

1 **Long-range transport of Asian dust to the Arctic:**
2 **identification of transport pathways, evolution of**
3 **aerosol optical properties, and impact assessment on**
4 **surface albedo changes**

5

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17

18 **Abstract**

19 Airborne dust is one of the most important natural aerosols, it has various
20 environmental impacts on air quality, ocean fertilization, and the global climate change.

21 Asian dust, representing one of the major dust sources in the world, has been widely
22 studied due to its long-range transport capability. However, its transport to the Arctic
23 has been less investigated. In this study, two typical transport routes were identified
24 based on the recorded dust events in China during 2011-2015. Accordingly, two specific

25 Asian dust long-range transport events were selected and compared, i.e., one observed
26 at Barrow, Alaska (travelled mostly over lands within 6-7 days) and the other one
27 observed at Alert, Canada (travelled mostly over oceans within 7-8 days). The transport
28 routes of the two dust events had been cross-validated by using air mass trajectory
29 modeling, meteorology reanalysis data, ground-based aerosol columnar and profiling
30 observations, and spaceborne remote sensing. It was found that different transport
31 routes to the Arctic had divergent effects on the evolution of aerosol properties,
32 revealing different mixing extents between dust, anthropogenic particles, smoke, and
33 sea salts. Based on the SNow ICe Aerosol Radiative model, the albedo simulation
34 indicated that dust and elemental carbon together reduced the surface albedo by 0.35%
35 to 2.63% compared to the pure snow condition. This study implied that the dust long-
36 transport from China to the Arctic was ubiquitous and may be a potential contributor to
37 the Arctic regional climate.

38

39 **1. Introduction**

40 In the context of global warming, the Arctic temperature has been increasing at a rate
41 higher than the global average in recent decades, which is the so-called “Arctic
42 Amplification” effect (Serreze et al., 2009; Serreze and Francis, 2006). Although the
43 increase of greenhouse gases concentrations was an important driver of the Arctic and
44 global warming, the underlying cause of Arctic amplification remained uncertain as
45 Arctic warming and ice cap melting were also associated with changes in surface albedo,
46 aerosol radiative forcing, cloud cover, atmospheric water vapor content, seawater

47 temperature, and etc. (Screen and Simmonds, 2010; Gillett et al., 2008). The
48 magnitudes of direct radiative forcing of Arctic aerosols were closely related to the
49 origin of aerosol and its transport and deposition (Quinn et al., 2008). During the long
50 transport of aerosols to the Arctic, the solar radiation could be absorbed or scattered by
51 some components in the aerosols (black carbon, sulfate, etc.), which led to a decrease
52 of the amount of solar radiation reaching the surface. However, this cooling effect may
53 be diminished by the decrease of Arctic aerosol concentrations in recent decades
54 (Gagne et al., 2017; Breider et al., 2017). On the other hand, aerosol-radiation
55 interactions also contributed to Arctic warming in the following ways. Firstly,
56 absorbing aerosols at low latitudes could enhance the latitudinal gradient of temperature,
57 thus enhancing heat transport from other regions to the Arctic (Sand et al., 2013b; Sand
58 et al., 2013a); Secondly, absorbing aerosols absorbed solar radiation and warmed the
59 Arctic atmosphere while the surface was cooled, which enhanced atmospheric stability
60 and constrained the diffusion of air pollutants (Blanchet and List, 2010; Koch and Del
61 Genio, 2010; Brock et al., 2011); Thirdly, deposition of absorbing aerosols onto snow
62 and ice could reduce the surface albedo of the Arctic and thus led to local warming.
63 Besides, the formation of mixed-phase clouds in the Arctic were found related to low
64 concentrations and acid coating of dust particles based on both global and parcel model
65 simulations (Fan, 2013). Overall, direct and indirect radiative forcings caused by
66 aerosols had significant impacts on the Arctic climate as demonstrated by the model
67 simulation results (Shindell and Faluvegi, 2009; Flanner, 2013). In addition to the
68 impact of absorbing aerosols on the Arctic climate, the snow-albedo feedback and

69 cloud-albedo feedback in Central Siberia significantly regulated the variation of dust
70 emissions in spring over the Gobi Desert (Liu et al., 2018).

