



1 Contributions of Trans-boundary Transport to the Summertime Air Quality in Beijing, China

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12 **Abstract:** In the present study, the WRF-CHEM model is used to evaluate the contributions
13 of trans-boundary transport to the air quality in Beijing during a persistent air pollution
14 episode from 5 to 14 July 2015 in Beijing-Tianjin-Hebei (BTH), China. Generally, the
15 predicted temporal variations and spatial distributions of PM_{2.5} (fine particulate matter), O₃
16 (ozone), and NO₂ are in good agreement with observations in BTH. The WRF-CHEM model
17 also reproduces reasonably well the temporal variations of aerosol species compared to
18 measurements in Beijing. The factor separation approach is employed to evaluate the
19 contributions of trans-boundary transport of emissions outside of Beijing to the PM_{2.5} and O₃
20 levels in Beijing. On average, in the afternoon during the simulation episode, the pure local
21 emissions contribute 22.4% to the O₃ level in Beijing, less than 36.6% from pure emissions
22 outside of Beijing. The O₃ concentrations in Beijing are decreased by 5.1% in the afternoon
23 due to interactions of local emissions with those outside of Beijing. The pure emissions
24 outside of Beijing play a dominant role in the PM_{2.5} level in Beijing, with a contribution of
25 61.5%, much more than 13.7% from pure Beijing local emissions. The emissions interactions
26 enhance the PM_{2.5} concentrations in Beijing, with a contribution of 5.9%. Therefore, the air
27 quality in Beijing is primarily determined by the trans-boundary transport of emissions
28 outside of Beijing during summertime, showing that the cooperation with neighboring
29 provinces to mitigate pollutant emissions is a key for Beijing to improve air quality.
30 Considering the uncertainties in the emission inventory and the meteorological field
31 simulations, further studies need to be performed to improve the WRF-CHEM model
32 simulations to reasonably evaluate trans-boundary transport contributions to the air quality in
33 Beijing for supporting the design and implementation of emission control strategies.



34 1 Introduction

35 Beijing, the capital of China, has become an environmentally stressed city due to
36 growing population, increasing transportation activity, and city expansion (Parrish and Zhu,
37 2009). Beijing is situated in northeastern China, surrounded from the southwest to the
38 northeast by the Taihang Mountains and the Yanshan Mountains and open to the North China
39 Plain (NCP) in the south and east. Unfortunately, NCP has become one of the most polluted
40 areas in China due to rapid industrialization and urbanization (Zhang et al., 2013). When
41 south or east winds are prevalent in NCP, air pollutants originated from NCP are transported
42 to Beijing and surrounding areas and subject to be accumulated due to the mountain blocking,
43 causing heavy air pollution in Beijing (Long et al., 2016).

44 PM_{2.5} (fine particulate matter) and O₃ (ozone) are considered to be the most serious air
45 pollutants of concern in Beijing during summertime (e.g., Xie et al., 2015; Zheng et al., 2015;
46 Chen et al., 2015; Wang et al., 2016). The mean summertime PM_{2.5} mass concentration is
47 about 80 µg m⁻³ in 2013 (Li et al., 2015a), exceeding the second grade of National Ambient
48 Air Quality Standards (NAAQS) in China and also higher than the average PM_{2.5}
49 concentration of 78.1 µg m⁻³ during the period from 2004 to 2012 (Liu et al., 2015). During
50 haze pollution events in summer 2014, the PM_{2.5} concentration generally reaches 100 µg m⁻³,
51 and even exceeds 150 µg m⁻³ in Beijing (Wang et al., 2016). An increasing O₃ trend has been
52 observed in Beijing from 2002 to 2010 (Wang et al., 2012; Wang et al., 2013). The average
53 maximum 1-h O₃ concentration has been reported to achieve 140 µg m⁻³ during summertime
54 of 2013 in Beijing (Wang et al., 2014a). Wang et al. (2016) have demonstrated that the
55 summertime O₃ mass concentration holds a high level in 2014 in Beijing, with a daily



56 average of up to $110 \mu\text{g m}^{-3}$. Chen et al. (2015) have further shown that the average
57 maximum daily O_3 concentrations are higher than $150 \mu\text{g m}^{-3}$ during the summer in 2015 at
58 most of monitoring sites in Beijing.

59 In recent years, Beijing has implemented aggressive emission control strategies to
60 ameliorate the air quality (Parrish and Zhu, 2009). Both NO_x ($\text{NO}+\text{NO}_2$) and total VOCs
61 (volatile organic compounds) in Beijing have decreased linearly since 2002, while the
62 daytime average O_3 concentration still increases rapidly (Tang et al., 2009; Wang et al., 2012;
63 Zhang et al., 2014). Zhang et al. (2014) have highlighted the importance of the
64 trans-boundary transport and the cooperation with neighboring provinces to control the O_3
65 level in Beijing. Pollutants transported from outside of Beijing and formed locally together
66 determine the air quality in Beijing (Meng et al., 2006; Zhang et al., 2012).

67 Several studies have been performed to investigate the role of trans-boundary transport
68 in the air quality of Beijing based on observational analysis and model simulations. Using the
69 US EPA's Model-3/CMAQ model simulation in the Beijing area, Streets et al. (2007) have
70 pointed out that non-Beijing sources can contribute 50-70% of Beijing's $\text{PM}_{2.5}$ concentration
71 and 20-30% of O_3 concentration. Wang et al. (2009) have indicated that O_3 formation in
72 Beijing is not only affected by local emissions, but also influenced by Tianjin and the south
73 of Hebei Province. The intense regional transport of pollutants from south to north in NCP
74 has been proposed to be the main reason for the heavy haze pollution in January 2013 in
75 Beijing (Sun et al., 2014; Tao et al., 2014; Wang et al., 2014b). Jiang et al. (2015) have
76 demonstrated that the transport from the environs of Beijing contributes about 55% of the
77 peak $\text{PM}_{2.5}$ concentration in the city during a heavy haze event in December 2013.



78 Since September 2013, the ‘Atmospheric Pollution Prevention and Control Action Plan’
79 (hereafter referred to as APPCAP) has been implemented, which is released by the Chinese
80 State Council to reduce PM_{2.5} by up to 25% by 2017 relative to 2012 levels. After
81 implementation of the APPCAP, high PM_{2.5} mass concentrations still can be observed and
82 the O₃ pollution has deteriorated during summertime since 2013 in Beijing (Chen et al., 2015;
83 Wang et al., 2016). Hence, studies are imperative to explore the O₃ and PM_{2.5} formation from
84 various sources and evaluate the pollutants contributions from local production and
85 trans-boundary transport in Beijing, to support the design of mitigation strategies.

86 The purpose of the present study is to evaluate the contributions of trans-boundary
87 transport of emissions outside of Beijing to the air quality in Beijing and interaction of
88 emissions in and outside of Beijing using the WRF-CHEM model. The model configuration
89 and methodology are described in Section 2. Model results and sensitivity studies are
90 presented in Section 3, and conclusions and discussions are given in Section 4.

91

92 **2 Model and Methodology**

93 **2.1 WRF-CHEM Model**

94 The WRF-CHEM model used in the study is developed by Li et al. (2010, 2011a, b,
95 2012) at the Molina Center for Energy and the Environment, with a new flexible gas phase
96 chemical module and the CMAQ aerosol module developed by US EPA. The wet deposition
97 follows the method used in the CMAQ and the surface deposition of chemical species is
98 parameterized following Wesely (1989). The photolysis rates are calculated using the FTUV
99 (Li et al., 2005; Li et al., 2011a), in which the effects of aerosols and clouds on photolysis are



100 considered.

101 The inorganic aerosols are predicted in the WRF-CHEM model using ISORROPIA
102 Version 1.7 (Nenes et al., 1998). The secondary organic aerosol (SOA) formation is
103 calculated using a non-traditional SOA module. The volatility basis-set (VBS) modeling
104 method is used in the module, assuming that primary organic components are semi-volatile
105 and photochemically reactive and are distributed in logarithmically spaced volatility bins.
106 Detailed information about the volatility basis-set approach can be found in Li et al (2011b).
107 The SOA formation from glyoxal and methylglyoxal is also parameterized as a first-order
108 irreversible uptake by aerosol particles and cloud droplets.

109 2.2 Model Configuration

110 A persistent air pollution episode from 5 to 14 July 2015 in Beijing-Tianjin-Hebei
111 (BTH) is simulated using the WRF-CHEM model. During the episode, the observed mean
112 daily $\text{PM}_{2.5}$ concentration is $73.8 \mu\text{g m}^{-3}$ and the average O_3 concentration in the afternoon
113 reaches $237.0 \mu\text{g m}^{-3}$ in Beijing. The WRF-CHEM model adopts one grid with horizontal
114 resolution of 6 km and 35 sigma levels in the vertical direction, and the grid cells used for the
115 domain are 200×200 (Figure 1). The physical parameterizations include the microphysics
116 scheme of Hong et al (Hong and Lim, 2006), the Mellor, Yamada, and Janjic (MYJ) turbulent
117 kinetic energy (TKE) planetary boundary layer scheme (Janjić, 2002), the Unified Noah
118 land-surface model (Chen and Dudhia, 2001), the rapid radiative transfer model (RRTM)
119 long wave radiation scheme (Mlawer et al., 1997) and the Goddard shortwave
120 parameterization (Suarez and Chou, 1994). The NCEP $1^\circ \times 1^\circ$ reanalysis data are used to
121 obtain the meteorological initial and boundary conditions. The chemical initial and boundary



122 conditions are interpolated from the 6h output of MOZART (Horowitz et al., 2003). The
123 spin-up time of the WRF-CHEM model is 28 hours. The SAPRC-99 (Statewide Air Pollution
124 Research Center, version 1999) chemical mechanism is used in the present study. The
125 anthropogenic emissions are developed by Zhang et al. (2009), including contributions from
126 agriculture, industry, power generation, residential, and transportation sources. The biogenic
127 emissions are calculated online using the MEGAN (Model of Emissions of Gases and
128 Aerosol from Nature) model developed by Guenther et al (2006).

129 2.3 Factor Separation Approach

130 The formation of the secondary atmospheric pollutant, such as O₃, secondary organic
131 aerosol, and nitrate, is a complicated nonlinear process in which its precursors from various
132 emission sources and transport react chemically or reach equilibrium thermodynamically.
133 Nevertheless, it is not straightforward to evaluate the contributions from different factors in a
134 nonlinear process. The factor separation approach (FSA) proposed by Stein et al. (1993) can
135 be used to isolate the effect of one single factor from a nonlinear process and has been widely
136 used to evaluate source effects (Gabusi et al., 2008; Weinroth et al., 2008; Carnevale et al.,
137 2010; Li et al., 2014). The total effect of one factor in the presence of others can be
138 decomposed into contributions from the factor and that from the interactions of all those
139 factors.

