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¹ Global Atmospheric Transport and Source-Receptor Relationships ² for Arsenic

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9 Supporting Information

ABSTRACT: Arsenic and many of its compounds are toxic 10 pollutants in the global environment. They can be transported 11 long distances in the atmosphere before depositing to the 12 surface, but the global source-receptor relationships between 13 various regions have not yet been assessed. We develop the 14 first global model for atmospheric arsenic to better understand 15 and quantify its intercontinental transport. Our model 16 reproduces the observed arsenic concentrations in surface air 17 over various sites around the world. Arsenic emissions from 18 19 Asia and South America are found to be the dominant sources for atmospheric arsenic in the Northern and Southern 20 Hemispheres, respectively. Asian emissions are found to 21



22 contribute 39% and 38% of the total arsenic deposition over

23 the Arctic and Northern America, respectively. Another 14% of the arsenic deposition to the Arctic region is attributed to

European emissions. Our results indicate that the reduction of anthropogenic arsenic emissions in Asia and South America can significantly reduce arsenic pollution not only locally but also globally.

26 INTRODUCTION

²⁷ Arsenic is a ubiquitous metalloid in the global environment. ²⁸ Elemental arsenic and many of its compounds have high ²⁹ toxicity and have been listed by the International Agency for ³⁰ Research on Cancer (IARC) as Group 1 carcinogens.¹ There ³¹ have been many studies showing increased lung cancer risk for ³² people living or working near arsenic-emitting industrial plants ³³ such as smelting facilities.²⁻⁶ These arsenic compounds, even at ³⁴ relatively low exposure levels, can also cause many other ³⁵ adverse health effects related to the brain and nervous system, ³⁶ digestive system, and skin.⁷⁻⁹

There have been increasing concerns about arsenic pollution 38 in the environment. In 2012, Consumer Reports¹⁰ conducted 39 tests on more than 200 samples of rice products in the United 40 States and found that many of them (including some organic 41 products and infant rice cereals) contain arsenic at "worrisome 42 levels". Since 2013, the European Union Directive has set an air 43 quality standard for arsenic concentration in ambient air, which 44 is 6 ng m⁻³ for annual mean concentrations. Besides direct 45 inhalation, the arsenic concentration in ambient air can also 46 affect the human exposure to arsenic through atmospheric 47 deposition, which can enhance the arsenic levels in food 48 (through arsenic uptake by crops and vegetation) or drinking 49 water. Direct atmospheric deposition of arsenic was found to be 50 the dominant transport pathway for arsenic from a factory to the leafy vegetables grown nearby, while arsenic in the root 51 crops originated from both the soil and the atmosphere.¹¹ 52 Therefore, the atmospheric concentrations and deposition of 53 arsenic need to be accounted for to fully understand and 54 evaluate the human exposure risk to arsenic in the environ- 55 ment.^{12,13} 56

There are both anthropogenic and natural sources for 57 atmospheric arsenic. Metal (copper, zinc, and lead) smelting 58 and coal combustion are the major anthropogenic arsenic 59 sources, ^{14–16} with copper smelting being the most important 60 single source based on arsenic emissions. ^{15–17} Additional minor 61 anthropogenic sources include the application of herbicide, 62 wood preservation, and waste incineration. ¹⁶ Natural sources 63 for arsenic in the atmosphere include volcanic emissions, wind 64 erosion of soil, and biological activities, with volcanic emissions 65 being the most important source. ^{14,17,18} There are large 66 uncertainties associated with the estimation of arsenic 67 emissions to the atmosphere, but according to available 68 global-scale estimates of emissions, the global anthropogenic 69 sources are much larger than natural sources. ^{14,17,19,20}

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Figure 1. Arsenic concentrations in surface air. Model-simulated annual (for year 2005) mean arsenic concentrations in ambient air (background) compared with measurement data at various stations (circles) around the world. Refer to Table 1 for specific values.