71 Due to the sparse human activities in the Arctic, most of the air pollutants
72 originated from the middle and lower latitudes, e.g., Eurasia, Siberia, North America,
73 and Southeast Asia. Eurasia was the main source area for the lower Arctic altitudes and
74 the higher Arctic altitudes was mainly influenced by South and Central Asia (Qi et al.,
75 2017; Fisher et al., 2011; Sharma et al., 2013; Stohl, 2006). Di Pierro et al. (2011) and
76 Huang et al. (2015a) both used ground-based lidar data and satellite remote sensing
77 images to demonstrate that aerosols from China can be transported to the Arctic within
78 4-6 days. Similarly, Di Biagio et al. (2018) found that aerosols in the high Arctic north
79 of Svalbard from October, 2014 to June, 2015 were mainly from Russia. Warneke et al.
80 (2010) found that forest fires in Russia strongly affected air pollutant concentrations in
81 the Arctic atmosphere and surface snowpack based on aircraft observations and
82 numerical simulation. Marelle et al. (2015) investigated a long-transport event from
83 Europe to the Arctic in April, 2008 and estimated a maximum shortwave radiation of
84 3.3 W m^{-2} at the top of the atmosphere, yielding a significant local warming effect.
85 Sobhani et al. (2018) applied the WRF-STEM (Weather Research and Forecasting -
86 sulfur transport and deposition model) model to study the long-range transport of
87 aerosols to the Arctic and calculated the contribution of various anthropogenic and
88 biomass burning emissions. Europe and China were found as the main source regions
89 of Arctic black carbon, contributing about 46% and 25% in the middle and upper
90 troposphere, respectively.

91 Different from black carbon, dust had a much larger geographic influencing
92 coverage due to that dust particles were usually accompanied with strong winds.
93 Although a number of studies focused on local or regional dust in the Arctic (Ferrero et
94 al., 2019; Ranjbar et al., 2021; Dagsson-Waldhauserova et al., 2019), the long-range
95 transport of dust to the Arctic has been frequently observed. Asian dust can be
96 transported across the Pacific Ocean to reach North America and even the Arctic (Wang
97 et al., 2018b; Guo et al., 2017). Zwaafink et al. (2016) combined a Lagrangian particle
98 dispersion model FLEXPART (FLEXible PARTicle dispersion model) and surface
99 particle concentration observations to simulate the global dust emissions. It was found
100 that the instantaneous radiative forcing in the Arctic caused by dust was also dominated
101 by Asia and Africa. In addition, the deposition of dust on snow was responsible for
102 almost all instantaneous radiative forcing at the bottom of the atmosphere (Kylling et
103 al., 2018).

104 Although both observational and modeling studies showed a persistent source of
105 the Arctic dust from Asia (Fan, 2013; Ginoux et al., 2012), the transport pathways were
106 seldom explored. Huang et al. (2015b) revealed an unreported transport path of Asian
107 dust to the Arctic and estimated its transport duration. In this study, the frequency of
108 dust from East Asia that had the capability to be transported to the Arctic was estimated.
109 Two typical dust transport pathways to the Arctic were investigated based on a synergy
110 of remote sensing data and Arctic monitoring data. The evolutions of aerosol optical
111 properties during the long-range transport were analyzed. Finally, the potential impact
112 of absorbing aerosol on the decrease of surface albedo was quantified.

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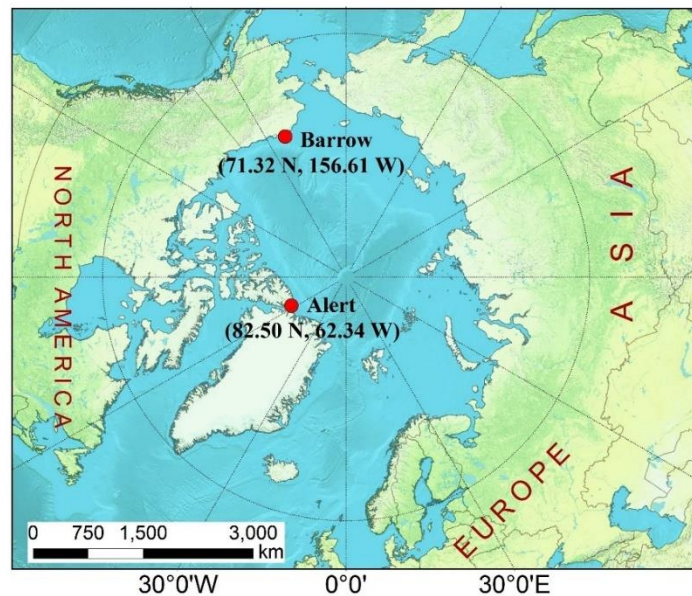
114 **2. Data and Methodology**

