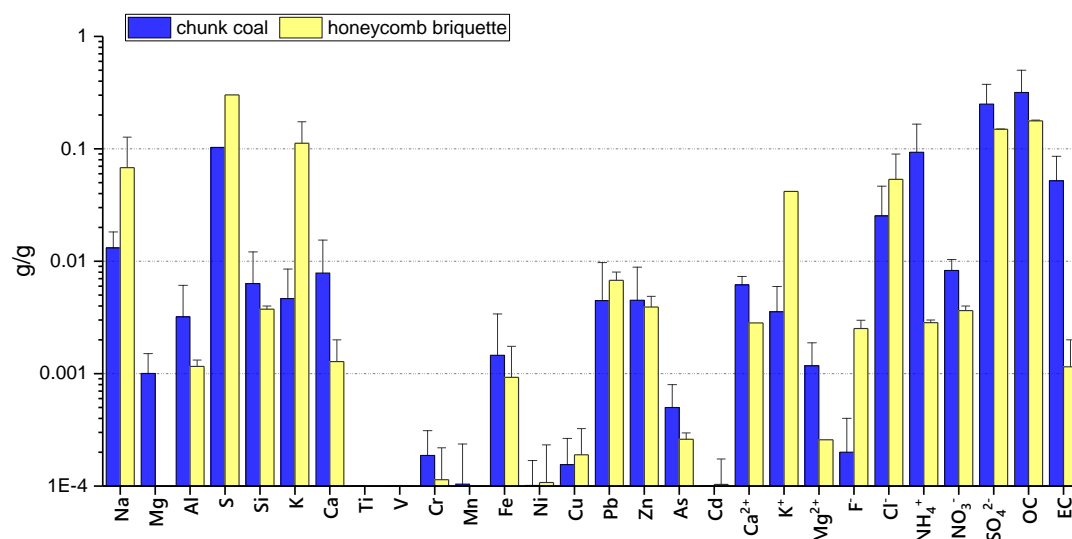
382

383 **Figure 6.** RCC Profiles of PM_{2.5} collected by dilution tunnel sampling method (A, data
 384 were collected from available published profiles (Ge et al., 2004; Kong, 2014; Liu et al.,
 385 2016; Liu et al., 2017; Yan et al., 2017; Dai et al., 2019)) and coal fly ash resuspension
 386 sampling method (B, data were collected from Wang et al. (2016)).

387

388 Many efforts have been implemented in a national level to reduce pollutants emissions
 389 from RCC by introducing improved stoves and cleaner fuels since the 1990s, such as the
 390 China National Improved Stove Program (Shen et al., 2015). The highly efficient stove is
 391 reported likely has a reduced emission load. Given the limited available data, it is unable
 392 to compare the chemical profiles between the lowly and highly efficient stove in this work.
 393 It is also reported that the emission factors of air pollutants from RCC varied widely
 394 because of the variations in coal type and property, stove type and burning condition
 395 (Shen et al., 2010). As shown in Fig. 7, PM_{2.5} emissions from the burning of chunk coals

396 have a high fraction of OC, EC, sulfate, nitrate and ammonium, a low fraction of Na, Ca
 397 and K (K⁺) than the burning of honeycomb briquette coals. Generally, OC and sulfur are
 398 the predominate species in PM_{2.5} emitted by RCC.



399

400 **Figure 7.** RCC profiles of PM_{2.5} emission from chunk coal and honeycomb briquette
 401 coals. Data were collected from published data (Ge et al., 2004; Kong, 2014; Liu et al.,
 402 2016; Liu et al., 2017; Yan et al., 2018; Dai et al., 2019).

403

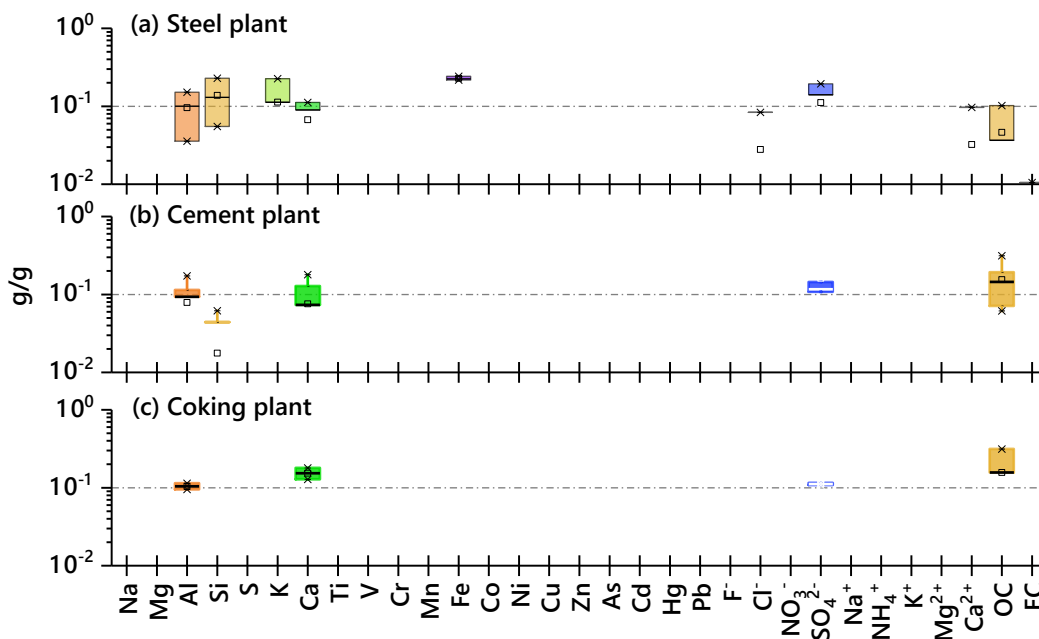
404 As we mentioned above, there are many factors that affecting the profiles of coal
 405 combustion sources. Therefore, local CC source profiles should be measured in the study
 406 area to improve the accuracy and reliability of source apportionment results.