There are large spatial variations for the atmospheric 71 72 concentrations of arsenic, which can vary by several orders of 73 magnitude (from less than 0.1 ng m^{-3} in remote sites to more 74 than 10 ng m⁻³ in urban and industrial areas), presumably 75 reflecting the impacts from anthropogenic activities. The 76 surface arsenic concentrations were reported to be less than 77 0.041 ng m⁻³ in the south polar atmosphere.²¹ In China and Chile, the surface arsenic concentrations were found to reach 15 ng m⁻³ or higher.^{22,23} The typical residence time of arsenic 79 so in the atmosphere is several days,^{17,24,25} making its long-range 81 transport possible. This implies that arsenic emissions from one 82 region can significantly affect other regions downwind. 83 However, the global source-receptor relationship between 84 various regions has not been quantified so far, in contrast to 85 the extensively studied source-receptor relationship for other 86 anthropogenic pollutants and dust.²⁶

Some previous studies have shown that the regional transport 87 88 of atmospheric arsenic is evident. Using a trajectory model, 89 Pacyna et al.²⁷ studied the atmospheric transport of arsenic and 90 several other trace elements from European source regions to 91 Norway and reported that the performance of the model is 92 most sensitive to changes in emissions and deposition velocities 93 of these elements. Akeredolu et al.²⁸ investigated the long-range 94 transport of arsenic and other anthropogenic heavy metals into 95 the Arctic region for the period of July 1979-June 1980 and 96 found that the model results agreed with observations within a 97 factor of 2-3. Gidhagen et al.²³ studied the regional effects 98 from smelter emissions of arsenic in Chile and demonstrated 99 that anthropogenic emissions are the dominant sources for 100 arsenic in the ambient air. A more recent study²⁹ simulating the 101 atmospheric concentrations of some heavy metals over Europe 102 pointed out that the limited data in emissions is an important ¹⁰³ factor affecting the model performance. Another recent study³⁰ 104 reported that the model results significantly underestimate the 105 measured atmospheric concentrations of arsenic and other 106 heavy metals in the United Kingdom, but it did not include any sources outside of the European region. On the basis of the 107 significant arsenic enrichment in snowpack samples from the 108 109 Antarctic Plateau, Hong et al.³¹ proposed that the emissions of 110 trace elements (including arsenic) from nonferrous metal 111 smelting and fossil fuel combustion processes in South 112 America, especially in Chile, are the most likely sources. The

seemingly pristine polar regions are particularly vulnerable to 113 global change, and the long-range transport of air pollutants 114 including arsenic can have very important implications for the 115 polar environment.³² 116

In this study, we develop the first-ever global gridded 117 emission inventory for arsenic and implement it in a global 118 atmospheric chemical transport model (GEOS-Chem) to 119 examine the global transport and source-receptor relationships 120 for arsenic. 121

MATERIALS AND METHODS

We developed a global arsenic model based on the GEOS- 123 Chem chemical transport model (http://geos-chem.org) v9-01- 124 01. The GEOS-Chem model has been applied to a wide range 125 of research related to atmospheric trace gases, aerosols, and 126 mercury.^{33–35} It is driven by assimilated meteorological fields 127 from the NASA Global Modeling and Assimilation Office 128 (GMAO). The GEOS-4 meteorological data were used for all 129 of the model simulations except for the 2011 simulation 130 (specifically for comparison to measurement data from the 131 MBO site), which was driven by GEOS-5 data (because GEOS-4 data is not available). 133

Available data on arsenic emissions for various regions 134 around the world were compiled, processed, and gridded to 4° 135 latitude by 5° longitude for the model with a base year of 2005 136 (unless otherwise specified). For Chile, the major arsenic 137 source region in the Southern Hemisphere, we followed 138 Gidhagen et al.²³ The Australian emissions were assessed based 139 on Australia's National Pollutant Inventory (NPI) (http:// 140 www.npi.gov.au/resource/arsenic-and-compounds-0). Arsenic 141 emissions in the United States were assessed following the 142 U.S. EPA NATA (National-Scale Air Toxics Assessment) 143 inventory for 1999 (http://archive.epa.gov/airtoxics/nata1999/ 144 web/html/index.html). The Canadian emissions assessments 145 were based on Environment Canada's National Pollutant 146 Release Inventory for 2000 (NPRI) (http://www.ec.gc.ca/ 147 inrp-npri). The European emissions of arsenic were assessed 148 following the ESPREME inventory (http://espreme.ier.uni- 149 stuttgart.de). 150

There is no national emission inventory for arsenic emissions 151 from metal smelting available for China, so we developed a new 152 inventory for China in this study. It was derived using the 153