115 **2.1. Receptor sites in the Arctic**

116 Two Arctic monitoring sites were chosen as the investigated receptors (Figure 1). They
117 are almost the most northern sites in the Arctic Circle and located in the remote
118 regions where human activities are negligible. Thus, the long-range transported
119 particles can be easily discerned. One site is Barrow (71.32°N, 156.61°W) located in
120 the northernmost part of the Alaska region of USA. It is surrounded by the Arctic
121 Ocean on three sides and has a large ice cap. Barrow is characterized of a cold and dry
122 climate and covered by snow and ice all year round with an average annual
123 temperature of about -11°C (Dong et al., 2010). In winter, the frequency of northerly
124 air currents was high. The average surface temperature reached as low as -25°C in
125 January and February and most of the snowfall occurred at the end of February. Since
126 April, the invasion of warm and moist air masses from the North Pacific Ocean began
127 to prompt the snowpack in Alaska to melt (Stone et al., 2002). This site is managed by
128 Earth System Research Laboratory of National Oceanic and Atmospheric
129 Administration.

130 The other site is Alert (82.50°N, 62.34°W) in the Nunavut region of Canada, the
131 northernmost permanent human settlement in the world. This site is located about 500
132 km north of Greenland, near the North Pole and far from any industrial emissions. It
133 is very cold due to the long-lasting polar night with four months in a year. The
134 average temperature was below -30°C from December to March and the average

135 annual temperature was -17.9°C (Weijers et al., 2017). This site is managed by
136 Environment Canada.



137
138 Figure 1. Two receptor sites (Barrow and Alert) in the Arctic. The map is created by
139 ArcGIS 10.2.

141 2.2. Aerosol measurements

142 Particles at Barrow and Alert were measured by the three-wavelength (450, 550, and
143 700nm) Integrating Nephelometer (Model 3563). The nephelometer measured the
144 angular integral of light scattering and Beer-Lambert Law was applied to calculate the
145 light extinction. In this study, the measurement results at 550nm were used. Aerosol
146 absorption was measured by a filter absorption photometer. The aerosol absorption
147 coefficients were obtained at three wavelengths of 467, 530, and 660nm. The
148 measurement results at 530nm were used. Aerosol Robotic Network (AERONET)
149 established a global observational network of columnar aerosol optical properties
150 based on Cimel-31 Sun Photometers (Holben et al., 1998). Key parameters of aerosol

151 optical properties were retrieved at 440 nm, 670 nm, 870 nm, and 1020 nm,
152 respectively. The quality-assured level 2.0 data were used. The AD-Net (Asian dust
153 and aerosol lidar observation network) operated by National Institute for
154 Environmental Studies (NIES) established a lidar network of dual-wavelength
155 depolarization lidars (Model: L2S-SM II), aiming to obtain the four dimensional
156 distributions (sites/time/height/aerosol properties) of aerosol particles in East Asia
157 (Shimizu et al., 2017). The lidar could measure backscattering coefficients and the
158 depolarization ratio at the wavelength of 532 nm. The lidar continuously operated
159 with 15 min intervals and 30m vertical resolution.

160 In addition to the ground-based sites, remote sensing from space was used to
161 provide widespread spatial information of aerosols. The MODIS (Moderate-resolution
162 Imaging Spectroradiometer) Level-3 aerosol products ($1^\circ \times 1^\circ$) were obtained from
163 NASA's Giovanni (<https://giovanni.gsfc.nasa.gov/giovanni/>). Aerosol optical depth
164 (550nm) data was based on the Dark Target (Levy et al., 2007) and Deep Blue (Hsu et
165 al., 2013) algorithm and Angström exponent (0.412-0.47nm) data was based on the
166 Deep Blue algorithm. The CALIOP (Cloud-Aerosol Lidar with Orthogonal
167 Polarization) Lidar onboard the CALIPSO (Cloud-Aerosol Lidar and Infrared
168 Pathfinder Satellite Observation) satellite provided global data on aerosol and cloud
169 layers with a horizontal and vertical resolution of around 5km and 60m. Track scale
170 vertical aerosol profiles were derived. In addition, major aerosol subtypes can be
171 identified, including dust, smoke, clean continental, polluted continental, clean
172 marine, and polluted dust (Omar et al., 2009).

173

174 **2.3. Air mass trajectories modeling**

175 To track the possible source regions of airborne particles, HYSPLIT4 (HYbrid Single-
176 Particle Lagrangian Integrated Trajectory) was run online at the NOAA (National
177 Oceanic and Atmospheric Administration) ARL (Air Resource
178 Laboratory) READY (Real-time Environmental Applications and Display sYstem)
179 Website (<http://www.arl.noaa.gov/ready/hysplit4.html>). The HYSPLIT model is a
180 complete system for calculating simple air mass backward trajectories, in addition to
181 dispersion and complex deposition simulations (Draxier and Hess, 1998). The
182 meteorological input data used in the model were obtained from the National Center
183 for Environmental Prediction's (NCEP) global data assimilation system (GDAS) with
184 a horizontal resolution of $0.5^\circ \times 0.5^\circ$.