140 Suppose that field f depends on a factor φ :

$$141 \quad f = f(\varphi)$$

142 The FSA decomposes function $f(\varphi)$ into a constant part that does not depend on φ ($f(\mathbf{0})$)
143 and a φ -depending component ($f'(\varphi)$), as follows:



144 $f'(0) = f(0)$

145 $f'(\varphi) = f(\varphi) - f(0)$

146 Considering that there are two factors X and Y that influence the formation of secondary
147 pollutants in the atmosphere and also interact with each other. Denoting f_{XY} , f_X , f_Y , and
148 f_0 as the simulations including both of two factors, factor X only, factor Y only, and none of
149 the two factors, respectively. The pure contributions of factor X and Y can be isolated as
150 follows:

151 $f'_X = f_X - f_0$

152 $f'_Y = f_Y - f_0$

153 Note that term $f'_{X(Y)}$ represents the pure impacts of factor $X(Y)$, while f_0 is the term
154 independent of factors X and Y .

155 The simulation including both factors X and Y is given by:

156 $f_{XY} = f_0 + f'_X + f'_Y + f'_{XY}$

157 The mutual interaction between X and Y can be expressed as:

158 $f'_{XY} = f_{XY} - f_0 - f'_X - f'_Y = f_{XY} - (f_X - f_0) - (f_Y - f_0) - f_0 = f_{XY} - f_X - f_Y + f_0$

159 The above equation shows that the study needs four simulations, f_{XY} , f_X , f_Y and f_0 , to
160 evaluate the contributions of two factors and their synergistic interactions.

161 2.4 Statistical Methods for Comparisons

162 In the present study, the mean bias (MB), root mean square error ($RMSE$) and the index
163 of agreement (IOA) are used as indicators to evaluate the performance of WRF-CEHM model
164 in simulation against measurements. IOA describes the relative difference between the model
165 and observation, ranging from 0 to 1, with 1 indicating perfect agreement.



$$166 \quad MB = \frac{1}{N} \sum_{i=1}^N (P_i - O_i)$$

$$167 \quad RMSE = \left[\frac{1}{N} \sum_{i=1}^N (P_i - O_i)^2 \right]^{\frac{1}{2}}$$

$$168 \quad IOA = 1 - \frac{\sum_{i=1}^N (P_i - O_i)^2}{\sum_{i=1}^N (|P_i - \bar{P}| + |O_i - \bar{O}|)^2}$$

169 where P_i and O_i are the predicted and observed pollutant concentrations, respectively. N is
170 the total number of the predictions used for comparisons, and \bar{P} and \bar{O} represents the
171 average of the prediction and observation, respectively.

172 2.5 Pollutants Measurements

173 The hourly measurements of O_3 , NO_2 , and $PM_{2.5}$ used in the study are downloaded
174 from the website <http://www.aqistudy.cn/>. The submicron sulfate, nitrate, ammonium, and
175 organic aerosols are observed by the Aerodyne Aerosol Chemical Speciation Monitor
176 (ACSM), which is deployed at the National Center for Nanoscience and Technology
177 (NCNST), Chinese Academy of Sciences, Beijing (Figure 1). The mass spectra of organic
178 aerosols are analyzed using the Positive Matrix Factorization (PMF) technique to separate
179 into four components: hydrocarbon-like organic aerosol (HOA), cooking organic aerosol
180 (COA), coal combustion organic aerosol (CCOA), and oxygenated organic aerosol (OOA).
181 HOA, COA, and CCOA are interpreted as surrogates of primary organic aerosol (POA), and
182 OOA is a surrogate of SOA.

183

184 3 Results and Discussions

185 3.1 Summertime Air Quality in Beijing

186 The APPCAP has been implemented since 2013 September, so comparisons of
187 summertime pollutants between 2013 and 2015 can show the mitigation effects on the air



188 quality. Considering that high O₃ concentrations generally take place in the afternoon during
189 summertime, Table 1 presents the summertime hourly concentrations of pollutants in the
190 afternoon (12:00 – 18:00 Beijing Time (BJT)) averaged at 12 monitoring sites in Beijing in
191 2013 and 2015. Apparently, implementation of the APPCAP has considerably decrease the
192 concentrations of primary species of CO and SO₂, particularly with regard to SO₂, reduced by
193 more than 40% from 2013 to 2015. Most of NO_x exist in the form of NO₂ in the afternoon
194 during summertime due to active photochemical processes. Therefore, 25.1% decrease of
195 NO₂ in the afternoon from 2013 to 2015 shows that the NO_x emission mitigation is also
196 effective in Beijing. The PM_{2.5} concentrations are decreased by about 24.0% from 2013 to
197 2015, approaching the expected 25% reduction by 2017 relative to 2012 levels. However, the
198 O₃ trend is not anticipated in Beijing, and O₃ concentrations are increased from 133.0 μg m⁻³
199 in 2013 to 163.2 μg m⁻³ in 2015, enhanced by 22.8%. For the discussion convenience, we
200 have defined the O₃ exceedance with hourly O₃ concentrations exceeding 200 μg m⁻³ and
201 PM_{2.5} exceedance with hourly PM_{2.5} concentrations exceeding 75 μg m⁻³. Although the PM_{2.5}
202 exceedance frequency in the afternoon has been decreased by 25.0% from 2013 to 2015, but
203 still remains 32.7% in 2015. The O₃ exceedance frequency in 2015 is 31.8%, enhanced by
204 57.6% compared to 20.2% in 2013. Hence, during the summertime of 2015, two years after
205 implementation of the APPCAP, Beijing still has experienced high O₃ and/or PM_{2.5}
206 pollutions frequently.

207 3.2 Model Performance

208 The hourly measurements of O₃, NO₂, and PM_{2.5} in Beijing-Tianjin-Hebei (BTH) and
209 ACSM measured aerosol species in Beijing are used to validate the WRF-CHEM model



210 simulations.

211 3.2.1 O₃, NO₂, and PM_{2.5} Simulations in Beijing

212 Figure 2 shows the temporal variations of observed and simulated near-surface O₃, NO₂,
213 and PM_{2.5} concentrations averaged over monitoring sites in Beijing from 5 to 14 July 2015.
214 The WRF-CHEM model performs reasonably well in simulating the PM_{2.5} variations
215 compared with observations in Beijing. The *MB* and *RMSE* are -3.6 μg m⁻³ and 22.5 μg m⁻³,
216 respectively, and the *IOA* is 0.86. The underestimation of PM_{2.5} concentrations on July 8 and
217 overestimation on July 11 and 14 are still rather large, perhaps caused by the simulated wind
218 field uncertainties that influence the pollutants transports from outside of Beijing or lack of
219 resolving convective clouds due to the 6 km horizontal resolution. The model well
220 reproduces the temporal variations of O₃ concentrations, with an *IOA* of 0.92. The model
221 considerably underestimates the O₃ concentration during daytime on July 5, 6 and 13. Most
222 of monitoring sites in Beijing are concentrated in the urban area. Therefore, if the simulated
223 winds cause the O₃ plume formed in the urban area to leave early or deviate the O₃ plume
224 transported from outside of Beijing from the urban area, the model is subject to underestimate
225 the O₃ concentration in Beijing (Bei et al., 2010). The WRF-CHEM model also reasonably
226 yields the NO₂ diurnal profiles, but frequently overestimates the NO₂ concentrations during
227 nighttime, which is likely caused by the failure of boundary layer simulations.

228 3.2.2 Aerosol Species Simulations in Beijing

229 Figure 3 shows the temporal variations of simulated and observed aerosol species at
230 NCNST site in Beijing from 5 to 14 July 2015. The WRF-CHEM model generally performs
231 reasonably in simulating the aerosol species variations compared with ACSM measurements.



232 As a primary aerosol species, the POA in Beijing is determined by direct emissions from
233 various sources and transport from outside of Beijing, so uncertainties from emissions and
234 meteorological fields remarkably affect the model simulations (Bei et al., 2012; Bei et al.,
235 2013). Although the *MB* and *RMSE* for POA are $0.0 \mu\text{g m}^{-3}$ and $3.1 \mu\text{g m}^{-3}$, respectively, the
236 *IOA* is less than 0.60, indicating the considerable biases in POA simulations. The
237 WRF-CHEM model has difficulties in well simulating the sulfate aerosol, with an *IOA* lower
238 than 0.60. The model cannot produce the observed high peaks of sulfate aerosols around
239 noontime on 8, 11, and 12 July 2015. The sulfate aerosol in the atmosphere is produced from
240 multiple sources, including SO_2 gas-phase oxidations by hydroxyl radicals (OH) and
241 stabilized criegee intermediates (sCI), aqueous reactions in cloud or fog droplets, and
242 heterogeneous reactions on aerosol surfaces, as well as direct emissions from power plants
243 and industries. There are two possible reasons for the biases in sulfate simulations. Firstly,
244 the model is not able to resolve well convective clouds due to the 6 km horizontal resolution
245 used in simulations, reducing the sulfate production from cloud processes. Secondly, a large
246 amount of SO_2 is released from point sources, such as power plants or agglomerated
247 industrial zones, and the transport of SO_2 from point sources is much sensitive to wind field
248 simulations. The model reasonably well reproduces the observed temporal variations of SOA,
249 nitrate, and ammonium, with *IOAs* exceeding 0.75.

250 3.2.2 O_3 , NO_2 , and $\text{PM}_{2.5}$ Simulations in BTH

251 Figure 4 shows the diurnal profiles of observed and simulated near-surface O_3 , NO_2 ,
252 and $\text{PM}_{2.5}$ concentrations averaged over monitoring sites in BTH from 5 to 14 July 2015. The
253 WRF-CHEM model exhibits good performance in predicting the temporal variations of O_3 ,



254 NO₂, and PM_{2.5} concentrations compared with measurements in BTH, with IOAs higher than
255 0.80. In addition, O₃ and NO₂ simulations are also improved in BTH compared to those in
256 Beijing, indicating better model performance for regional simulations in a large scale.

257 Figure 5 presents the distributions of calculated and observed near-surface PM_{2.5}
258 concentrations along with the simulated wind fields at 10:00 Beijing Time (BJT) on the six
259 selected representative days with high O₃ and PM_{2.5} concentrations. The calculated PM_{2.5}
260 spatial patterns generally agree well with the observations at the monitoring sites. The
261 observed PM_{2.5} concentrations in BTH are still high even after implementation of the
262 APPCAP, frequently exceeding 75 µg m⁻³ on the selected six days. The PM_{2.5} concentrations
263 in Beijing are higher than 115 µg m⁻³ at 10:00 BJT on 8, 11, and 12 July 2015, causing
264 moderate air pollution.