Table 1. Model-Simulated Annual Average Surface Atmospheric Arsenic Concentrations Compared with Observations

site	model result (ng m ⁻³)	observations (ng m^{-3})	year of observations	source/reference for observational data ^a		
Storhofdi, Iceland (63.4°N, 20.3°W)	0.07	0.18	2005	EMEP		
Peyrusse Vieille, France (43.6°N, 0.2°E)	0.14	0.20	2005	EMEP		
Neuglobsow, Germany (53.1°N, 13.0°E)	0.47	0.86	2005	EMEP		
Topoliniky, Slovakia (48.0°N, 17.8°E)	0.84	0.44	2005	EMEP		
Montseny, Spain (41.8°N, 2.4°E)	0.20	0.29	2005	EMEP		
Bredkalen, Sweden (63.8°N, 15.3°E)	0.09	0.10	2002	EMEP		
Pallas, Finland (61.0°N, 24.2°E)	0.27	0.15	2005	EMEP		
Rucava, Latvia (56.2°N, 21.1°E)	0.27	0.38	2005	EMEP		
Florida, United States (30.1°N, 84.2°W)	0.48	0.46	2005	IMPROVE		
Virginia, United States (37.6°N, 79.5°W)	0.63	0.44	2005	IMPROVE		
Maine, United States (46.7°N, 68.0°W)	0.25	0.16	2005	IMPROVE		
Michigan, United States (47.5°N, 88.1°W)	0.19	0.15	2004	IMPROVE		
South Dakota, United States (43.7°N, 101.9°W)	0.14	0.05	2005	IMPROVE		
Texas, United States (31.8°N, 104.8°W)	0.23	0.23	2005	IMPROVE		
Washington, United States (46.6°N, 121.4°W)	0.18	0.12	2005	IMPROVE		
California, United States (34.2°N, 116.9°W)	0.18	0.07	2005	IMPROVE		
Idaho, United States (44.2°N, 114.9°W)	0.19	0.03	2005	IMPROVE		
Hawaii, United States (19.4°N, 155.3°W)	0.10	0.01	2005	IMPROVE		
Alaska1, United States (56.5°N, 132.8°W)	0.07	0.02	2005	IMPROVE		
Alaska2, United States (55.3°N, 160.5°W)	0.08	0.04	2005	IMPROVE		
Beijing, China (39.8°N, 117.0°E)	22	18	2005	22		
Shanghai, China (31.4°N, 121.3°E)	26	27	2004-2005	58		
Sichuan, China (29.6°N, 102.0°E)	4.2	6.1	2006	59		
Ulleung Island, S. Korea (37.5°N, 130.9°E)	3.6	3.0	2003-2008	60		
Quillota, Chile (32.9°S, 71.2°W)	30	31	1999-2000	23		
Quillagua, Chile (21.6°S, 69.5°W)	4.4	6.5	1999-2000	23		
^a EMEP: European Monitoring and Evaluation Programme, IMPROVE: Interagency Monitoring of Protected Visual Environments.						

154 production data of nonferrous metals from the Yearbook of 155 Nonferrous Metals Industry of China 2005³⁶ and the correspond-156 ing arsenic emission factors from Chilvers and Peterson.¹⁶ Arsenic emissions from coal-fired power plants in China 157 followed Tian et al.³⁷ Initial model evaluation with our a priori 158 arsenic emission inventory developed for China showed a 159 systematic low bias for model-simulated arsenic concentrations 160 over China. A likely reason for this low bias is that the arsenic 161 emission factors¹⁶ from metal smelting used in this study might 163 be too low for China. Thus, we scaled up the arsenic emissions 164 due to metal smelting in China by a factor of 1.5 and then 165 found very good agreement between model results and 166 observational data (Figure 1 and Table 1).

