Widespread air pollutants of the North China Plain during the Asian summer monsoon season: A case study

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7 Supporting Information Section

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The supporting information (SI) provides description about the WRF-CHEM model
configuration, methodology, synoptic conditions, and model evaluations during the study
episode.

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23 Section SI-1 WRF-CHEM Model and Configuration

24 SI-1.1 WRF-CHEM Model

The WRF-CHEM used in this study includes a new flexible gas phase chemical module and the CMAQ aerosol module developed by US EPA (Li et al., 2010; Binkowski and Roselle, 2003). The wet deposition employs the method used in the CMAQ and the surface deposition of chemical species is parameterized following Wesely (1989). The photolysis rates are calculated using the FTUV (Li et al., 2005, 2011a), considering the effects of aerosols and clouds on photolysis.

The simulation of inorganic aerosols in the WRF-CHEM model adopts the ISORROPIA 31 Version 1.7 (Nenes et al., 1998). The secondary organic aerosol (SOA) formation is 32 calculated using a non-traditional SOA module. The volatility basis-set (VBS) modeling 33 method applied in the module assumes that primary organic components are semi-volatile 34 and photochemically reactive and are distributed in logarithmically spaced volatility bins. 35 Detailed information about the volatility basis-set approach can be found in Li et al (2011b). 36 The SOA formation from glyoxal and methylglyoxal is also parameterized as a first-order 37 irreversible uptake by aerosol particles and cloud droplets. 38

39 SI-1.2 Model Configuration

40 The physical parameterizations include the microphysics scheme of Hong et al (Hong41 and Lim, 2006), the Mellor, Yamada, and Janjic (MYJ) turbulent kinetic energy (TKE)

planetary boundary layer scheme (Janjić, 2002), the Unified Noah land-surface model (Chen 42 and Dudhia, 2001), the Goddard longwave radiation scheme (Chou and Suarez, 2001) and the 43 Goddard shortwave parameterization (Chou and Suarez, 1999). The NCEP $1^{\circ} \times 1^{\circ}$ reanalysis 44 data are used to obtain the meteorological initial and boundary conditions, and the 45 meteorology has been nudged in the model simulation. The chemical initial and boundary 46 conditions are interpolated from the 6h output of MOZART (Horowitz et al., 2003). The 47 spin-up time of the WRF-CHEM model is 28 hours. The SAPRC-99 (Statewide Air Pollution 48 Research Center, version 1999) chemical mechanism is used in the present study. The 49 anthropogenic emissions are developed by Zhang et al. (2009), including contributions from 50 agriculture, industry, power generation, residential, and transportation sources. The biogenic 51 emissions are calculated online using the MEGAN (Model of Emissions of Gases and 52 Aerosol from Nature) model developed by Guenther et al (2006). 53

54

55 Section SI-2 Methodology

56 SI-2.1 Factor Separation Approach

The formation of the secondary atmospheric pollutant, such as O₃, secondary organic 57 aerosol, and nitrate, is a complicated nonlinear process in which its precursors from various 58 emission sources and transport react chemically or reach equilibrium thermodynamically. 59 Nevertheless, it is not straightforward to evaluate the contributions from different factors in a 60 nonlinear process. The factor separation approach (FSA) proposed by Stein and Alpert (1993) 61 can be used to isolate the effect of one single factor from a nonlinear process and has been 62 widely used to evaluate source effects (Gabusi et al., 2008; Weinroth et al., 2008; Carnevale 63 et al., 2010; Li et al., 2014a). The total effect of one factor in the presence of others can be 64 decomposed into contributions from the factor and that from the interactions of all those 65 factors. 66

67 Suppose that field f depends on a factor φ :

$$f = f(\varphi)$$

69 The FSA decomposes function f(φ) into a constant part that does not depend on φ (f(0))
70 and a φ-depending component (f'(φ)), as follows:

71
$$f'(0) = f(0)$$

72
$$f'(\varphi) = f(\varphi) - f(0)$$

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

$$f_X' = f_X - f_0$$

$$f_Y' = f_Y - f_0$$

79 Note that term $f'_{X(Y)}$ represents the impacts of factor X(Y), while f_0 is the term 80 independent of factors X and Y.