265 Further analyses are provided to interpret the high PM_{2.5} formation in Beijing on July 8
266 and 11, 2015. Figure 6 presents the haze formation process from 20:00 BJT on July 7 to
267 18:00 BJT on July 8 in Beijing. From 20:00 to 22:00 on July 7, the prevailing southeast
268 winds bring the pollutants formed in Tianjin to Beijing. Meanwhile, a PM_{2.5} plume in the east
269 of Beijing has been enhanced and commenced to be transported to Beijing. From 00:00 BJT
270 to 06:00 BJT on July 8, the formed PM_{2.5} plume in the east of Beijing has been transported to
271 the city, but only partially influenced the urban area due to the prevailing northeast winds.
272 From 08:00 to 10:00 on July 8, the PM_{2.5} pollution in the urban area of Beijing is enhanced
273 due to rush hour emissions. After 12:00 BJT on July 8, the PM_{2.5} plume formed in the urban
274 area of Beijing has been transported to the northwest of Beijing and prevailing southeast
275 winds continuously carry the PM_{2.5} formed in Tianjin to Beijing. Figure 7 shows the



276 dominant role of trans-boundary transport in the haze formation in Beijing from 20:00 BJT
277 on July 10 to 18:00 BJT on July 11. From 20:00 on July 10 to 08:00 BJT on July 11, a PM_{2.5}
278 plume formed in the east of Beijing has been transported to Beijing forced by east winds,
279 causing continuous increase of the PM_{2.5} concentration in Beijing. From 08:00 to 12:00 BJT
280 on July 11, the transported PM_{2.5} plume from outside of Beijing has been further enhanced
281 due to rush hour emissions in Beijing, but the WRF-CHEM model overestimates the PM_{2.5}
282 concentration in the urban area due to the simulated weak or calm winds. After 12:00 BJT on
283 July 11, the enhanced south winds commence to transport the PM_{2.5} plume in the urban area
284 to the north of Beijing.

285 The O₃ concentration during summertime reaches its peak during the period from 14:00
286 to 16:00 BJT in Beijing (Tang et al., 2012). Figure 8 presents the spatial distribution of
287 calculated and measured near-surface O₃ concentration at 15:00 Beijing Time (BJT) on the
288 selected six days, along with the simulated wind fields. In general, the simulated O₃ spatial
289 patterns are consistent with the measurements, but model biases still exist, possibly caused by
290 the active convections in the afternoon, which cannot be well resolved in WRF-CHEM model.
291 High O₃ concentrations at 15:00 BJT in Beijing are observed and also simulated by the model,
292 frequently exceeding 250 μg m⁻³. The O₃ transport to Beijing from its surrounding areas is
293 also obvious when the winds are easterly or southerly. Figure 9 provides the spatial
294 distribution of simulated and observed near-surface NO₂ concentration on the selected six
295 days at 08:00 BJT when the NO₂ concentration reaches its peak due to rush hour NO_x
296 emissions and low planetary boundary layer (PBL). The simulated near-surface NO₂
297 concentrations highlights the dominant impact of the anthropogenic emissions, primarily



298 concentrated in cities or their downwind areas, which generally agree well with the
299 measurements. Beijing is surrounded from south to east by cities with high NO₂
300 concentrations, which can influence the O₃ formation in Beijing when south or east winds are
301 prevalent.

302 The good agreements between predicted PM_{2.5}, O₃, NO_x and aerosol species and the
303 corresponding measurements show that the modeled meteorological fields and emissions
304 used in simulations are generally reasonable.

305 3.3 Contributions of Trans-boundary Transport to the O₃ and PM_{2.5} Levels in Beijing

306 The FSA is used in the present study to evaluate the contributions and interactions of
307 emissions from Beijing and outside of Beijing to the near-surface concentrations of O₃ and
308 PM_{2.5} in Beijing. Four model simulations are performed, including f_{BS} with both the
309 anthropogenic emissions from Beijing and outside of Beijing, f_B with the emission from
310 Beijing alone, f_S with only emissions outside of Beijing, and f_0 without both the
311 emissions from Beijing and outside of Beijing, representing background concentrations. The
312 air pollutants levels in Beijing are determined by the contribution from pure local emissions
313 (f'_B , $f_B - f_0$), the trans-boundary transport of pure emissions outside of Beijing (f'_S ,
314 $f_S - f_0$), emission interactions (f'_{BS} , $f_{BS} - f_B - f_S + f_0$), and the background (f_0).

315 Figure 10 provides the temporal variation of the average contributions to near-surface
316 O₃ and PM_{2.5} concentrations in Beijing from total emissions (f_{BS}), emissions from Beijing
317 (f_B) and outside of Beijing (f_S) during the simulation episode. Apparently, the emissions
318 outside of Beijing generally play a more important role in the O₃ level of Beijing than the
319 Beijing local emissions. Even when the Beijing local emissions are excluded, the O₃



320 concentration in Beijing still remains high level, with an average of $153 \mu\text{g m}^{-3}$ and ranging
321 from 130 to $180 \mu\text{g m}^{-3}$ in the afternoon. When only considering the Beijing local emission in
322 simulations, the afternoon average O_3 concentration in Beijing is approximately $126.6 \mu\text{g m}^{-3}$,
323 varying from 80 to $160 \mu\text{g m}^{-3}$. On July 13, the contribution from Beijing local emissions
324 exceeds that from emissions outside of Beijing because north winds are prevailing, bringing
325 clean air to Beijing (Figure 8f). Table 2 gives the average O_3 contributions from 12:00 to
326 18:00 BJT in Beijing from pure Beijing local emissions, pure emissions outside of Beijing,
327 emission interactions, and background. The pure local emissions contribute about 22.4% on
328 average in the afternoon to the O_3 level in Beijing, varying from 15.5% to 35.4%. The pure
329 emissions outside of Beijing contribute more than pure local sources, with an average
330 contribution of 36.6%, ranging from 15.2% to 48.0%. The emission interactions in Beijing
331 decrease the O_3 level by 5.1% on average. O_3 formation is a nonlinear process, depending on
332 not only the absolute levels of NO_x and VOCs, but also the ratio of VOC_s/NO_x . When the O_3
333 precursors emitted from outside of Beijing are transported to Beijing and mixed with local
334 emissions, the concentrations of O_3 precursors are increased and the ratio of VOC_s/NO_x is
335 also altered, causing the formed O_3 concentration unequal to the simple linear summation of
336 O_3 contributions from the local and outside of Beijing emissions. The background O_3 in
337 Beijing plays an important role in the O_3 level in the afternoon, accounting for 45.6% of the
338 O_3 concentration. The O_3 contributions in Beijing induced by the trans-boundary transport of
339 emissions outside of Beijing is about 31.5% of the O_3 concentration during the study episodes,
340 indicating that the trans-boundary transport constitutes the main reason for the elevated O_3
341 level in Beijing after implementation of the APPCAP.



342 When the Beijing local emissions are not considered in simulations, Beijing still
343 experiences high PM_{2.5} pollution, with an average PM_{2.5} concentration of 48.3 μg m⁻³ during
344 the simulation episode, and the PM_{2.5} level in Beijing still exceeds 75 μg m⁻³ on several days.
345 However, when only considering the Beijing local emissions, the average PM_{2.5}
346 concentration in Beijing is 19.6 μg m⁻³ during the episode, showing that Beijing's PM_{2.5}
347 pollution is dominated by the trans-boundary transport. During the study episode, the average
348 PM_{2.5} contribution from the pure local emissions is 13.7%, which is much lower than the
349 contribution of 61.5% from the pure emissions outside of Beijing, further showing the
350 dominant role of the trans-boundary transport in the Beijing PM_{2.5} pollution. The emission
351 interactions enhance the PM_{2.5} level in Beijing on average, with a contribution of 5.9%. The
352 background PM_{2.5} contribution to Beijing is 18.9% on average, lower than those for O₃. The
353 PM_{2.5} contributions caused by the trans-boundary transport is about 67.4% of PM_{2.5}
354 concentrations in Beijing, indicating that the cooperation with neighboring provinces to
355 control the PM_{2.5} level is a key for Beijing to improve air quality.

356 Figure 11 shows the temporal variation of the averaged contributions to the near-surface
357 aerosol constituents from total emissions (f_{BS}), pure emissions from Beijing (f'_B), the
358 trans-boundary transport of pure emissions outside of Beijing (f'_S), emission interactions
359 (f'_{BS}), and the background (f_0) during the simulation episode. The temporal variations of
360 elemental carbon (EC) and POA from pure local emissions and trans-boundary transport
361 exhibit obvious diurnal cycles, e.g., highest during nighttime and lowest in the afternoon,
362 corresponding to the variations of PBL height and anthropogenic emissions. The SOA from
363 pure local emissions reaches its peak in the afternoon when the O₃ concentration is high, but



364 the trans-boundary transport causes the gradual accumulation process of SOA in Beijing from
365 July 5 to 9 and from July 9 to 13. The sulfate temporal profile from the trans-boundary
366 transport is similar to that of SOA, also showing the accumulation process. In addition, the
367 sulfate aerosols from pure local emissions do not vary remarkably. The nitrate aerosols from
368 pure local emissions and the trans-boundary transport generally attain peaks in the morning
369 when the air temperature is not high and the HNO_3 concentrations are not low. The
370 ammonium aerosol variations are generally determined by those of sulfate and nitrate
371 aerosols. For example, the variations of ammonium aerosols from the trans-boundary include
372 not only the morning peaks, but also the accumulation processes from July 5 to 9 and from
373 July 9 to 13. Except the sulfate aerosol, the temporal variations of aerosol species from
374 background are not large.

375 Table 4 presents the average aerosol constituents contributions from pure Beijing local
376 emissions, pure emissions outside of Beijing, emission interactions, and the background, and
377 mass fractions in the total $\text{PM}_{2.5}$ in Beijing during the episode. Organic aerosols (POA+SOA)
378 constitute the most important component of $\text{PM}_{2.5}$, accounting for 34.8% of $\text{PM}_{2.5}$ mass
379 concentration, which is consistent with the ACSM measurement in Beijing (Sun et al., 2014).
380 In addition, SOA contributes more than 70% of organic aerosol mass concentrations, which is
381 due to the high atmospheric oxidation capability caused by elevated O_3 concentrations during
382 summertime. Although the SO_2 concentrations have been decreased by more than 40% since
383 implementation of the APPCAP, sulfate aerosols still play an important role in the $\text{PM}_{2.5}$
384 level in Beijing and make up 25.1% of the $\text{PM}_{2.5}$ mass concentrations, showing high sulfate
385 contributions from the trans-boundary transport and background. The ammonium, nitrate, EC,



386 and unspecified species account for 13.7%, 14.1%, 5.8%, and 6.5% of the PM_{2.5} mass
387 concentrations, respectively. Secondary aerosol species dominate the PM_{2.5} mass
388 concentration in Beijing, with a contribution of 77.9%, corresponding to the high atmospheric
389 oxidation capability.