185

186 **2.4. Snow albedo modeling**

187 The Snow–Ice–Aerosol–Radiative (SNICAR) model was used to simulate the impact
188 of impurity (e.g. dust, black carbon, and volcanic ash) on the surface albedo of snow
189 and ice (Flanner et al., 2007). The application of the SNICAR model required inputs
190 such as snow grain effective radius, snowpack thickness/density, surface albedo, the
191 concentrations of impurities in snow. The effective grain sizes of snow ranged from
192 $100 \mu\text{m}$ for fresh clean snow to $1500 \mu\text{m}$ for aged snow and granular ice. Table 1 lists
193 the parameters considered for SNICAR in this study. The parameters of snow were
194 derived from field measurements at Barrow in April, 2015 (Dou et al., 2017) and near

195 Alert in February and April, 2000 (Domine et al., 2002). The estimation of impurities
 196 concentrations in snow will be presented in Section 3.7.1.

197

198 **Table 1. The input parameters in the SNICAR model**

Parameters	Barrow	Alert
Incident radiation		Direct
Surface spectral distribution		Summit Greenland, clear-sky
Snow grain effective radius (μm)	180(Dou et al., 2017)	500 (0.1-1.5mm)(Domine et al., 2002)
Snowpack thickness (m)	0.35(Dou et al., 2017)	0.4(Domine et al., 2002)
Snowpack density (kg/m^3)	350(Dou et al., 2017)	300(Domine et al., 2002)
Albedo of underlying ground	0.73 (300-700nm)	0.33 (700-5000nm) (Dou et al., 2017)

199

200 **3. Results and Discussion**

201 **3.1. Overview of dust events in China from 2011-2015**

202 Table 2 summarizes the occurrence frequency and duration of dust events in the dust
 203 source regions of China during 2011-2015 recorded by China's Sand-dust Weather
 204 Almanac (Cma, 2013, 2014, 2015, 2016, 2017). A total of 50 dust events occurred,
 205 which were categorized into three types, i.e., floating dust, dust storm, and severe dust
 206 storm. Among them, the occurrence frequency of floating dust reached 36, accounting
 207 for 72% of the total dust events. On average, floating dust occurred about 7 times a year
 208 with a total duration of 61 days. The occurrence frequencies of dust storm and severe
 209 dust storm events were both 7 times with the total duration of 18 days. Compared with
 210 2000-2010, the frequency of dust storm and severe dust storm events during the last
 211 five years decreased significantly, while that of floating dust increased.

212

213 **Table 2. Summary of dust weather conditions in China during 2011 – 2015**

214

Year	floating dust		dust storm		severe dust storm		Total
	frequency	days	frequency	days	frequency	days	frequency
2011	5	10	1	3	2	6	8
2012	5	10	3	8	2	4	10
2013	9	15	1	2			10
2014	4	8	1	2	2	6	7
2015	13	18	1	3	1	2	15
Total	36	61	7	18	7	18	50

215

216 On a seasonal basis (Table 3), the springtime (March-May) was the peak period of
217 dust outbreak in China. 41 dust events occurred, accounting for 82% of the total dust
218 events. Of which, relatively high frequencies of dust storm and severe dust storm events
219 were observed, accounting for 37.5% of the total events in April. This high frequency
220 of dust occurrence in the spring of China was mainly related to the climatic
221 characteristics, geographic conditions, and geological structure of northern China.
222 Strong winds caused by the Inner Mongolia cyclone and cold fronts in spring resulted
223 in the frequent outbreak of dusty weather in northern China. In terms of the
224 geographical dust source areas in China, the source regions of dust included the South
225 Xinjiang basin, central and western Inner Mongolia, central and western Gansu, and
226 northern Shaanxi.