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

82
$$f_{XY} = f_0 + f'_X + f'_Y + f'_{XY}$$

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

84
$$f'_{XY} = f_{XY} - f_0 - f'_X - f'_Y = f_{XY} - (f_X - f_0) - (f_Y - f_0) - f_0 = f_{XY} - f_X - f_Y + f_Y - f_Y -$$

85
$$f_0$$

86 The above equation shows that the study needs four simulations, f_{XY} , f_X , f_Y and f_0 , 87 to evaluate the contributions of two factors and their synergistic interactions.

88 SI-2.2 Statistical metrics for observation-model comparisons

In the present study, the mean bias (*MB*), root mean square error (*RMSE*) and the index
of agreement (*IOA*) are used as indicators to evaluate the performance of WRF-CEHM model
in simulation against measurements. *IOA* describes the relative difference between the model

92 and observation, ranging from 0 to 1, with 1 indicating perfect agreement.

93
$$MB = \frac{1}{N} \sum_{i=1}^{N} (P_i - O_i)$$

94
$$RMSE = \left[\frac{1}{N}\sum_{i=1}^{N}(P_i - O_i)^2\right]^{\frac{1}{2}}$$

95
$$IOA = 1 - \frac{\sum_{i=1}^{N} (P_i - O_i)^2}{\sum_{i=1}^{N} (|P_i - \overline{O}| + |O_i - \overline{O}|)^2}$$

96 Where P_i and O_i are the predicted and observed pollutant concentrations, respectively. *N* is 97 the total number of the predictions used for comparisons, and \overline{P} and \overline{O} represents the 98 average of the prediction and observation, respectively.

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100 Section SI-3 Synoptic patterns During the Study Episode

101 Figure S3 presents the mean geopotential heights with wind fields at 500 hPa from 23 to 28 May 2015. In May, the main part of the subtropical high at 500 hPa is located in the 102 western Pacific, with its ridgeline moving around the south of China (Chang et al., 2000; Sui 103 et al., 2007; Jiang et al., 2011). On 23 May 2015, a shallow trough was located between 104 120°E and 130°E, with the west-northwest wind prevailing over the NCP and its 105 surroundings (Figure S3a). On 24 and 25 May 2015, the high-level trough intensified and 106 moved to the east, the NCP was located behind the trough, and prevailing northwest winds 107 dominate over the NCP (Figures S4b-c). From 26 to 28 May 2015, another weak trough was 108 109 formed in the westerly wind zone and gradually intensified, moving from 120°E to 130°E. In general, during the study episode, the NCP and its surroundings were located behind the 110 trough and northwest and west flows were prevailing across the region. 111

Figure S4 shows the variations of the daily mean sea level pressure and wind fields from 23 to 28 May 2015. During the study episode, eastern China was influenced by the high pressure whose center was located in the Yellow Sea, which was caused by the high-level trough. With the warm and humid flow induced by the Asian summer monsoon, rainstorms

began to occur in the Pearl River Delta and Yangtze River Delta. The air quality in the NCP, 116 NEC, and NWC was barely influenced by the precipitation during the episode. From 23 to 25 117 118 May 2015, when the NCP and its surroundings were located behind the high-level trough, most of the NCP and NWC regions were controlled by high pressures centering in the Yellow 119 Sea. The high pressure system was conductive to the accumulation of air pollutants, 120 increasing the O₃ and PM_{2.5} levels in the NCP. Meanwhile, the low pressure system was 121 122 stationed on the north of China. The Liaoning and Jilin provinces were located in the foreside of the low pressure system, and the prevailing southwest wind facilitated the transport of air 123 pollutants from southwest to northeast. From 26 to 28 May, with the eastward movement of 124 the high-level trough, the surface high pressure weather system began to be stagnant over 125 eastern China, and most of the NCP regions were sandwiched between the high pressure 126 located over the Yellow Sea and the deep low pressure lying in the north-south direction 127 across Inner Mongolia and southern China. The resultant prevailing southeast and southwest 128 winds were favorable for the air pollutants transport from the NCP to the NWC and NEC. In 129 summary, under the effects of the low pressure in the continent and the high pressure over the 130 Yellow Sea, the prevailing southeast or southwest winds over the NCP and its surroundings 131 are expected to transport air pollutants from the NCP to the NEC and NWC. 132