390 The pure local emissions contribute more than 20% of the mass concentrations for the
391 primary aerosol species, but less than 15% for the secondary aerosol species in Beijing (Table
392 4). The trans-boundary transport of emissions outside of Beijing dominates all the aerosol
393 species levels in Beijing, with contributions exceeding 50%, particularly for SOA and nitrate.
394 In addition, the POA and sulfate background contributions are also high, more than 20%.
395 Although the primary aerosol species of EC and unspecified constituents are not involved in
396 the chemical process and also do not participate the gas-particle partitioning, the emission
397 interactions still enhance EC and unspecified constituents concentrations, with contributions
398 of around 1.5%, which is caused by the aerosol radiative effect. Mixing of Beijing local
399 emissions with those outside of Beijing increases the aerosol concentrations in the PBL and
400 decreases the incoming solar radiation down to the surface, cooling the temperature of the
401 low level atmosphere to suppress the development of PBL and hinder the aerosol dispersion
402 in the vertical direction. The emission interactions increase the POA and SOA concentrations,
403 with a POA contribution of 5.3% and a SOA contribution of 5.9%. In the VBS modeling
404 approach, primary organic components are assumed to be semi-volatile and photochemically
405 reactive. Mixing of Beijing local emissions with emissions outside of Beijing enhances the
406 organic condensable gases, and considering that the saturation concentrations of the organic
407 condensable gases do not change, more organic condensable gases participate into the



408 particle phase, increasing the POA and SOA concentrations. The contributions of emission
409 interactions to inorganic aerosols, including sulfate, nitrate, and ammonium, are more
410 complicated, depending on their particle phase and precursors concentrations. In the present
411 study, ISORROPIA (Version 1.7) is used to calculate the thermodynamic equilibrium
412 between the sulfate-nitrate-ammonium-water aerosols and their gas phase precursors
413 $\text{H}_2\text{SO}_4\text{-HNO}_3\text{-NH}_3\text{-water}$ vapor. Although mixing of Beijing local emissions with those
414 outside of Beijing increase inorganic aerosols precursors, the inorganic aerosol contributions
415 from emission interactions are still uncertain due to the deliberate thermodynamic
416 equilibrium between inorganic aerosols and their precursors. High atmospheric oxidation
417 capability induced by elevated O_3 concentration facilitates HNO_3 formation through NO_2
418 reaction with OH during daytime and N_2O_5 formation through NO_2 reaction with O_3 during
419 nighttime. High O_3 concentrations are produced by Beijing local emissions and those outside
420 of Beijing, accelerating the HNO_3 or N_2O_5 formation. Hence, mixing of Beijing local
421 emissions with those outside of Beijing considerably increases the HNO_3 or N_2O_5 levels,
422 pushing more HNO_3 or N_2O_5 into the particle phase. The nitrate contributions from emission
423 interactions are 18.1%, much more than those for other aerosol constituents. SO_2 gas-phase
424 oxidations by OH and sCl are not as fast as NO_2 reaction with OH, so the formation of
425 sulfuric acid is slow, although the O_3 concentration is high during summertime. Therefore,
426 the sulfate contributions from emission interactions is not significant, only 3.4%. As the
427 ammonium precursor, NH_3 is generally from direct emissions. The ammonium contributions
428 from emission interactions are 1.5%, similar to those of primary aerosol species that are
429 caused by aerosol radiative effects, indicating that the NH_3 emissions are not sufficiently high



430 in Beijing and outside of Beijing.

431

432 4 Summary and Conclusions

433 In the present study, a persistent air pollution episode with high concentrations of O₃
434 and PM_{2.5} are simulated using the WRF-CHEM model during the period from July 5 to 14,
435 2015 in BTH, to evaluate the contributions of trans-boundary transport to the air quality in
436 Beijing. Although the APPCAP has been implemented since 2013 September, the average O₃
437 concentration in the afternoon has been increased by 22.8% from 2013 to 2015 in Beijing,
438 and Beijing still has experienced high O₃ and/or PM_{2.5} pollutions frequently during
439 summertime of 2015.

440 In general, the predicted temporal variations of PM_{2.5}, O₃, and NO₂ concentrations agree
441 well with observations in Beijing and BTH, but the model biases still exist, which is perhaps
442 caused by the uncertainties of simulated meteorological conditions and the emission
443 inventory. The model also successfully reproduces the spatial distributions of PM_{2.5}, O₃, and
444 NO₂ concentrations compared with measurements. The model performs reasonably well in
445 modeling the variations of aerosol constituents compared with ACSM measurement at
446 NCNST site in Beijing, but there are considerable biases in POA and sulfate simulations.

447 The FSA is used to investigate the contribution of trans-boundary transport of emissions
448 outside of Beijing to the air quality in Beijing. If the Beijing local emissions are not
449 considered in model simulations, the O₃ and PM_{2.5} concentrations in Beijing still remain high
450 levels, showing that the trans-boundary transport of emissions outside of Beijing plays a
451 more important role in the air quality in Beijing than the Beijing local emissions. On average,



452 the pure Beijing local emissions contribute 22.4% of O₃ in the afternoon and 13.7% of PM_{2.5}
453 mass concentrations in Beijing during the episode. The O₃ contribution in the afternoon and
454 PM_{2.5} contribution from the trans-boundary transport of emissions outside of Beijing are 36.6%
455 and 61.5%, respectively, far exceeding those from the pure local emissions. The interactions
456 of Beijing local emissions with those outside of Beijing generally decrease the O₃ level in the
457 afternoon and increase the PM_{2.5} level in Beijing during the episode, with contributions of
458 -5.1% and +4.4%, respectively. In addition, the trans-boundary transport dominates all the
459 aerosol species levels in Beijing, with contributions exceeding 50% on average, particularly
460 for SOA and nitrate. The emission interactions in general increase all the aerosol species
461 levels due to the aerosol radiative effect and the enhancement of precursors of secondary
462 aerosols. Hence, the air quality in Beijing during summertime is principally determined by
463 the trans-boundary transport of emissions outside of Beijing. The cooperation with
464 neighboring provinces to decrease pollutant emissions is the optimum approach to mitigate
465 the air pollution in Beijing.

466 It is worth noting that, although the WRF-CHEM model well captures the spatial
467 distributions and temporal variations of pollutants, the model biases still exist. The
468 discrepancies between the predictions and observations are possibly caused by the
469 uncertainties in the emission inventory and the meteorological fields simulations. Future
470 studies need to be conducted to improve the WRF-CHEM model simulations, and further to
471 assess the contributions of trans-boundary transport of emissions outside of Beijing to the air
472 quality in Beijing, considering the rapid changes in anthropogenic emissions since
473 implementation of the APPCAP.



474

475 Data availability: The real-time O₃ and PM_{2.5} are accessible for the public on the website

476 <http://106.37.208.233:20035/>. One can also access the historic profile of observed ambient

477 pollutants through visiting <http://www.aqistudy.cn/>.

478

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684 Table 1 Hourly mass concentrations of pollutants averaged in the afternoon at 12
685 monitoring sites in Beijing during summertime of 2013 and 2015.

Pollutants	CO (mg m ⁻³)	SO ₂ (µg m ⁻³)	NO ₂ (µg m ⁻³)	O ₃ (µg m ⁻³)	PM _{2.5} (µg m ⁻³)
2013	1.09	9.85	31.6	133.0	81.4
2015	0.88	5.71	23.6	163.2	61.9
Change (%)	-20.0	-42.0	-25.1	+22.8	-24.0

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691 Table 2 Average O₃ contributions (%) from 12: 00 to 18:00 BJT in Beijing from pure Beijing local
 692 emissions, pure emissions outside of Beijing, the interactions of both emissions, and background from
 693 5 to 14 July 2015.
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Emissions	Beijing	Surroundings	Interactions	Background
Date	f'_B	f'_S	f'_{BS}	f_0
5	15.5	26.1	-2.4	60.8
6	19.8	30.9	-3.0	52.3
7	25.5	36.0	-3.6	42.1
8	27.0	36.9	-5.9	42.0
9	23.2	35.3	-4.6	46.1
10	18.6	39.9	-2.6	44.1
11	29.4	48.0	-10.0	32.6
12	35.4	40.6	-11.4	35.4
13	23.4	15.2	-1.5	62.9
14	20.3	32.2	-3.3	50.8
Average	22.4	36.6	-5.1	46.1

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700 Table 3 Average PM_{2.5} contributions (%) in Beijing from pure Beijing local emissions, pure emissions
 701 outside of Beijing, the interactions of both emissions, and background from 5 to 14 July 2015.

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Emissions	Beijing	Surroundings	Interactions	Background
Date	f'_B	f'_S	f'_{BS}	f_0
5	14.6	55.1	3.3	27.0
6	14.9	56.3	3.4	25.4
7	14.2	56.4	8.0	21.4
8	13.2	61.1	6.4	19.3
9	15.3	61.3	6.3	17.1
10	11.5	66.5	6.2	15.8
11	9.7	71.0	8.1	11.2
12	14.2	67.6	5.6	12.6
13	19.2	47.2	3.6	30.0
14	16.6	53.1	6.4	23.9
Average	13.7	61.5	5.9	18.9

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707 Table 4 Aerosol species' contributions (%) from pure Beijing local emissions, pure emissions outside
 708 of Beijing, interactions of both emissions, and background, and mass fraction in the total PM_{2.5} (%) in
 709 Beijing averaged during the period from 5 to 14 July 2015.

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Emissions	Mass Fraction	Beijing	Surroundings	Interactions	Background
Species	In Total PM _{2.5}	f'_B	f'_S	f'_{BS}	f_0
EC	5.8	27.0	57.9	1.5	13.6
POA	9.8	20.8	49.0	5.3	24.9
SOA	25.0	14.6	64.2	5.9	15.3
Ammonium	13.7	14.5	65.7	1.5	18.3
Nitrate	14.1	10.1	71.7	18.1	0.1
Sulfate	25.1	6.5	52.9	3.4	37.2
Unspecified	6.5	21.2	61.4	1.6	15.8

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Figure Captions

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717 Figure 1 WRF-CHEM simulation domain. The blue circles represent centers of cities with
718 ambient monitoring sites and the red circle denotes the NCNST site. The size of the
719 blue circle denotes the number of ambient monitoring sites of cities.

720

721 Figure 2 Comparison of measured (black dots) and predicted (blue line) diurnal profiles of
722 near-surface hourly (a) $\text{PM}_{2.5}$, (b) O_3 , and (c) NO_2 averaged over all ambient
723 monitoring stations in Beijing from 5 to 14 July 2015.

724

725 Figure 3 Comparison of measured (black dots) and simulated (black line) diurnal profiles of
726 submicron aerosol species of (a) POA, (b) SOA, (c) sulfate, (d) nitrate, and (e)
727 ammonium at NCNST site in Beijing from 5 to 14 July 2015.

728

729 Figure 4 Comparison of measured (black dots) and predicted (blue line) diurnal profiles of
730 near-surface hourly (a) $\text{PM}_{2.5}$, (b) O_3 , and (c) NO_2 averaged over all ambient
731 monitoring stations in BTH from 5 to 14 July 2015.

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733 Figure 5 Pattern comparison of simulated vs. observed near-surface $\text{PM}_{2.5}$ at 10:00 BJT
734 during the selected periods from 5 to 14 July 2015. Colored circles: $\text{PM}_{2.5}$
735 observations; color contour: $\text{PM}_{2.5}$ simulations; black arrows: simulated surface
736 winds.