227

228 **Table 3. Monthly summary of dust days in China during 2011 – 2015**

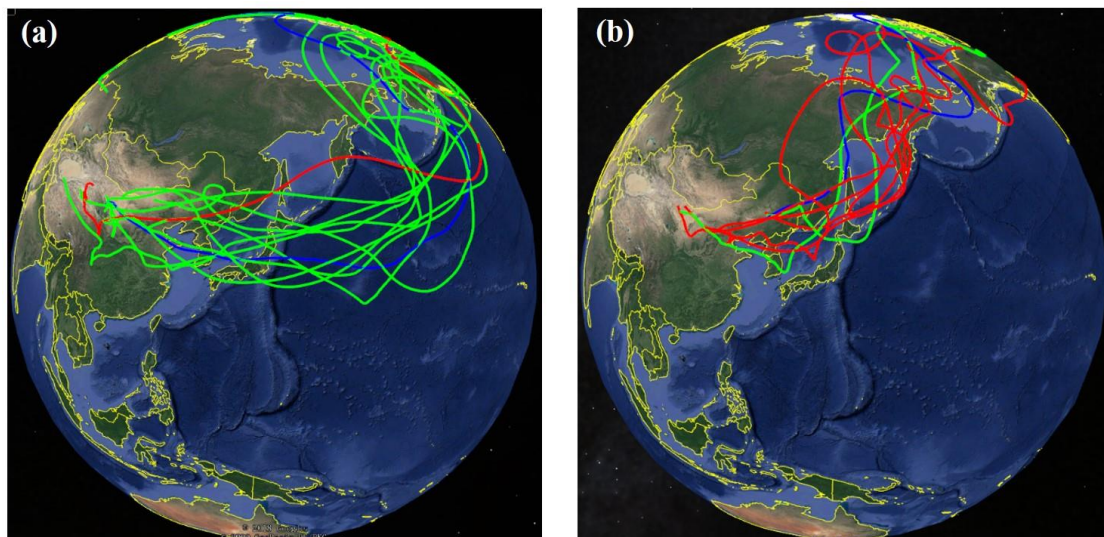
Month	floating dust	dust storm	severe dust storm	total
February	3			3
March	12	1	2	15
April	10	3	3	16
May	7	1	2	10
June	1			1
August	1			1
November	2	2		4

229

230 3.2 Transport pathways of Asian dust to the Arctic

231 In order to investigate the frequency and transport pathways of dust from China to the
 232 Arctic, the HYSPLIT trajectory model was applied in this study. Based on the outbreak
 233 time and source areas of dust recorded by China's Sand-dust Weather Almanac, 10-15
 234 days forward trajectories starting at typical altitudes of lifted dust (500m, 1000m, and
 235 1500m) were computed for each dust event in China during 2011-2015. If the
 236 trajectories entered the Arctic Circle (latitudes higher than 66°34'N), the specific dust
 237 event was recorded as one dust long-range transport event from China to the Arctic.

238



239

240 **Figure 2. Two common transport pathways of dust originating from China**
241 **to the Arctic, i.e., (a) the northern China - Korean Peninsula/Japan - North**
242 **Pacific Ocean – Arctic pathway and (b) the northern China - Korean**
243 **Peninsula/Japan - Kamchatka Peninsula - East Siberia – Arctic pathway. Red,**
244 **blue, and green curves represent forward trajectories starting at altitudes of**
245 **500m, 1000m, and 1500, respectively. The map is © Google Earth 2019.**

246

247 Based on this criterion, 38 out of the 50 dust events that originated from China
248 during 2011-2015 had the potential migrating to the Arctic Circle. Among these
249 identified dust events, most occurred in spring with 32 events and the transport duration
250 varied between 4 and 13 days. Two main types of dust transport from China to the
251 Arctic were distinguished in Figure 2. As for Type I (Figure 2a), dust mainly originated
252 from the central parts of Inner Mongolia and central Gansu. It passed through northern
253 China, Korean Peninsula, Japan and the North Pacific Ocean, and finally reached
254 Siberia and the northern part of Alaska. This transport type was characterized of wide
255 geographic coverage, relatively long transport duration (about 7-10 days), and mainly
256 over the open ocean. This was due to the high lifting altitude (mostly over 1500m) over
257 the dust source regions, so particles can be transported to even further areas.

258 As for Type II (Figure 2b), dust mainly originated from northeast China and western
259 Inner Mongolia, then passing over the Korean Peninsula, northern Japan, Kamchatka
260 Peninsula, and finally reaching East Siberia and its northern areas. Compared to Type
261 I, the Type II transport pathways travelled more over land and had relatively shorter
262 duration of about 4-8 days. This was due to the presence of a low-pressure system over
263 northern Japan in spring, which induced the air masses deflecting northward. In Section
264 3.4, more details about the low-pressure system will be presented based on case analysis.