407

408 2.2.2 Industrial process emissions

409 The industrial emissions are one of the most important sources in China (Zhu et al., 2018).
 410 Particles from industrial emissions are mainly collected using DTSM (53%). The source
 411 profiles of industrial emissions could be influenced by several key factors, such as raw

412 materials used in industrial processes, manufacture processes, various sampling methods,
413 different sampling site, control measures taken by different factories and process
414 operating conditions (Watson and Chow, 2001; Kong et al., 2011; Pant and Harrison, 2012;
415 Guo et al., 2017). There are great differences between the source profiles from different
416 industrial sources. Fig. 8 shows the chemical composition of China's main industrial
417 emissions (cement plant, coking plant and steel plant) (Ma et al., 2015; Qi et al., 2015;
418 Yan et al., 2016; Zhao et al., 2015a). For cement industrial sources, Ca, Al, OC and SO_4^{2-}
419 are the most abundant species, with average value more than 0.10 g/g. For coking
420 industrial sources, Ca^{2+} , Al and SO_4^{2-} are elevated while OC displayed a somewhat
421 notable lower level. For steel industrial sources, the highest fraction species are Fe, Si, K
422 and SO_4^{2-} , while Cl^- , Ca^{2+} , EC and OC showed a lower content less than 0.0010 g/g.
423 In China, there are many industrial types with different emission characteristics. The
424 source profiles of industrial emissions are far from being fully understood so far. The
425 profiles of some important industrial sources, such as the glass melt kiln, non-ferrous
426 smelting, and ceramics, are reported rarely and need further investigation in the future.



427

428 **Figure 8.** Characteristics of chemical profiles for particulate matter emitted from industrial
 429 emissions. Data from the source library of Nankai University, Zhao et al. (2015), Qi et al. (2015),
 430 Ma et al. (2015) and Yan et al. (2016) were counted.

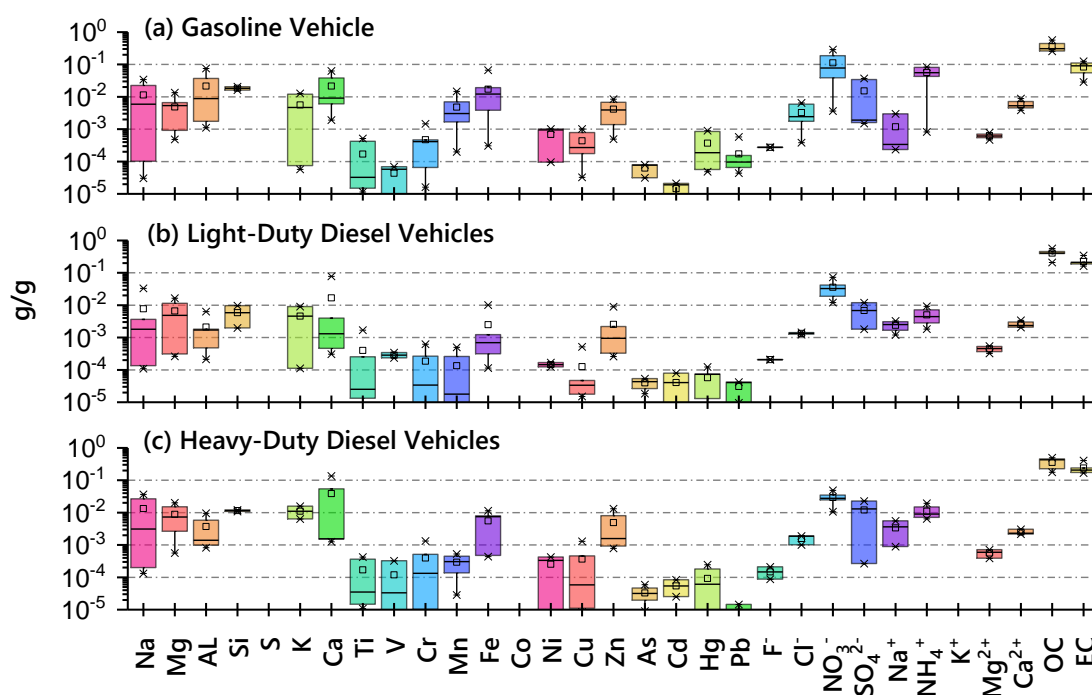
431

432 2.2.3 Vehicle emissions

433 Vehicle emissions appears to be the predominant source of ambient $PM_{2.5}$ in urban areas
 434 in China, particularly in megacities like Beijing and Shanghai (Cai et al., 2017b; Cui et al.,
 435 2016; Zhang et al., 2015). It is reported that the contribution of vehicle emissions to $PM_{2.5}$
 436 was in the range of 5% to 34% over China based on receptor models (Zhang et al., 2017b).
 437 There are many factors affecting vehicle emissions such as fuel types, vehicle types,
 438 emission control technologies, operating conditions, engine performances, sampling
 439 methods and so on (Watson et al., 1990; Chen et al., 2017b; Maricq, 2007). The
 440 representativeness of the source profiles of vehicle emissions is often controversial. Fig. 9
 441 summarizes the PM_{10} source profiles of different vehicle types obtained by direct

442 sampling method in China (Chen et al., 2017b). For both diesel and gasoline vehicles,
 443 their emission profiles are dominated by OC, EC, NO_3^- , NH_4^+ , SO_4^{2-} , Ca, Fe and Zn. The
 444 abundance of EC in diesel vehicle exhaust (particularly in heavy-duty diesel vehicle
 445 exhaust) is higher than that in gasoline vehicles, which may due to the different
 446 combustion completion rates between diesel and gasoline on account of the length of
 447 hydrocarbon chains of them (Chen et al., 2017b). Since Mn has been used in the gasoline
 448 explosion-proof agent, the fraction of Mn in the particulate matter from the gasoline
 449 vehicle emission is higher than that of diesel vehicle.

450



451

452 **Figure 9.** Chemical compositions of source profiles for PM_{10} of different vehicle types obtained
 453 by direct sampling method. Data from the source library of Nankai University and Chen et al.
 454 (2017) were counted.