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738 Figure 6 $\text{PM}_{2.5}$ pattern variations in Beijing and surrounding areas from 20:00 BJT on July 7
739 2015 to 18:00 BJT on July 8 2015. Colored circles: $\text{PM}_{2.5}$ observations; color
740 contour: $\text{PM}_{2.5}$ simulations; black arrows: simulated surface winds.

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742 Figure 7 $\text{PM}_{2.5}$ pattern variations in Beijing and surrounding areas from 20:00 BJT on July 10
743 2015 to 18:00 BJT on July 11 2015. Colored circles: $\text{PM}_{2.5}$ observations; color
744 contour: $\text{PM}_{2.5}$ simulations; black arrows: simulated surface winds.

745

746 Figure 8 Same as Figure 5, but for O_3 at 15:00 BJT.

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748 Figure 9 Same as Figure 5, but for NO_2 at 08:00 BJT.

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750 Figure 10 Temporal variations of the average contributions to the near-surface O_3 and $\text{PM}_{2.5}$
751 concentrations from total emissions (black line, defined as f_{BS}), emissions from
752 Beijing (blue line, defined as f_B), and emissions outside of Beijing (red line,
753 defined as f_S) in Beijing from 5 to 14 July 2015.

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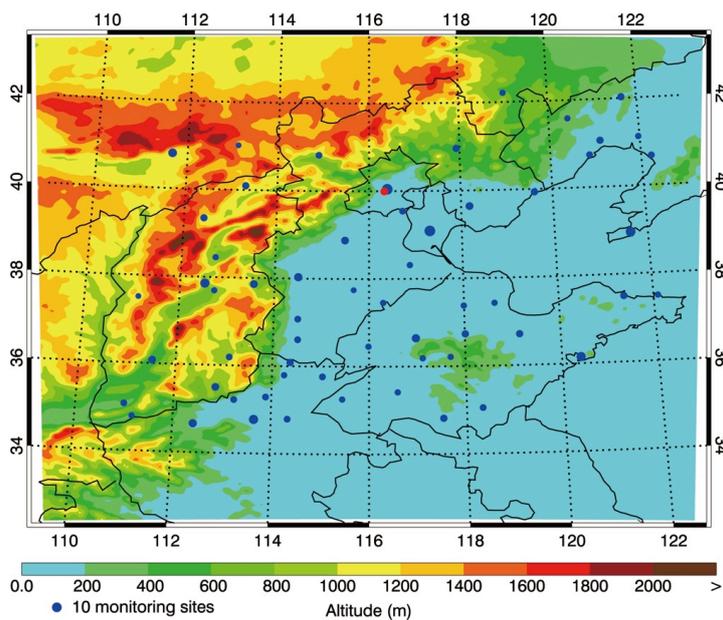
755 Figure 11 Temporal variations of the average contributions to the near-surface aerosol
756 species concentrations from total emissions (black line, defined as f_{BS}), pure
757 emissions from Beijing (blue line, f'_B , defined as $f_B - f_0$), pure emissions
758 outside of Beijing (red line, f'_S , defined as $f_S - f_0$), the emission interactions



759 (green line, f'_{BS} , defined as $f_{BS} - f_B - f_S + f_0$), and background (black dashed
760 line, defined as f_0) in Beijing from 5 to 14 July 2015.
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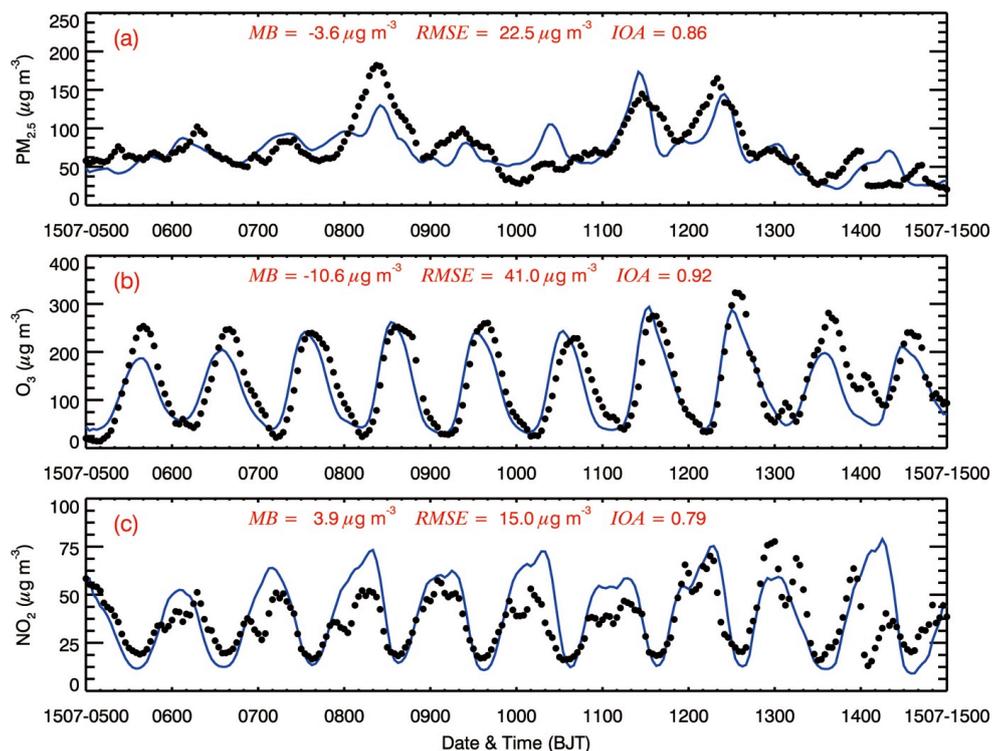


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Figure 1



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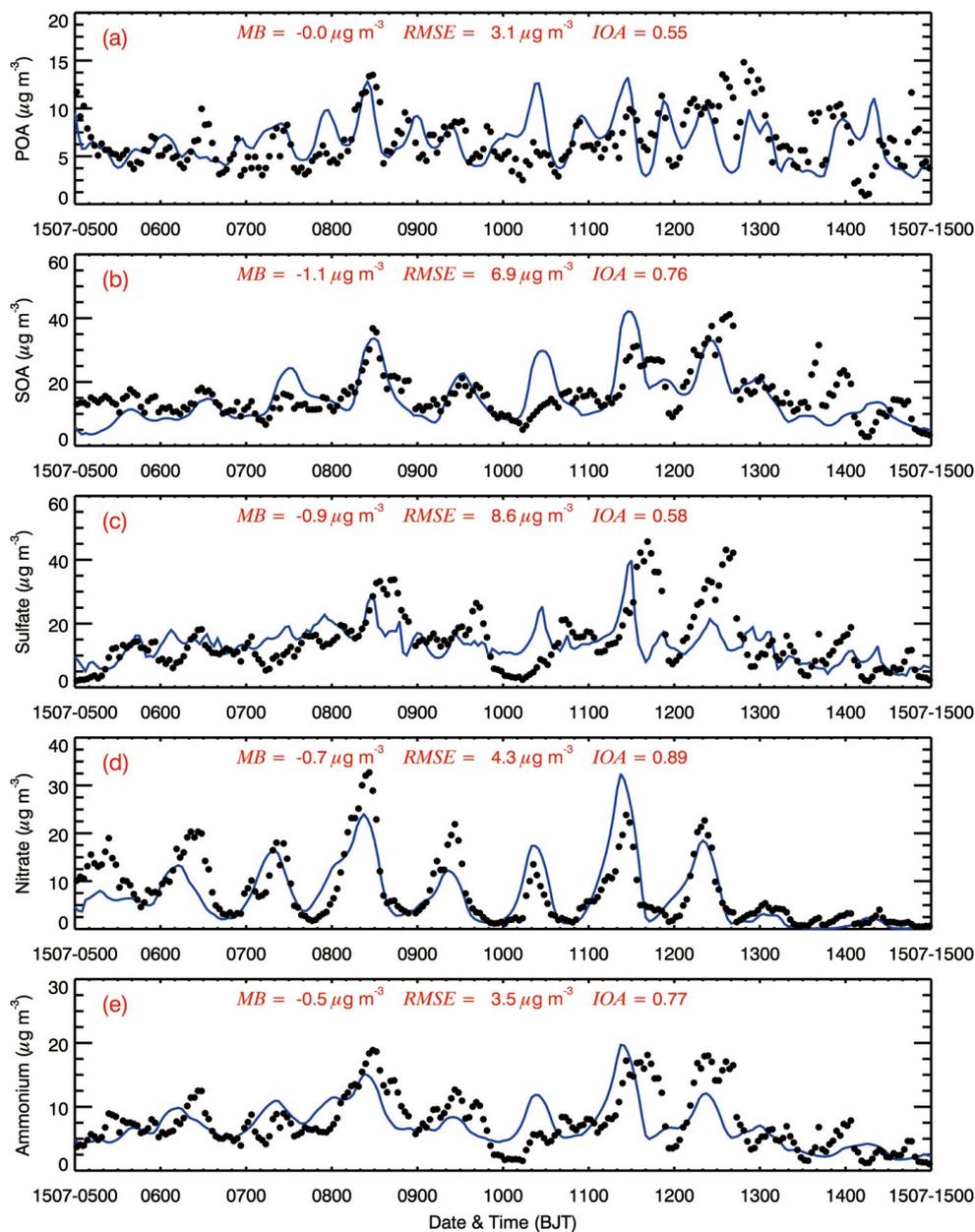
775 Figure 2

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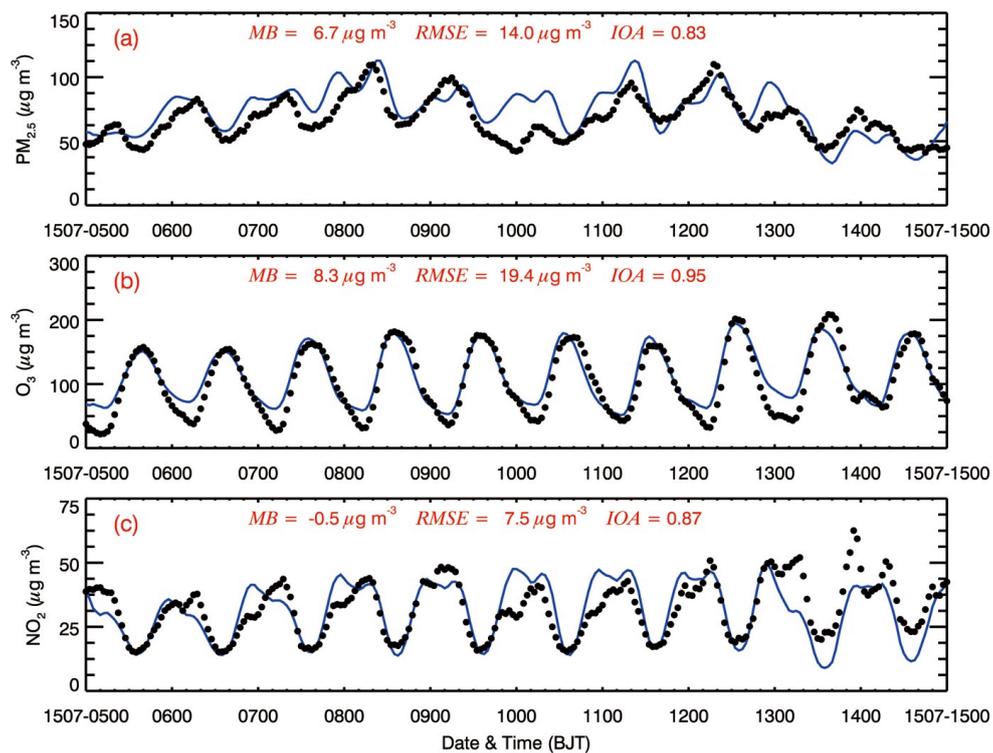
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Figure 3