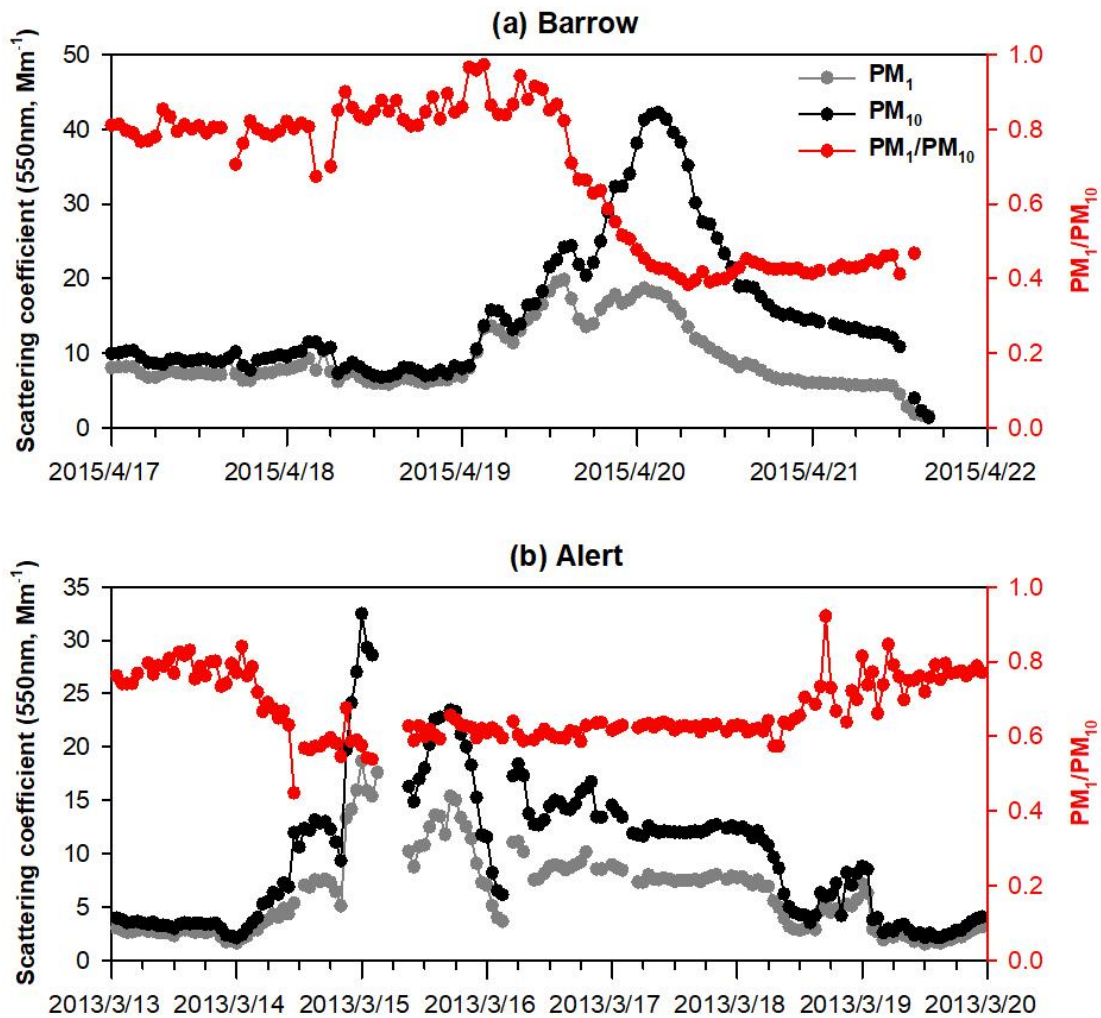
265 More explicit characterizations of the transport pathways from the dust source regions
266 to the Arctic will be discussed later in Section 3.5.

267 **3.3 Two cases of long-range transported dust to the Arctic**

268 Figure 3a shows the time series of scattering coefficients (σ_{sp}) of PM_1 and PM_{10} at 550
269 nm at Barrow during April 17-21, 2015. The scattering coefficients stayed at low levels
270 from the early morning of April 17 to the evening of April 18, which were similar to
271 the annual average values at Barrow in 2015 ($4.8 Mm^{-1}$ and $8.1 Mm^{-1}$ for PM_1 and PM_{10} ,
272 respectively). Since the early morning of April 19, both $\sigma_{sp}(PM_1)$ and $\sigma_{sp}(PM_{10})$
273 climbed simultaneously, indicating the invasion of air pollutants. At 15:00 on April 19,
274 $\sigma_{sp}(PM_1)$ reached relatively high value of $19.8 Mm^{-1}$ and was still close to that of PM_{10}
275 with the $\sigma_{sp}(PM_1)/\sigma_{sp}(PM_{10})$ ratio of 0.82, indicating fine particles dominated during
276 this period. Afterwards, $\sigma_{sp}(PM_{10})$ continued to increase until it reached the maximum
277 value of $42.2 Mm^{-1}$ at 4:00 on April 20, more than 5 times of its annual average. The
278 mean $\sigma_{sp}(PM_1)/\sigma_{sp}(PM_{10})$ ratio during 14:00, April 19 - 12:00, April 21 decreased to
279 0.47 ± 0.10 , obviously indicating the enrichment of coarse particles. This episode is
280 defined as CASE I.