133

134 Section SI-4 Evaluations of PM_{2.5}, O₃ and NO₂ Simulations in Northern China

The model generally reproduces the variations of $PM_{2.5}$, O_3 and NO_2 concentrations in Northern China, but the model biases still exist. To further evaluate the model performance, Table S1 shows the statistical comparisons of simulated and measured $PM_{2.5}$ concentrations of 13 provinces over NCP, NEC and NWC of China. Over the NCP, the model simulations in Hebei, Henan and Shandong are much better than the other provinces, with *IOA*_s of 0.87, 0.80 and 0.85, respectively. The obvious overestimations of $PM_{2.5}$ concentration occur in Beijing,

Tianjin and Jiangsu, with MB of 10.3 μ g m⁻³, 10.7 μ g m⁻³ and 10.4 μ g m⁻³, respectively. The 141 model bias in Beijing is likely attributed to the trans-boundary transport (Wu et al., 2017). 142 The overestimation in Tianjin and Jiangsu might be caused by the marine cloud and the 143 convections, which can not be well resolved in the WRF-CHEM model simulations. The 144 underestimation generally occurs in Anhui province, particular during the last three days, 145 which is perhaps caused by uncertainties of the biomass burning emission. Over the NEC, the 146 PM_{2.5} concentrations in the four provinces are generally influenced by the trans-boundary 147 transport from the NCP when southerly winds are prevailing. So the uncertainties of wind 148 149 field simulations are one of the most important reasons for the model biases in modeling PM_{2.5} concentrations in the NEC (Bei et al., 2010, 2016a, b). The model performs well in 150 simulating the PM_{2.5} concentration in Shanxi province in the NWC, with *IOA* and *MB* of 0.87 151 and -1.5 µg m⁻³, respectively, but the overestimation occurs in Shaanxi province, with IOA 152 and *MB* of 0.61 and 8.2 μ g m⁻³, possibly caused by the uncertainty of wind field simulations 153 and the emission inventory. 154

Table S2 shows the statistical comparison of simulated and observed O₃ concentrations 155 of 13 provinces in Northern China. The *IOA*_s of 7 provinces in the NCP are generally more 156 than 0.90, except the Anhui Province, indicating the good model performance in the NCP, 157 but the model is subject to underestimation, particular in Beijing which is influenced by the 158 trans-boundary transport. The model simulation of O₃ concentrations in the NEC is not as 159 good as that in the NCP, and the underestimation is considerable in Jilin, Liaoning and Inner 160 Mongolia, which is plausibly caused by uncertainties of the trans-boundary transport of air 161 pollutants from the NCP to NEC when the southerly wind is prevailing. The O₃ 162 overestimation generally occurs in the NWC, with the MB of 7.5 μ g m⁻³ and 11.8 μ g m⁻³ in 163 Shanxi and Shaanxi provinces, respectively. Table S3 provides the statistical comparison of 164 simulated and observed NO₂ concentrations of 13 provinces in Northern China. The model 165

simulations in Tianjin and Liaoning province are not very good in comparison with the otherprovinces, with the *IOA*s less than 0.50.

In general, the model can reasonably simulate the variation of air pollutants during the
study episode, providing the basis to further investigate the effect of trans-boundary transport
of the NCP emissions on the air quality in its surrounding provinces.