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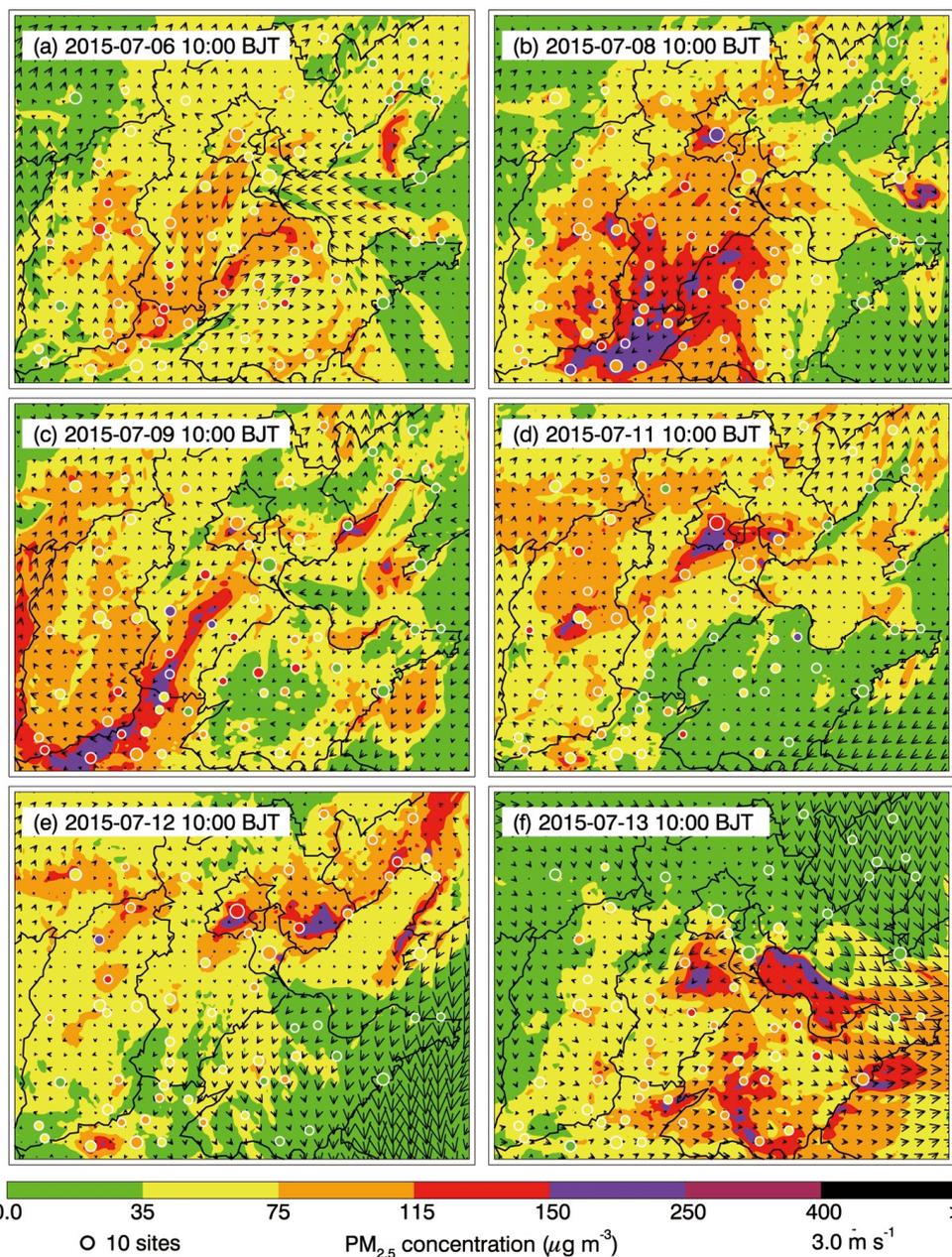
789 Figure 4

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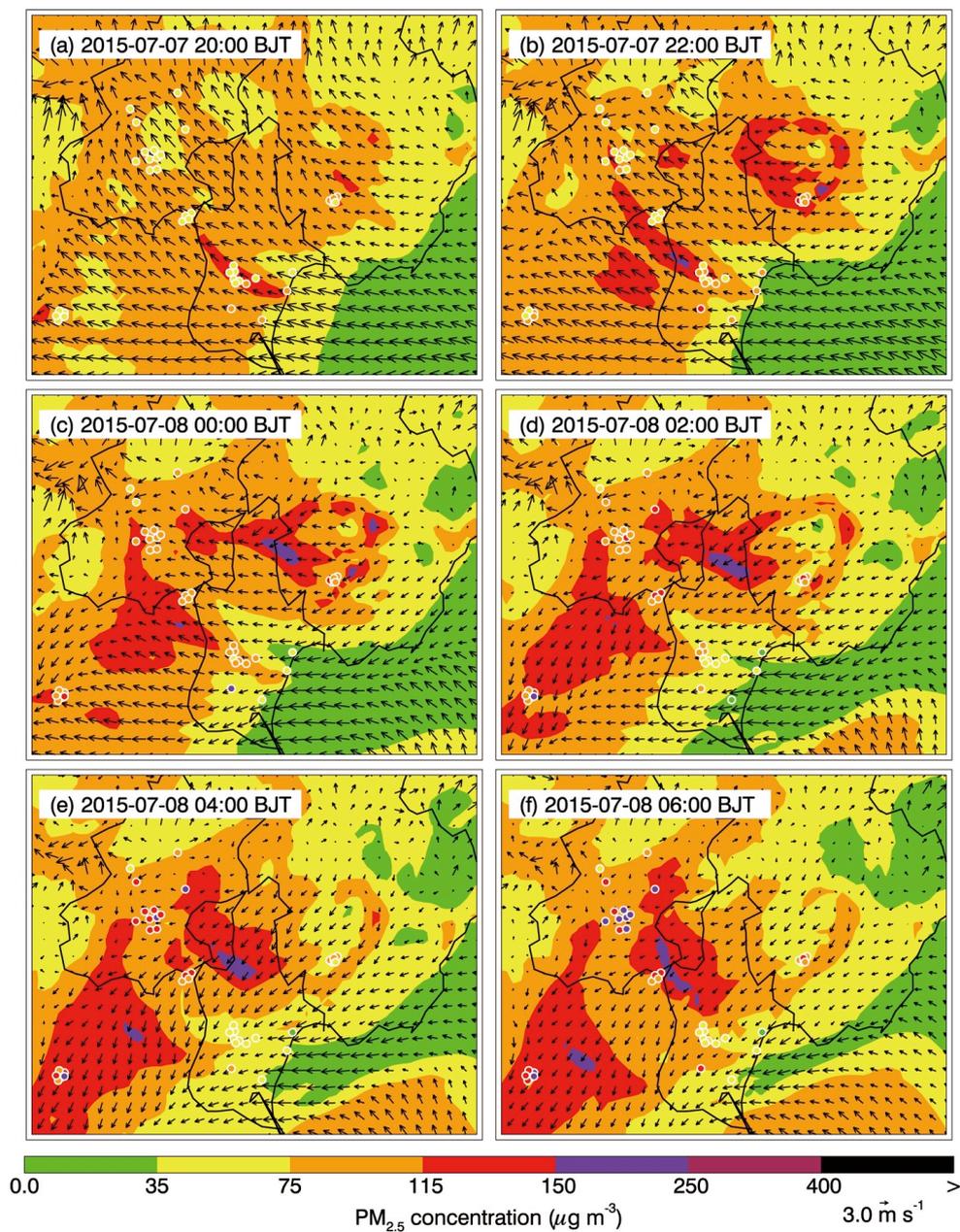
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Figure 5