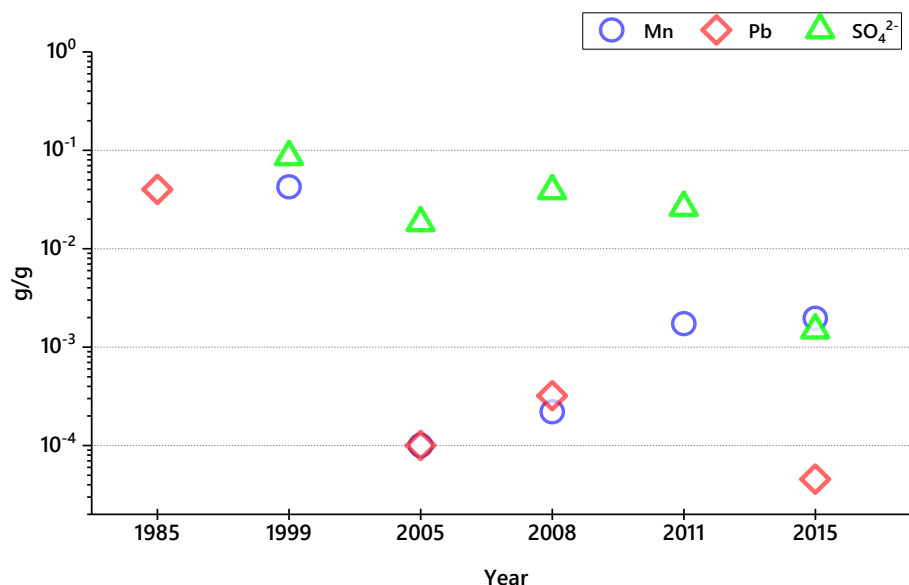
455

456 Fig. S1 summarizes the characteristics of chemical profiles for particulate matter emitted

457 from vehicles obtained by different sampling methods. Crustal elements (Si, Al, Ca, Mn)
458 in the chemical profiles obtained by SDSM are higher than that of DSM, which may due
459 to the influence of suspended road dust. NH_4^+ and NO_3^- in chemical profiles obtained by
460 DSM are lower than that of SDSM, probably because their precursors are still in the
461 gaseous state when the samples are collected at a higher temperature by DSM (Kong and
462 Bai, 2013).

463 The source profiles of the vehicle exhaust also varied with upgrades of the fuel. In China,
464 the oil used for vehicle has been upgraded for five times in the past eighteen years. The
465 evolutions of the fractions of Mn, Pb and SO_4^{2-} in particulate matter emitted by vehicle
466 from the past three decades are shown in the Fig. 10. Pb was a tracer of the gasoline
467 before 2000 while leaded gasoline was banned to be used in mainland China after 2000
468 (State Council of China, 1998). The standard value of sulfur in the car-used gasoline was
469 $800 \mu\text{g/g}$ in 2000 and $10 \mu\text{g/g}$ in 2018 (Guo, 2013). The standard value of Mn was 0.018
470 g/L in 2000 and only 0.002g/L in 2018 (Li, 2016). The similar trend could also be found
471 in the standard of diesel in China (Zhang et al., 2009a). All these changes in the oil
472 standard will definitely cause the evolution of source profiles of vehicle exhaust. With the
473 government's request to stop producing, selling and using leaded gasoline, the fraction of
474 Pb in vehicle emissions decreased significantly. In 2005, the fraction of Pb in motor
475 vehicle emissions dropped significantly as compared with 1985 (Dai et al., 1986; Han et
476 al., 2009). The fraction of Mn is also greatly reduced after 2000 (Bi et al., 2007; Han et al.,
477 2009). Similarly, the fraction of SO_4^{2-} in vehicle emissions also showed a significantly
478 decreasing trend since 2000, indicating a causal relationship with the reduction of sulfur

479 in the car-used gasoline in China.



480

481 **Figure 10.** Time series of Mn, Pb and SO₄²⁻ of the particulate matters emitted from vehicles
482 obtained. Data were collected from the source library of Nankai University, Dai et al. (1986),
483 Zhang et al. (2000), Bi et al. (2007), Han et al. (2009), Zhang et al. (2009), Guo et al. (2013), Li et
484 al. (2016).

485 By comparing the main components of on-road vehicles PM_{2.5} source profiles derived
486 from local studies and EPA SPECIATE database, Xia et al. (2017) found that both the
487 source profiles of motor vehicles in China and the United States were dominated by OC
488 and EC, but with different proportions. In America, the gasoline, ethanol and methanol are
489 added as the aerator, while such oxygen content of gasoline in China is smaller than
490 America, which is an important reason for the difference in the OC content in the
491 spectrums at home and abroad (Xia et al., 2017). In China, the fraction of SO₄²⁻ is 2.4
492 times higher than that of foreign motor vehicles (Wang et al., 2015; Xia et al., 2017),
493 which may be related to the higher sulfur content in the fuels (Guo et al., 2013; Li et al.,

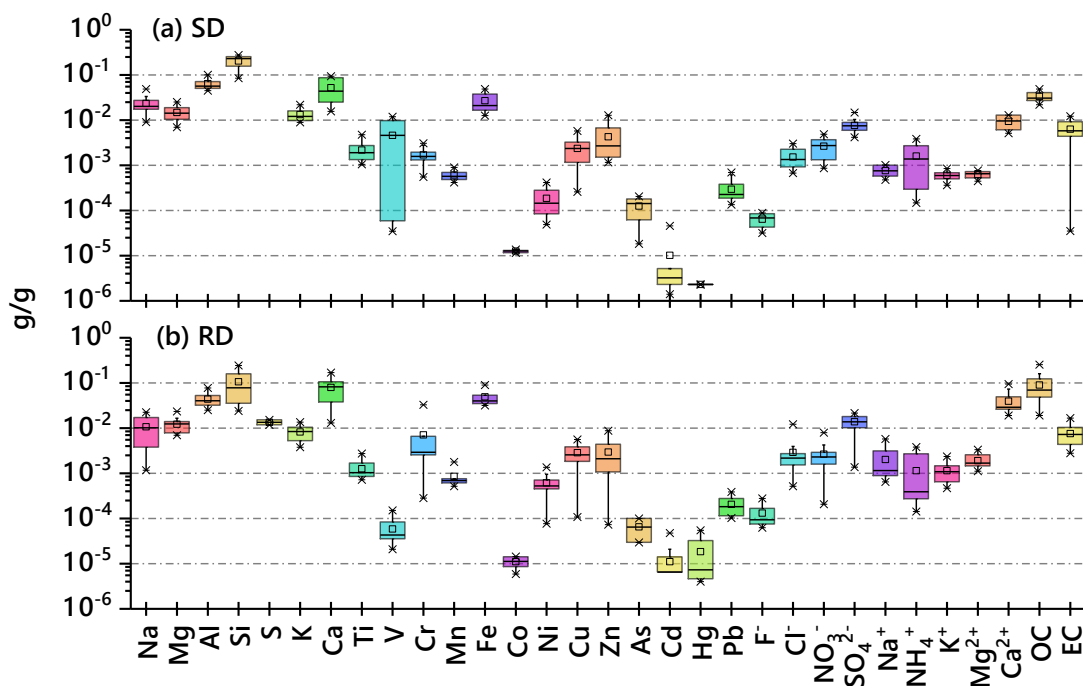
494 2016).