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256	Table S1.	Statistical	comparison	of simulated	and measured	PM _{2.5} concer	ntrations in the NCP,
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NEC and NWC.

Region	Province	$MB (\mu g m^{-3})$	$RMSE (\mu g m^{-3})$	IOA
	Beijing	10.3	30.5	0.71
	Tianjin	10.7	33.3	0.52
	Hebei	7.5	14.4	0.87
NCP	Shandong	-1.7	11.7	0.85
	Henan	2.3	21.5	0.80
	Jiangsu	10.4	18.9	0.44
	Anhui	-6.3	22.8	0.43
NEC	Liaoning	-1.5	12.6	0.67
NEC	Jilin	-0.8	12.3	0.58
NILLO	Shanxi	-1.5	14.8	0.87
INWC	Shaanxi	8.2	14.6	0.61
NEC+NWC	Inner Mongolia	-11.5	15.4	0.60

Table S2. Statistical comparison of simulated and measured O_3 concentrations in the NCP, NEC and NWC.

Region	Province	$MB \ (\mu g \ m^{-3})$	$RMSE (\mu g m^{-3})$	IOA
	Beijing	-18.6	46.0	0.90
	Tianjin	-13.6	33.3	0.90
	Hebei	-8.8	19.5	0.96
NCP	Shandong	-14.4	22.5	0.94
	Henan	7.9	23.8	0.94
	Jiangsu	1.3	20.6	0.95
	Anhui	-6.3	22.8	0.84
NEC	Liaoning	-25.4	32.8	0.84
NEC	Jilin	-23.2	34.8	0.83
NILLO	Shanxi	7.5	21.3	0.94
	Shaanxi	11.8	23.3	0.89
NEC+NWC	Inner Mongolia	-13.7	19.3	0.92

Table S3. Statistical comparison of simulated and measured NO_2 concentrations in the NCP, NEC and NWC.

Region	Province	<i>MB</i> (µg m ⁻³)	$RMSE (\mu g m^{-3})$	IOA
	Beijing	5.0	17.7	0.66
	Tianjin	2.1	20.4	0.31
	Hebei	0.7	12.3	0.67
NCP	Shandong	-0.5	12.3	0.71
	Henan	4.2	13.0	0.74
	Jiangsu	2.7	10.3	0.59
	Anhui	0.4	11.2	0.56
NEC	Liaoning	-0.8	12.7	0.45
NEC	Jilin	3.3	12.2	0.68
NIWC	Shanxi	1.7	11.5	0.79
IN WC	Shaanxi	4.7	11.1	0.75
NEC+NWC	Inner Mongolia	1.1	7.6	0.88

277	SI Figure Captions
278 279 280 281	Figure S1 Defined three sections in Northern China. 1) Northeast China (NEC): Heilongjiang, Jilin, Liaoning, and the east part of Inner Mongolia; 2) Northwest China (NWC): Shanxi, Shaanxi, and the west part of Inner Mongolia; 3) North China Plain (NCP): Beijing, Tianjin, Hebei, Shandong, Henan, and the north part of Jiangsu and Anhui.
282 283	Figure S2 Spatial distribution of anthropogenic emission rates of (a) NO_x , (b) VOC_s , (c) OC, and (d) $SO_2(10^6 \text{ g month}^{-1})$ in Mainland China.
284	Figure S3 Geopotential heights and wind vectors at 500 hPa from 23 to 28 May 2015.
285	Figure S4 The mean sea level pressure and wind vectors from 23 to 28 May 2015.
286 287 288 289 290	



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295 Shaanxi, and the west part of Inner Mongolia; 3) North China Plain (NCP): Beijing, Tianjin,

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Figure S2 Spatial distribution of anthropogenic emission rates of (a) NO_x , (b) VOC_s , (c) OC, and (d) $SO_2(10^6 \text{ g month}^{-1})$ in Mainland China.