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167 Anthropogenic arsenic emissions from other countries 168 around the world were estimated by taking advantage of the 169 available SO₂ emission inventories from the Emissions Database for Global Atmospheric Research (EDGAR; http:// 170 edgar.jrc.ec.europa.eu). We followed EDGAR version 3³⁸ for 171 SO_2 emissions in 2005 and applied a constant value for the As/ 172 emission ratio^{39,40} to derive the arsenic emissions from other S 173 countries not previously mentioned. The As/S emission ratio 174 assumed the median value of 5.63×10^{-4} (standard deviation 175 3.92×10^{-4}) g As/g S from literature studies.^{39,40} Due to the 176 177 limited data available on the correlations of As/S emissions, there is significant uncertainty associated with the emission 178 ratio we used. 179

¹⁸⁰ We also estimated arsenic emissions from volcanic activities ¹⁸¹ based on the As/S correlations. We followed the global volcanic ¹⁸² SO₂ emission inventory from Andres and Kasgnoc,⁴¹ and the ¹⁸³ volcanic arsenic emissions were calculated using the ratio of ¹⁸⁴ 1.59 × 10⁻⁴ g As/g S, which is the median value of As/S flux ratios found for volcanic emissions around the world (standard 185 deviation = 1.0×10^{-3} g As/g S).⁴²⁻⁴⁵ 186

Because most (90% or more) atmospheric arsenic sorbs onto ¹⁸⁷ aerosols, ⁴⁶ particularly fine-mode (i.e., $PM_{2.5}$) aerosols, ^{47,48} we ¹⁸⁸ treated the deposition processes of arsenic similarly as $PM_{2.5}$ ¹⁸⁹ aerosols. The wet deposition of arsenic followed the scheme ¹⁹⁰ used by Liu et al., ⁴⁹ which considers the scavenging from ¹⁹¹ convective updrafts, rainout from convective anvils, and rainout ¹⁹² and washout from large-scale precipitation. The dry deposition ¹⁹³ followed a resistance-in-series scheme, ⁵⁰ with the surface ¹⁹⁴ resistances following the work of Zhang et al. ⁵¹ The wet ¹⁹⁵ deposition in GEOS-Chem with both GEOS-4 and GEOS-5 ¹⁹⁶ meteorological fields has been previously evaluated. ^{52,53}

For model evaluation, we focused on atmospheric arsenic 198 measurement data from nonurban sites given the coarse spatial 199 resolution (4° latitude \times 5° longitude) of the global model. We 200 collected available measurement data from various regions 201 around the world in the literature and compiled them in Table 202 1. Except for the time series data from the Mount Bachelor 203 Observatory, data for sites in the United States and Europe 204 were from the Interagency Monitoring of Protected Visual 205 Environments (IMPROVE)54 and the European Monitoring 206 and Evaluation Programme (EMEP)⁵⁵ network, respectively. 207 The MBO site has been used for over a decade to examine the 208 long-range transport of aerosol- and gas-phase pollutants in 209 baseline air arriving to North America.^{56,57} Data from the MBO 210 were obtained using a rotating drum impactor with a 3 h time 211 resolution and with synchrotron X-ray fluorescence analysis.⁵⁷ 212 It appears that the measurement data for atmospheric arsenic 213 deposition are extremely limited, so we are not able to evaluate 214 the model performance on arsenic deposition in this study. 215

Table 2. Sources and Average Atmospheric Lifetimes of Arsenic for Various Regions^a

	global	East Asia	Europe	North America	South America	other regions
anthropogenic sources (Gg yr ⁻¹)	28.6	15.5	0.7	0.6	4.3	7.5
natural sources (Gg yr ⁻¹)	2.1	0.3	0.2	0.04	0.1	1.5
lifetime (days) ^b	4.5	4.1	4.1	5.4	4.5	not estimated

^aThe geographical regions are defined as East Asia ($20-56^{\circ}N$, $92.5-152.5^{\circ}E$); Europe ($36-72^{\circ}N$, $12.5^{\circ}W-62.5^{\circ}E$); North America ($24-60^{\circ}N$, $132.5-57.5^{\circ}W$); and South America ($40-4^{\circ}S$, $82.5-57.5^{\circ}W$). ^bAtmospheric lifetime of arsenic against deposition (dry deposition plus wet deposition).



Figure 2. Source attribution for arsenic deposition. Shown as percentage of total atmospheric arsenic deposition attributable to emissions from (a) Asia; (b) Europe; (c) North America; and (d) South America. Source regions are indicated as rectangular boxes in Figure S1.