495 **2.2.4 Fugitive dust**

496 Fugitive dust is founded to be one of the major sources of urban particulate matter (Chow
497 et al., 2003; Kong et al., 2011; Cao et al., 2012; Zhu et al., 2018), especially in northern
498 cities in China with dry climate and limited precipitation (Shen et al., 2016; Cao et al.,
499 2008). Urban fugitive dust is not only influenced by soil properties with geographic
500 locations, but also the mixture of various dust-related sources. Therefore, fugitive dust is
501 often referred to soil dust, road dust, construction dust (Doskey et al., 1999; Kong et al.,
502 2014). Fugitive dust samples were generally collected by using resuspension chamber.

503 As shown in Fig. 11, the primary species in soil dust are Si, Al, Ca, with mass fractions
504 ranged from 0.0500 to 0.2010 g/g. Si is the predominant species among the detected
505 elements, followed by Al, Fe, Na and Mg. The main chemical components of road dust
506 are Si, OC and Ca, with fractions ranged from 0.0712 to 0.0855 g/g. Al, Fe and SO_4^{2-} are
507 the relatively lower species (less than 0.0005 g/g) in the chemical profiles of road dust. Si,
508 Ca, Al and Fe are all crustal elements, indicating that the soil dust has a greater impact on
509 the composition of road dust. It also shows that OC and SO_4^{2-} in the source profiles of
510 road dust are higher than that of soil dust, indicating that the road dust is also affected by
511 vehicle emissions or coal combustion and other anthropogenic sources (Ma et al., 2015).
512 In general, the total water-soluble ions accounts for 0.0248-0.0648 g/g of fugitive dust,
513 suggesting that insoluble matter is not the main component of fugitive dust.

514



515

516 **Figure 11.** Characteristics of chemical profiles for particulate matter emitted from fugitive dust.

517 SD and RD denote soil dust and road dust, respectively. Data were collected from the source

518 library of Nankai University.

519

520 Many studies have demonstrated that the ratios of different chemical components can be

521 used as markers for fugitive dust (Alfaro et al., 2003; Arimoto et al., 2004). Kong et al.

522 (2011) found that the Ca/Al ratio of paving road dust affected by construction activities

523 was significantly different from that of soil dust. Zhang et al. (2014) reported that the

524 heavy metals like Zn and Pb capable of being the tracers of urban fugitive dust, as they

525 found Zn/Al and Pb/Al ratios in urban fugitive dust were 1.5 to 5 times those in desert,

526 Gobi, and loess soil samples. The $\text{NO}_3^-/\text{SO}_4^{2-}$ ratio has been used to compare the relative

527 importance of stationary sources vs mobile sources. Much higher $\text{NO}_3^-/\text{SO}_4^{2-}$ ratio of road

528 dust in Hong Kong has been reported by Ho et al. (2003), revealing the more important

529 impact of vehicle emissions on the chemical composition of road dust as compared to coal
530 combustion.

531

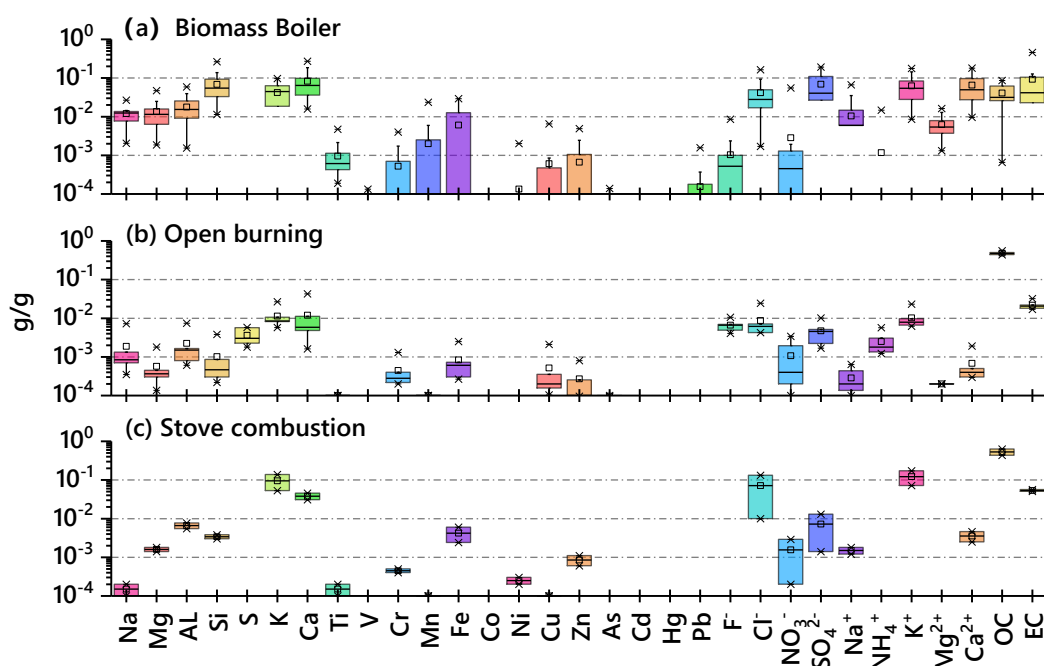
532 **2.2.5 Biomass burning**

533 Traditionally, China is an agricultural-based country (Bi et al., 2007). As an effective way
534 to eliminate plant residues, direct combustion by open burning and in domestic stove are
535 the predominant and popular practice during the harvest seasons (Andreae and Merlet,
536 2001; Ni et al., 2017; Cheng et al., 2013; Li et al., 2014b; Streets et al., 2003). However, it
537 releases a lot of pollutants into ambient air, and consequently impacts air quality, human
538 health and climate (Yao et al., 2017; Chen et al., 2017a). Biofuel burned with boilers is
539 also an important subtype of biomass burning (Tian et al., 2017). The wheat straw, corn
540 stalks and rice straw represent 80% of the agricultural combustion in China (Ni et al.,
541 2017), and there are also firewood, soybean and rape. The biofuel types, sampling
542 procedures and burning conditions result in great differences in the levels and chemical
543 properties of PM emissions from biomass burning (Tian et al., 2017; Vicente and Alves,
544 2018).