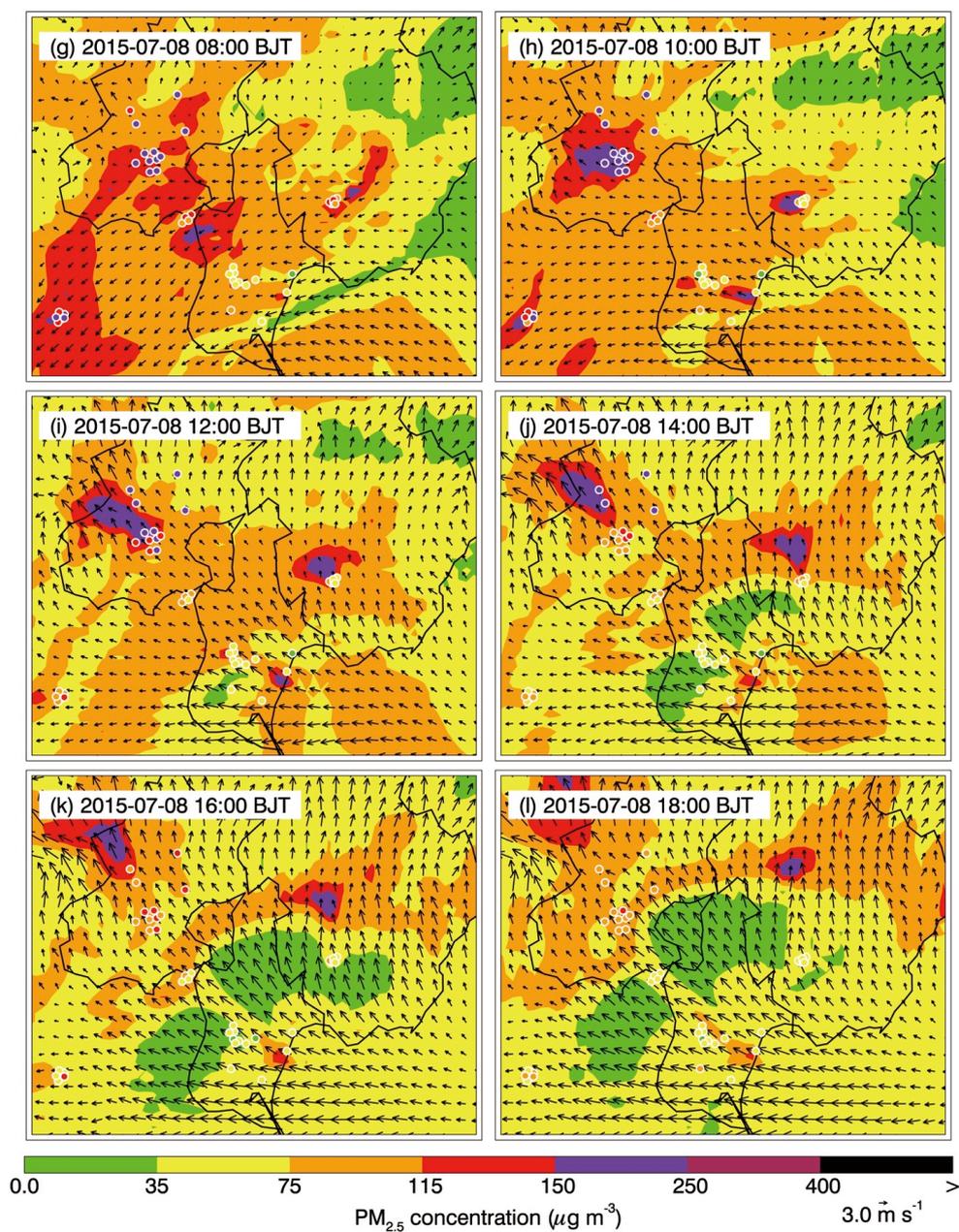


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Figure 6



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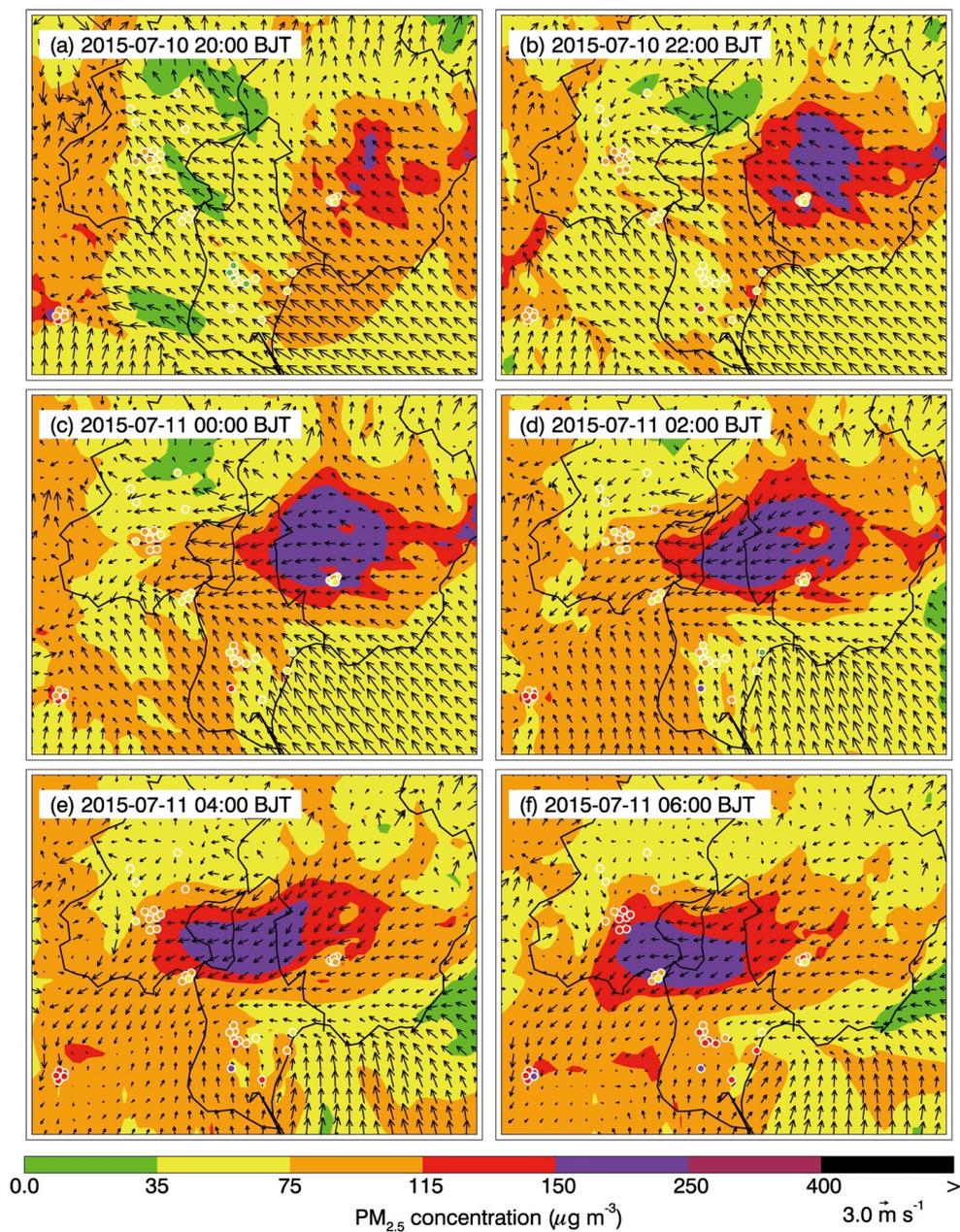
809 Figure 6 Continued

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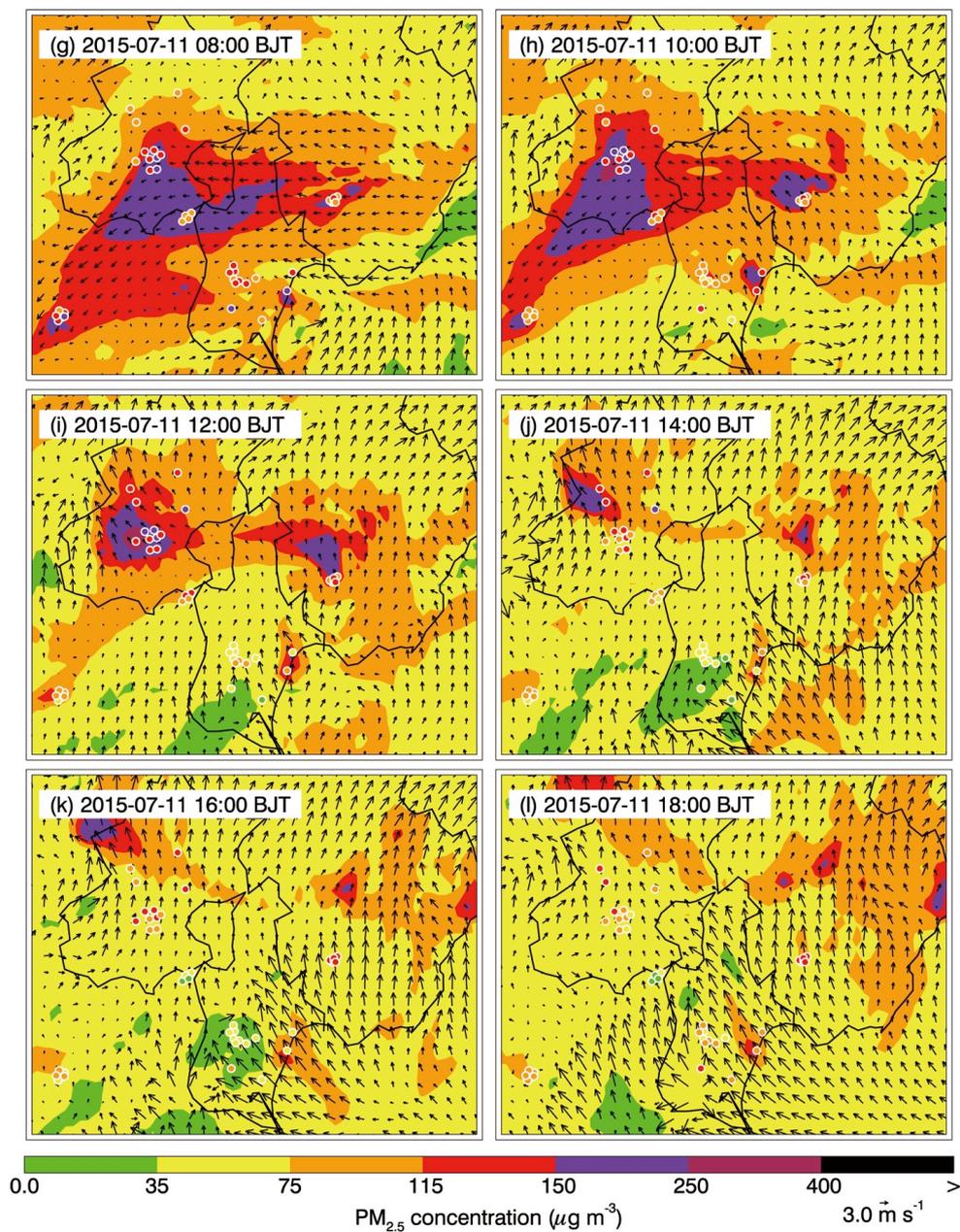