281 Figure 3b shows the time series of scattering coefficients of PM_1 and PM_{10} at 550
282 nm at Alert from March 13 to 19, 2013. The annual average $\sigma_{sp}(PM_1)$ and $\sigma_{sp}(PM_{10})$
283 at Alert was $4.2 Mm^{-1}$ and $6.0 Mm^{-1}$, respectively, slightly lower than those observed at
284 Barrow. From 0:00 on March 14, $\sigma_{sp}(PM_1)$ and $\sigma_{sp}(PM_{10})$ started to increase and
285 reached the maximum values of $18.6 Mm^{-1}$ and $32.3 Mm^{-1}$ at 0:00 on March 15, which
286 were more than 4 and 5 times of their annual average, respectively. The mean $\sigma_{sp}(PM_1)/$

287 $\sigma_{sp}(PM_{10})$ ratio during 11:00 on March 14 to 7:00 on March 18 was 0.61 ± 0.03 , also
 288 indicating the enrichment of coarse particles. This episode is defined as CASE II.



289
 290 **Figure 3. (a) Time series of hourly scattering coefficients of PM_1 and PM_{10} at 550**
 291 **nm and the ratio of PM_1/PM_{10} at Barrow during April 17-21, 2015. (b) The same**
 292 **but for Alert during March 13 to 19, 2013.**