545 Biomass are usually burned in three ways in China, that is open burning (OB), residential
546 stove combustion (RSC), and biofuel boiler burning (BBB). At present, there are two
547 popular ways in the measurements of biomass burning: field combustion experiment
548 (FCE) and laboratory combustion simulation (LCS) (Hays et al., 2005; Li et al., 2014a;
549 Sanchis et al., 2014; De Zarate et al., 2000). Fig. 12 summarizes the biomass burning
550 profiles of PM_{2.5} from three burning styles obtained in China. The samples of biomass

551 boiler exhaust are obtained by resuspension sampling method. The main components in
 552 the profiles of biomass burning are OC, EC, K⁺, Cl⁻, K and Ca (Fig. 12). The fraction of
 553 EC is 4.2 times higher in BBB than RSC, which is potentially due to the uneven mixing of
 554 the air in the biomass boiler that easy to make straw burning in anaerobic condition (Tian
 555 et al., 2017). The high EC emissions can also happen if high temperature flaming burning
 556 condition was dominant in the BBB. The oxygen content is relatively sufficient in OB,
 557 which leads to relatively higher OC emission. The fraction of Ca was higher in BBB
 558 exhaust than OB (Fig. 12). For specific components emissions from the biomass burning,
 559 EC emissions from firewood combustion was the highest, which is likely due to the high
 560 combustion temperature and flaming dominance burning condition, and the higher content
 561 of lignin in wood (Tang et al., 2014), since lignin facilitates the formation of black carbon
 562 (Wiinikka and Gebart, 2005).

563



564

565 **Figure 12.** Major chemical compositions of PM_{2.5} source profiles of biomass burning. Data were

566 collected from the source library of Nankai University.

567

568 Chen et al. (2007) investigated the particulate emissions from wildland fuels burning in a
569 laboratory combustion facility in the U.S., and found the percentage of total carbon (TC)
570 of PM was 63.7% ~ 100%, which was higher than that in China (4.9%~68%). K
571 (0.4%~23.7%), Cl (0.1%~9.6%) and S (0.1%~2.9%) were important part of the remaining
572 PM mass in the U.S, which is different from China due to the different biomass categories
573 and combustion processes.

574

575 **2.2.6 Cooking emissions**

576 With the economic growing, the cooking styles and types of food ingredients on the table
577 are becoming increasingly diverse. Since the 1990s, the variety of ingredients and cooking
578 styles was also influenced by the foreign food culture. As China is famous for its
579 abundance of food culture, the cooking styles are varied with different regions, even in
580 different cities. Thus, cooking is undoubtedly an important local source of ambient
581 particles. Given that there is no ubiquitous source profile for cooking emission, it is better
582 to measure source profile of cooking emissions in real-world in the study area. As one of
583 the essential cooking ingredients in the food and beverage industry, the types of edible
584 oils are changing in recent years (Pei et al., 2016). Soybean oil, rapeseed oil and peanut
585 oil are common edible oils for public dining in China. Due to changes in consumer
586 demand, other types of edible oils, such as olive oil, camellia oil and flaxseed oil, have
587 also been increasingly welcomed by the catering industry. Furthermore, Chinese-style

588 cooking is characterized by high temperature stir-frying that releasing much more organic
589 matter than the cooking style of western food (Zhao et al., 2007b).

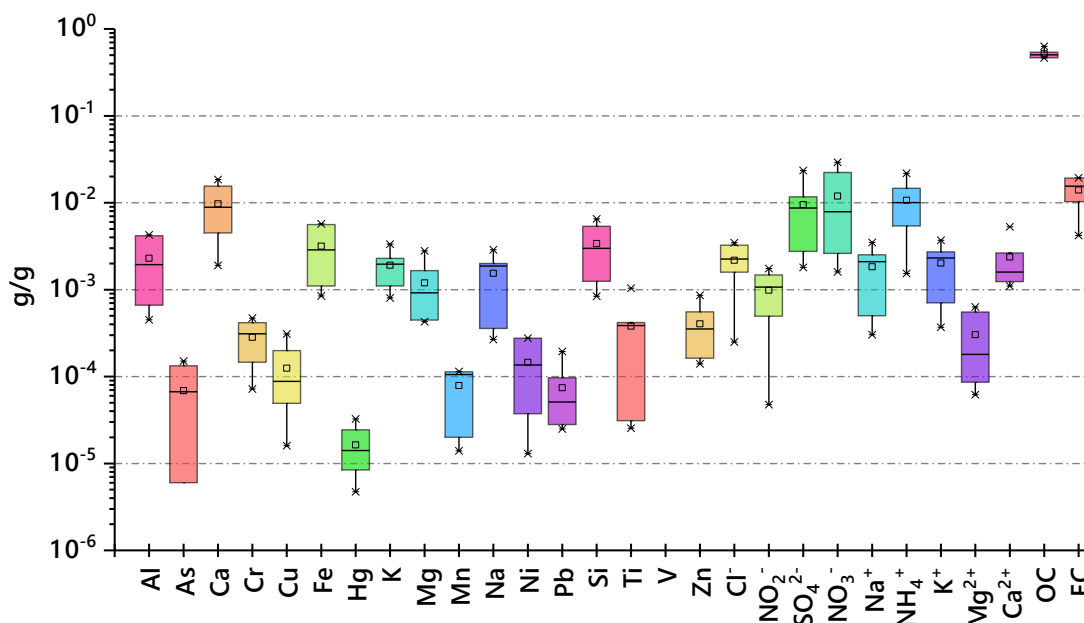
590 The chemical nature of $PM_{2.5}$ emitted from commercial cooking were investigated in
591 many studies, with source profiles varied greatly with different factors such as cooking
592 styles, cooking foods, seed oils and fuel (He et al., 2004;Zhao et al., 2007b;Hou et al.,
593 2008b;Zhao et al., 2015b;Pei et al., 2016). Robinson et al. (2006) found that the
594 contribution of cooking emission to OC in $PM_{2.5}$ calculated by chemical mass balance
595 model using different source profiles yielded a difference by a factor of more than nine.