6 RESULTS AND DISCUSSION

 $_{217}$ The global arsenic emissions are calculated to be 30.7 Gg yr⁻¹ 218 with the breakdown for major source regions (15.8 and 4.4 Gg 219 yr^{-1} in East Asia and South America, respectively), as 220 summarized in Table 2. Our global total arsenic emission is 221 comparable to that in previous studies by Walsh et al.¹⁷ and 222 Nriagu,¹⁸ who both estimated the global total arsenic emissions 223 to be 31 Gg yr⁻¹. In contrast, Chilvers and Peterson¹⁶ estimated 224 a very large natural source for arsenic, leading to a much higher 225 global total arsenic emission of 73.5 Gg yr⁻¹. The model-226 simulated annual mean concentrations of atmospheric arsenic 227 are compared with available measurement data in Figure 1 and Table 1. We find very good agreement between model results 228 229 and observations with a high correlation ($r^2 = 0.98$, slope of 230 regression line = (modeled results)/(observed results) = 1.0;mean normalized bias = 89%). However, significant biases are 231 232 identified for a few stations located in remote areas, such as Alaska and Hawaii, where the model strongly overestimates the 233 atmospheric arsenic concentrations (Table 1). This likely 234 235 reflects the uncertainties associated with the natural emissions 236 of arsenic as well as the deposition parameters used in the 237 model.

The global total wet and dry deposition of arsenic was calculated to be 25.4 and 5.3 Gg yr⁻¹, respectively. The global total atmospheric burden of arsenic is calculated to be 377 Mg, each leading to a global average atmospheric lifetime for arsenic of the calculated atmospheric arsenic lifetimes against deposition range from 4.1 to 5.4 days for different regions are around the world (Table 2), which are within the range (2.5–9 days) reported in the literature.^{17,24,25} The variations in arsenic 245 lifetimes across various regions mainly reflect the differences in 246 atmospheric deposition (in particular, wet deposition) rates. 247 Additional factors such as atmospheric transport can also affect 248 the regional lifetime of atmospheric arsenic. 249

Figure 1 shows the annual average arsenic concentrations in 250 ambient air driven by synoptic transport events. High arsenic 251 concentrations (10 ng m⁻³ or higher) are found over large areas 252 in eastern China and northern Chile, which are at least 1 order 253 of magnitude higher than those in the United States and 254 Europe. Figure 1 also illustrates the outflow of arsenic plumes 255 from Asia, which are transported over the North Pacific and 256 North America following the Westerlies. Similarly, the arsenic 257 plumes from North America are transported across the North 258 Atlantic toward Europe (Figure 1 and Figure 2c). In the 259 f2 Southern Hemisphere, the major arsenic source region is Chile. 260 The arsenic plumes at lower latitudes are transported toward 261 the tropical Pacific following the trade winds, and those at 262 higher latitudes are transported toward the Southern Atlantic 263 following the Westerlies. We further evaluate the model 264 performance in simulating the daily time series of measured 265 atmospheric arsenic concentrations at the Mount Bachelor 266 Observatory (MBO, 44.0° N, 121.7° W), located on the west 267 coast of the United States (Figure 3). The model reproduces 268 f3 the temporal variations in arsenic concentrations reasonably 269 well $(r^2 = 0.35$, slope of regression line = modeled results/ 270 observed results = 1.15, mean normalized bias = 36%). 271

To better examine the source-receptor relationships between 272 various regions in terms of arsenic concentration and 273



Figure 3. Daily arsenic concentrations in spring 2011. Measured daily average arsenic concentrations at the Mount Bachelor Observatory (MBO, 44.0° N, 121.7° W) compared with model results.

274 deposition, we carried out a suite of sensitivity simulations in 275 which anthropogenic arsenic emissions from a certain region 276 were turned off in the model. For example, we shut off 277 emissions from Asia in the sensitivity-model run and then 278 compared the calculated atmospheric arsenic deposition 279 ($D_{\rm no}$ Asia) with those from the base run ($D_{\rm base}$) to derive the 280 percentage contribution of Asian emissions to atmospheric 281 arsenic in the receptor region: Contribution_{Asia} = ($D_{\rm base} - 282 D_{\rm no}$ Asia)/ $D_{\rm base} \times 100\%$. Figure 2 shows the contribution to total 283 (wet and dry) deposition from each continental-scale source 284 region.

Anthropogenic arsenic emissions from Asia are found to Asia make the largest contributions to atmospheric arsenic arsenic deposition over the North Pacific Ocean and western North America (Figure 2a). Up to 70% of total atmospheric arsenic concentration and 80% of total arsenic deposition over the western part of North America are attributed to anthropogenic Asian emissions. Significant contributions to the Arctic region (up to 60% for atmospheric concentration and 70% for total arsenic deposition; see footnote in Table 3 for the definition of the Arctic) are calculated for Asian emissions (Figure 2a).