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Figure 7



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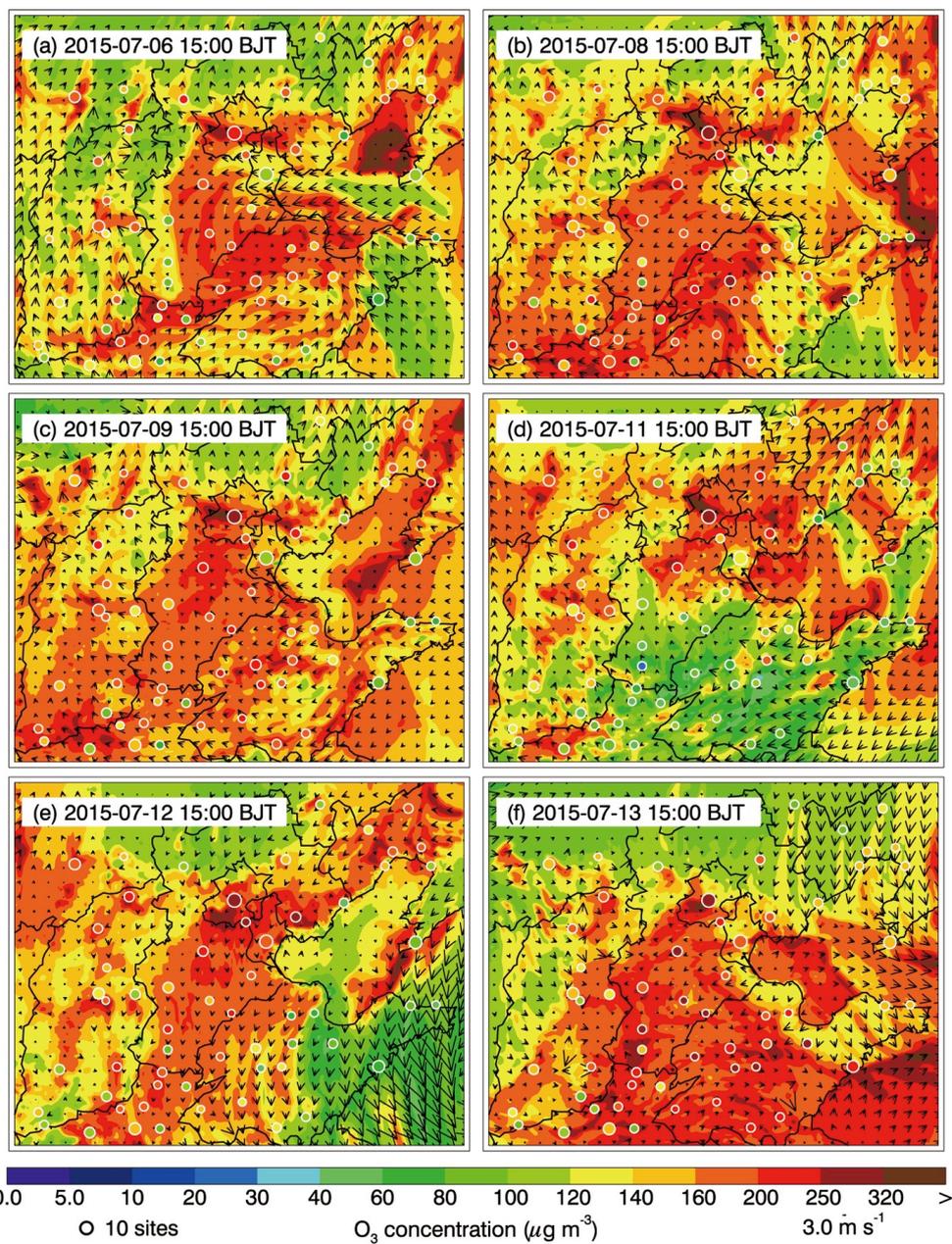
822 Figure 7 Continued

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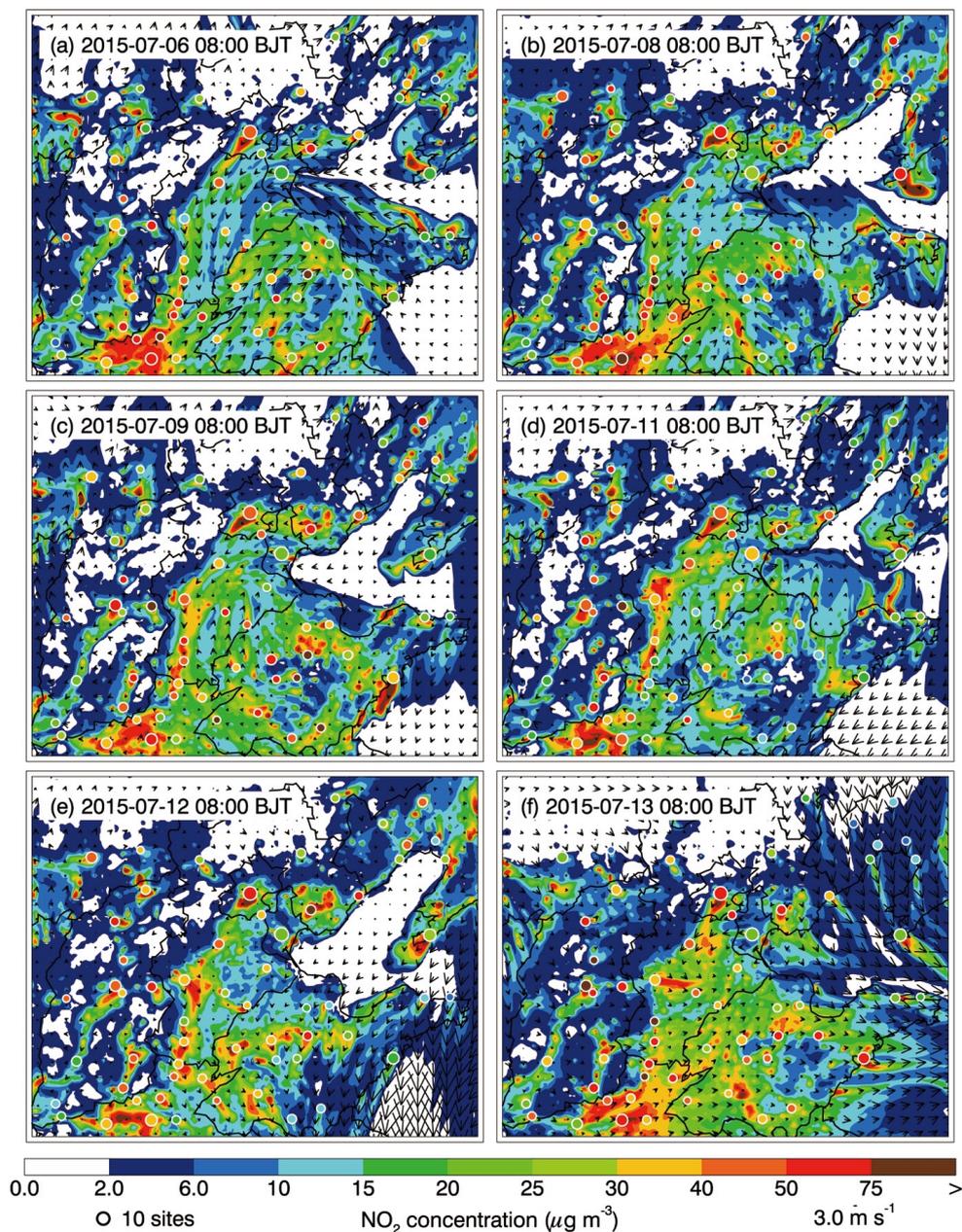
829 Figure 8

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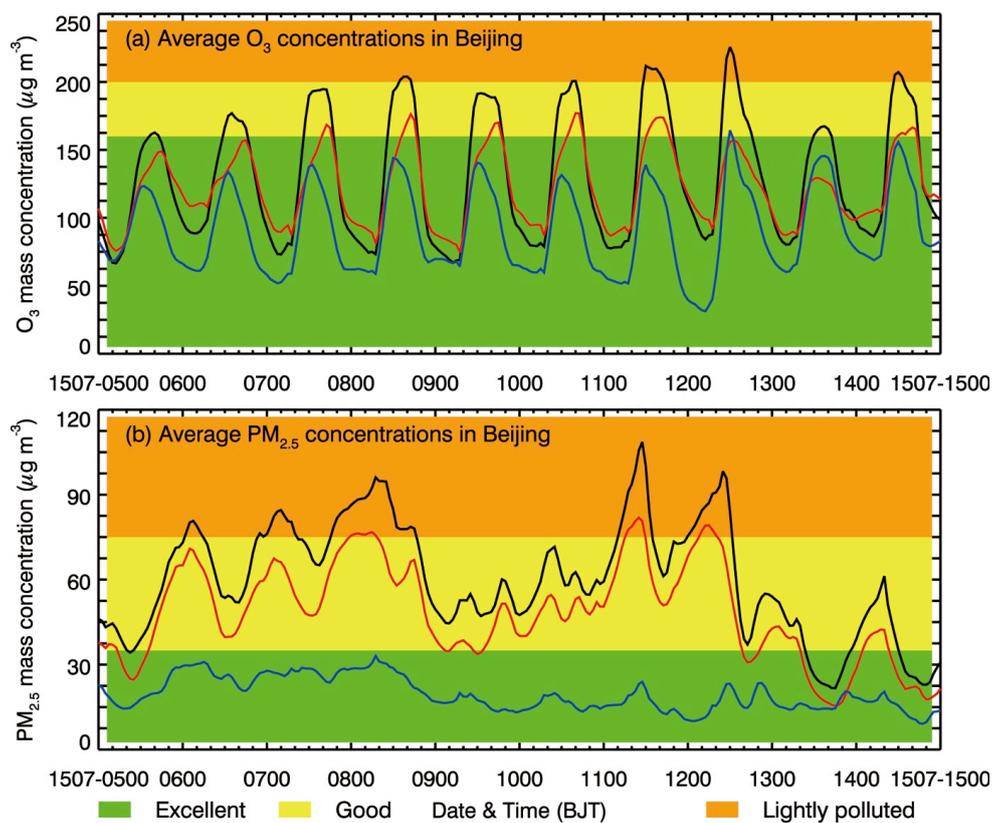
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Figure 9



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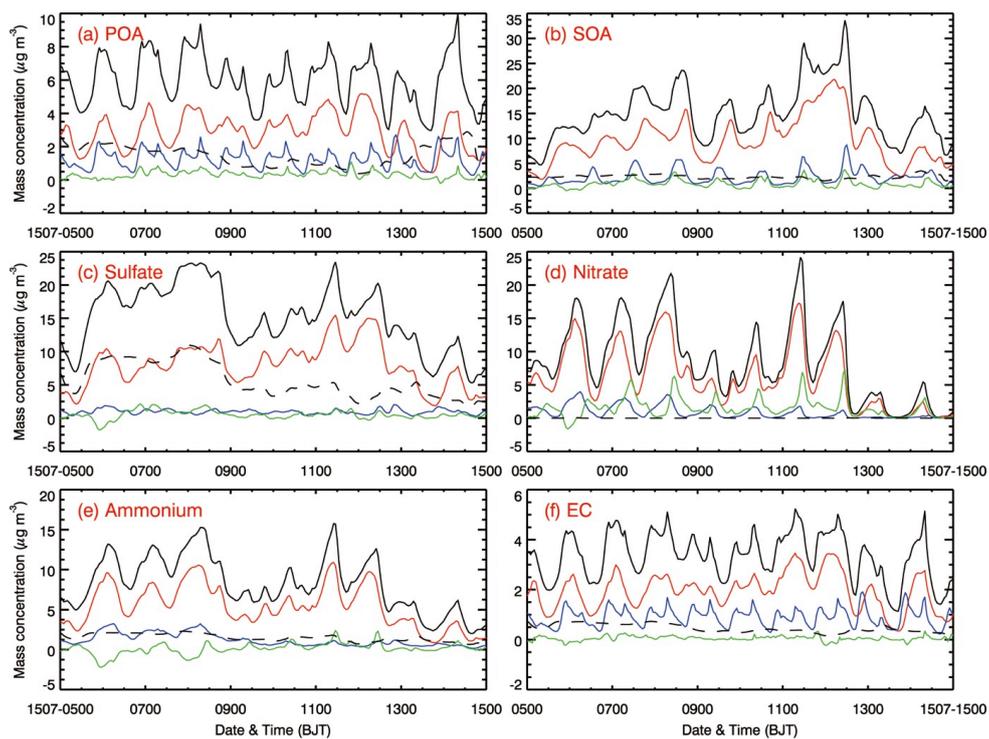
843 Figure 10

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850 Figure 11

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