596 Previous studies found that organic matter accounted for 66.9 % of the total suspended
597 particles (TSP) mass emitted from cooking activities (Zhao et al., 2015b). OC is the major
598 constituent and accounted for 36.2%~42.9% of the total mass, while the fraction of EC is
599 much lower. Several water-soluble ions measured in the fine particles presented a
600 relatively lower but a noticeable percentage, which made up of about 9.1%~17.5% of the
601 total $PM_{2.5}$ mass (Anwar et al., 2004). Inorganic elements are found to be 7.3%~12.0% of
602 the total $PM_{2.5}$ mass due to their greater presence in cooking oil and raw materials (He et
603 al., 2004).

604 Fig. 13 shows the $PM_{2.5}$ chemical profiles of cooking emissions including hot pot,
605 Chinese restaurant, barbecue and cafeteria (See and Balasubramanian, 2006; Taner et al.,
606 2013; Zhang et al., 2017a). For elements, on average, the most abundant element in
607 cooking profiles is Al, followed by Ca and Fe. The high levels of Ca and Fe are probably
608 emitted from raw material and cooking utensils (See and Balasubramanian, 2006; Taner et
609 al., 2013). The high level of Cr, originated from stainless steel grills, was observed in a

610 barbeque restaurant (Taner et al., 2013). Overall, OC is the most abundant species in the
 611 profiles of cooking emissions.

612



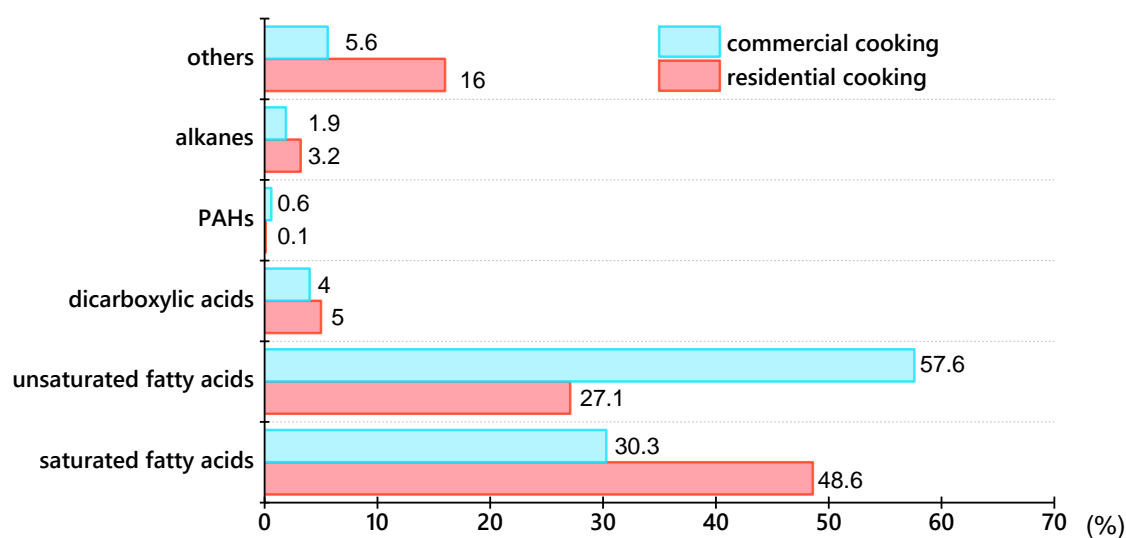
613

614 **Figure 13.** PM_{2.5} Chemical profiles of cooking emissions. Data from the source library of Nankai
 615 University, Zhang et al. (2017), See et al. (2006) and Taner et al. (2013) were counted.

616

617 Organic matter (OM) is the predominant species in PM_{2.5} emitted from cooking activities
 618 (He et al., 2004; Hou et al., 2008a; Pei et al., 2016). Many organic compounds, including
 619 n-alkanes, dicarboxylic acids, polycyclic aromatic hydrocarbons (PAHs), saturated fatty
 620 acids and unsaturated fatty acids, were quantified in the above studies. Fig. 14 shows the
 621 fractions of main organic compounds in the quantified OM emission from residential
 622 cooking (Zhao et al., 2015b) and commercial cooking (Pei et al., 2016). Among the
 623 quantified organic compounds, the predominant species is unsaturated fatty acids
 624 (49.4%-77.8%), followed by saturated fatty acids (25.1%-43.8%).

625



626

627 **Figure 14.** Proportions of major organic compounds in quantified OM emission from commercial
628 cooking (Pei et al., 2016) and residential cooking (Zhao et al., 2015b) .

629

630 In addition, except for biomass burning, many studies have reported that the levoglucosan
631 was also founded in the emissions from residential coal combustion (Yan et al., 2017) and
632 a variety of Chinese and western cooking styles (He et al., 2004; Zhao et al., 2007a, b).
633 Pei et al. (2016) also found Italian cooking style released the smallest amount of
634 monosaccharide anhydrides and the largest amount of cholesterol due to the lower ratio of
635 vegetables to meat used in the Italian cooking than Chinese cooking materials. Malay
636 cooking released higher PAHs concentrations than the Chinese and India methods (See et
637 al., 2006). Deep frying emitted more PAHs than other cooking methods because of the
638 higher temperature and more oil used during cooking. As far as we know, molecular
639 markers used for cooking included levoglucosan, galactosan and cholesterol (He et al.,

640 2004; Zhao et al., 2007a, b) while cholesterol can be regarded as the best marker for meat
641 cooking (Schauer et al., 1999; Schauer and Cass, 2000; Schauer et al., 2002).