Table 3. Source-Receptor Relationships for AtmosphericArsenic Concentration (Deposition) between VariousRegions a

		source regions			
		Asia	Europe	North America	
receptor regions	Arctic	24.9	14.2	3.9	
		(39.2)	(13.8)	(4.3)	
	Asia	56.3	4.3	0.1	
		(58.0)	(4.9)	(0.2)	
	Europe	6.4	68.6	1.3	
		(10.0)	(60.1)	(2.0)	
	North America	25.7	2.0	55.1	
		(38.2)	(1.1)	(41.4)	
	Western United States	36.0	0.4	45.9	
		(48.3)	(0.4)	(30.0)	
	Eastern United States	8.9	0.2	85.0	
		(16.3)	(0.2)	(67.7)	

"Shown as the percentage contribution to total atmospheric arsenic concentration (deposition) in the receptor region attributable to emissions from the source region. The geographical regions are defined as Arctic (64–90°N, 180°W – 180°E); Asia (8–72°N, 57.5–147.5°E); Europe ($32-72^{\circ}N$, $7.5^{\circ}W$ – $62.5^{\circ}E$); North America (28–72°N, 127.5–62.5°W); Western United States (28–48°N, 127.5–97.5°W); and Eastern United States (28–48°N, 97.5–67.5°W).

Figure 2b shows the contribution from European anthro- 295 pogenic arsenic emissions. The European contributions mainly 296 extend northward to the Arctic and eastward over part of 297 Russia. The European emissions are also found to contribute to 298 arsenic deposition over the Mediterranean Sea by up to 60%. 299 Figure 2c shows the contribution from North American 300 anthropogenic arsenic emissions. The eastward transport of 301 the arsenic-laden plumes from North America leads to its large 302 contribution to the arsenic deposition over the North Atlantic 303 Ocean (up to 80% right off the eastern coast of the United 304 States). 305

The contribution of anthropogenic arsenic emissions from 306 South America is found to dominate over the Southern 307 Hemisphere except for Southern Africa and Australia (Figure 308 2d). Up to 90% of arsenic deposition over the Antarctic is 309 attributed to emissions from South America, which confirms 310 the hypothesis by Hong et al.³¹ 311

The source-receptor relationships for atmospheric arsenic 312 concentration and deposition between major regions in the 313 Northern Hemisphere are summarized in Table 3. On average, 314 about 39% of the total arsenic deposition over the Arctic region 315 is attributed to Asian anthropogenic emissions, reflecting the 316 strong arsenic emissions from Asia. The European anthro-70 pogenic emissions are calculated to contribute almost 14% of 318 the total arsenic deposition to the Arctic. The North American 319 contribution to arsenic in the Arctic (about 4%) is found to be 320 much less than those from Asia or Europe, reflecting both the 321 lower anthropogenic emission strengths and the lower latitudes 322 of the sources. The Asian anthropogenic emissions are found to 323 contribute to the total arsenic deposition in North America by 324 38%.

The intercontinental transport of arsenic, especially the 326 significant global impacts associated with arsenic emissions 327 from certain source regions as shown by our results, highlights 328 the benefits of international cooperation to reduce arsenic 329 pollution around the world. These source-receptor relation- 330 ships should be considered by researchers and policymakers in 331 the designing of mitigation strategies for arsenic pollution. 332

ASSOCIATED CONTENT 333

Supporting Information

The Supporting Information is available free of charge on the 335 ACS Publications website at DOI: 10.1021/acs.est.5b05549. 336

Figure S1, indicating the source regions used in Figure 2.	337
(PDF)	338

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Author Contributions

K.M.W. and S.W. designed the entire study and wrote the 347 manuscript. K.M.W. developed the arsenic model based on the 348 standard GEOS-Chem model and did all model experiments 349 and analysis of outputs. X.L. assisted the project with literature 350 review and database preparation at the early stage of the 351 project. D.A.J. and K.D.P. provided data of atmospheric arsenic 352 measurements from Mount Bachelor Observatory, Oregon. 353

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354 Notes

355 The authors declare no competing financial interest.

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