642

643 **2.3 Statistical analysis of the source categories**

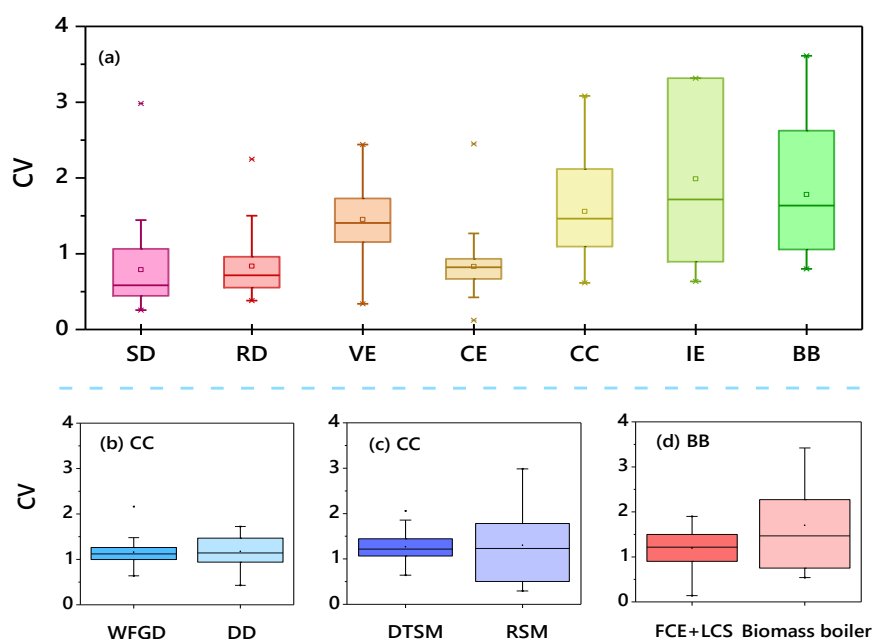
644 The chemical profile of a given source category is always established from profiles of
645 several similar sources belonging to this category. Non-negligible uncertainties would be
646 introduced in this process. To evaluate such uncertainties, the coefficient of variation (CV,
647 the standard deviation divided by the mean) is used in this section to further characterize
648 the homogeneity of sources within the same source category (Fig. 15).

649 The values of CV above three (Pernigotti et al., 2016) are observed in coal combustion,
650 industry emissions and biomass burning, indicating these source profiles show great
651 variations due to the effects of their influencing factors as described in above sections.

652 The profiles of road dust and soil dust show less variations with stable chemical
653 characteristics among the different profiles in the same category. However, the responses
654 of source profiles to various impact factors are different (Fig. 15(b)-(d)). For example, the
655 sampling methods have a notable effect on the source profile of coal combustion (the
656 variation of coal combustion source profiles obtained by resuspension sampling is greater
657 than that by DTSM), while the desulfurization methods have smaller impact.

658 Since source profiles owned local characteristic, it is important and necessary to establish
659 and update local source profiles to reveal the real situation of source emissions (Zhang et
660 al., 2017b; Zhu et al., 2018). However, local source profiles are not always available in
661 some developing areas in the case of limited funds and instruments. According to the

662 above statistical results, it can be inferred that the profiles of road dust and soil dust could
 663 be references for the cities in China without such local profiles, while it is necessary to
 664 establish the local profiles of the industrial emissions, vehicle emissions, coal combustion,
 665 and biomass burning.



666

667 **Figure 15.** Coefficients of variation calculated for each source category. SD denotes soil dust, RD
 668 denotes road dust, VE denotes vehicle emissions, CE denotes cooking emissions, CC denotes coal
 669 combustion, IE denotes industrial emissions, BB denotes biomass burning, WFGD denotes wet
 670 flue gas desulfurization, DD denotes dry desulfurization, DTSM denotes the dilution tunnel
 671 sampling method, RSM denotes resuspension sampling method, FCE denotes field combustion
 672 experiment, LCS denotes laboratory combustion simulation.

673

674 In order to investigate the similarity of the real-world measured source profiles with
 675 homogeneous chemical signature, cluster analysis was applied to the collected data by
 676 using the package R pvclust (Suzuki and Shimodaira, 2006; Pernigotti et al., 2016). The

677 significance test was performed with resampling the data via bootstrap method. This
678 function is expected to assign each cluster an approximated unbiased (AU) p-value by
679 hierarchic clustering (Shimodaira, 2002). Details on the operation steps of this method are
680 discussed earlier by Pernigotti et al. (2016). The input source profiles involved in the
681 cluster calculation must contain more than two common chemical species, including
682 elements, ions and OC/EC. In order to reduce the interference of different particle sizes,
683 we used 226 source profiles of PM_{2.5} for the calculation. The result of cluster analysis and
684 additional information of the source profiles are shown in Fig. 16 and Table S1. As shown
685 in Fig. 16, clusters are marked if the AU p-value ≥ 90 (values were reported in red). It
686 shows that the source profiles are divided into (1) biomass burning, (2) and (4) coal
687 combustion, (3) industrial emission, (5) soil dust, (6) road dust, (7) cooking emissions and
688 (8) vehicle emissions. These subjectively measured profiles are successfully classified by
689 objectively method based on their chemical nature, though there are some different
690 sources mixed up (Fig. 16). This result indicates that the routine measured components
691 are not enough to distinguish all the source categories when the chemically co-linear
692 sources exist. Both the source profiles of cooking and vehicle emissions are characterized
693 by high OC, which makes them easy to be identified as the same source type. The
694 chemical collinearity of the source composition between coal combustion and dust also
695 makes it difficult to be distinguished. To solve the chemical co-linearity problem between
696 sources, more specific tracers, especially organics should be further explored.

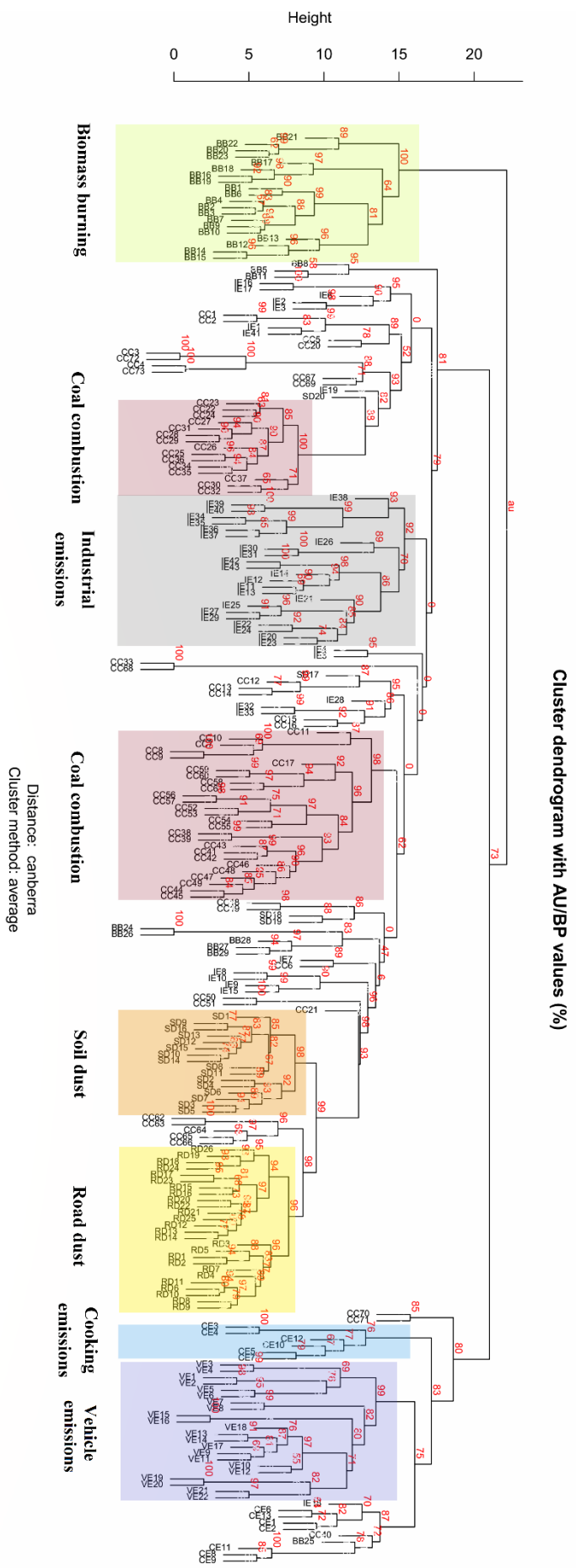


Figure 16. Result of cluster analysis on the profiles. AU p-values are reported in red as %.

699 **3. Conclusion**

700 The chemical profiles of main sources of particulate matter have been established in
701 China since the 1980s. With the development of sampling and analysis techniques, the
702 dataset of source profiles has been gradually enlarged and could to able to reflect the real
703 emissions of the sources to the ambient air. A total of 456 published source profiles,
704 coupled with the database of source profiles (2870 profiles) founded by Nankai University
705 are reviewed in this work. Six source categories include coal combustion, industrial
706 process emissions, vehicle emissions, fugitive dust, biomass burning and cooking
707 emissions are investigated to characterize sources in chemical nature and explore the main
708 factors that influencing the chemical composition.

709 In general, coal combustion is the most complicated source in all source categories as it is
710 influenced by many factors from the fuel combustion processes to pollution-controlling
711 processes. Sulfate is the predominant species of fine particles emissions from coal
712 combustion stationary sources equipped with wet flue gas desulfurization device, and is
713 also the second largest species in fine particles emissions from residential coal
714 combustion. The source profiles of industrial emissions are mainly determined by the
715 components of the industrial products and its pollution-controlling techniques. With the
716 changing standards of gasoline and diesel oil since the 1980s, Pb and Mn are no longer
717 the tracers of emission from the gasoline vehicles. OC and EC are always the dominant
718 species of vehicle emissions from the 1980s despite the changing standards. The profiles
719 of the fugitive dust including the road dust and soil dust are characterized by the high
720 levels of crustal elements, such as Si, Al and Ca. The profiles of the biomass burning are

721 determined by the biomass categories and the different combustion phases (smoldering
722 and flaming), with K^+ and levoglucosan to be the common tracers. As for cooking
723 emissions, the source profiles of the emissions from the different cooking types were all
724 dominated by OC.

725 The result of uncertainty analysis showed that the relatively large variation in the source
726 profiles of industry emissions, vehicle emissions, coal combustion and biomass burning,
727 calling for establishing the local profiles for these sources due to their high uncertainties.

728 While the profiles of road dust and soil dust present a less variation, suggesting that the
729 profiles of these sources could be referenced for the cities in China when the local profiles
730 are not available. Since source profiles owned local characteristic, it is important and
731 necessary to establish local source profiles to reveal the real situation of source emissions
732 and update it immediately.

733 The result of cluster analysis on the routine measured species of source profiles suggested
734 that some of the sources are difficult to be distinguished (cooking emissions vs vehicle
735 emissions), indicating that more chemical tracers, such as the isotopes and organic
736 compounds, should be further explored in the source profiles to reduce the collinearity
737 among different source profiles. Current source profile database is still missing some
738 important source categories that have significant impacts on the air quality, and lacking
739 sufficient source profiles, especially for the industrial emissions, such as the glass melt
740 kiln, nonferrous metal smelting, bricks and tiles kiln. Thus, specific focus should be
741 placed on these important but overlooked sources in the future.

742

743 Data availability. The chemical composition data of the main sources used in this
744 publication has been deposited to the Mendeley Data and can be downloaded freely from
745 <http://dx.doi.org/10.17632/x8dfshjt9j.1>.

746 Author contribution. Xiaohui Bi performed the data analysis and wrote the manuscript.
747 Yinchang Feng assisted heavily with manuscript development and editing. Qili Dai
748 contributed with data analysis. Qing Zhang, Wenhui Zhang, Ruixue Luo, Yuan Cheng,
749 Jiaying Zhang, Lu Wang, Zhuojun Yu contributed to data collection. Jianhui Wu, Yufen
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757

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