293

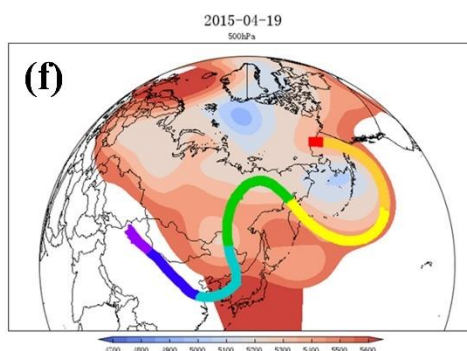
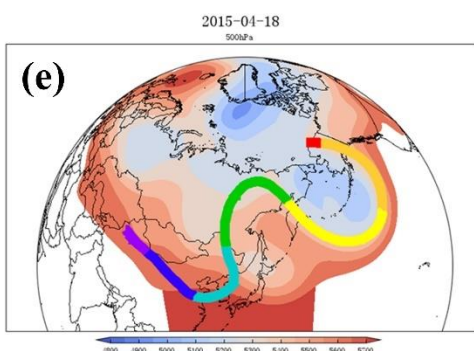
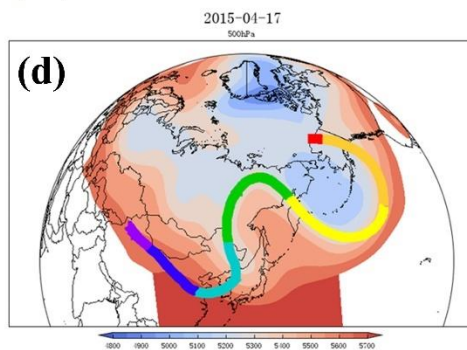
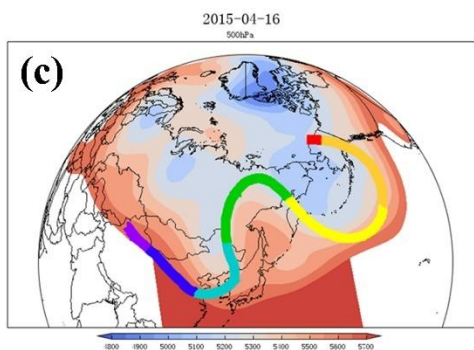
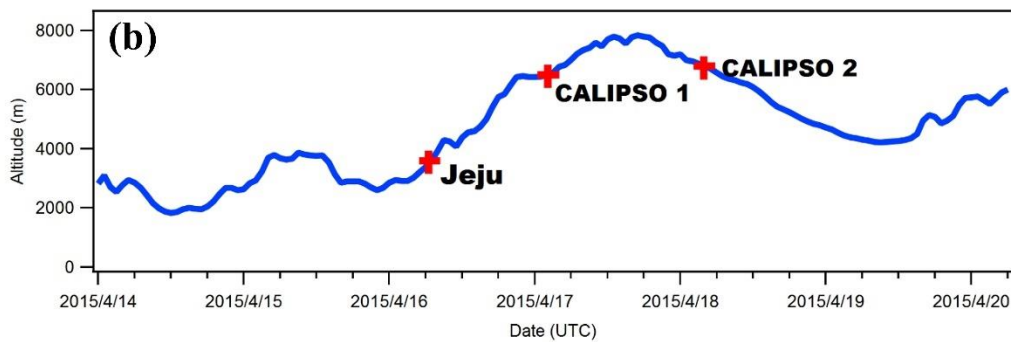
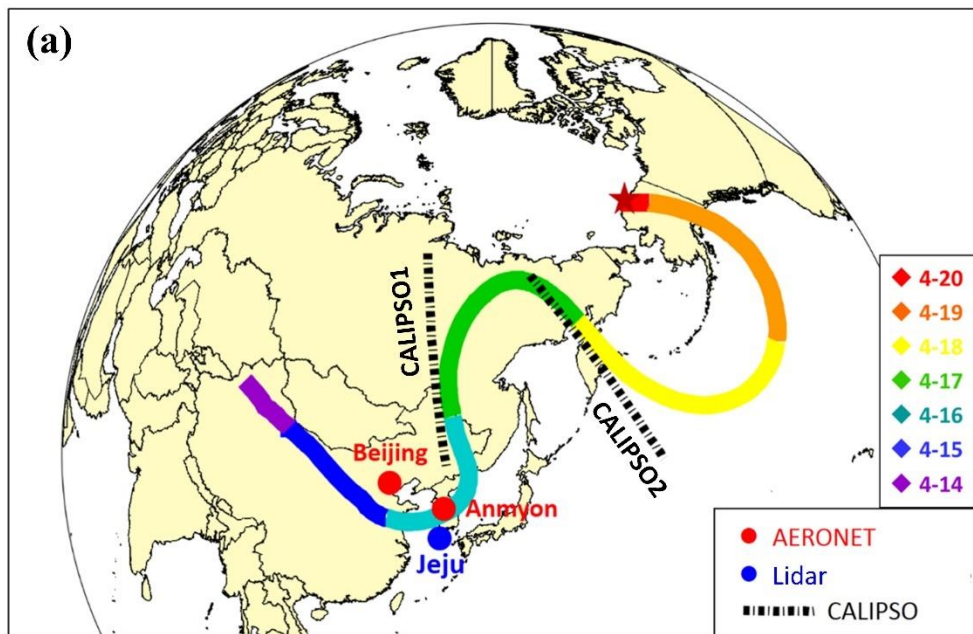
294 In comparison, the pollution during CASE I lasted for a relatively short period of
 295 about 2.5 days while had higher peak values of $\sigma_{sp}(PM_{10})$ than CASE II, indicating that
 296 CASE I was subject to stronger long-range transport and more significant variations of
 297 synoptic conditions. The pollution during CASE II lasted for nearly four days,
 298 suggesting relatively weak cleanup processes of the air pollutants. As for the $\sigma_{sp}(PM_1)/$

299 $\sigma_{sp}(PM_{10})$ ratio, it was much lower in CASE I than that in CASE II. This indicated the
300 intrusion of coarse particles was more intense during CASE I, which could be related
301 to various factors such as the emission source regions, transport pathways, and
302 evolution of particles. In the next section, the transport pathways of the two cases above
303 were validated by using backward trajectory analysis and remote sensing from both
304 space and ground-based observations.

305

306 **3.4 Identification of dust long-range transport pathways**

307 To determine the sources and transport pathways of the two Arctic pollution events, the
308 HYSPLIT model was applied to compute the air masses transport trajectories. Figure
309 4a shows the 7-days backward trajectory simulated at an altitude of 6 km above Barrow
310 starting from 04:00 on April 20, 2015 (CASE I). The different segments of the trajectory
311 were colored to represent the continuous dates. On 14-15 April, air masses originated
312 from the Taklamakan and Gobi deserts in China, then passed over East Asia, Siberia of
313 Russia, and the Pacific Ocean, and finally reached Barrow about 6 days later. The
314 geopotential height fields based on the NCEP reanalysis data are plotted in Figure 4c-
315 4f to verify the dust transport path. On April 16, a low-pressure trough over Northeast
316 China caused the eastward air masses to turn northward. On April 17, the air masses
317 followed the high-pressure ridge over eastern Russia and entered the North Pacific.
318 Then its direction was again deflected by a low-pressure system near the Bering Strait
319 on April 18 and 19, finally reaching Barrow on April 20.



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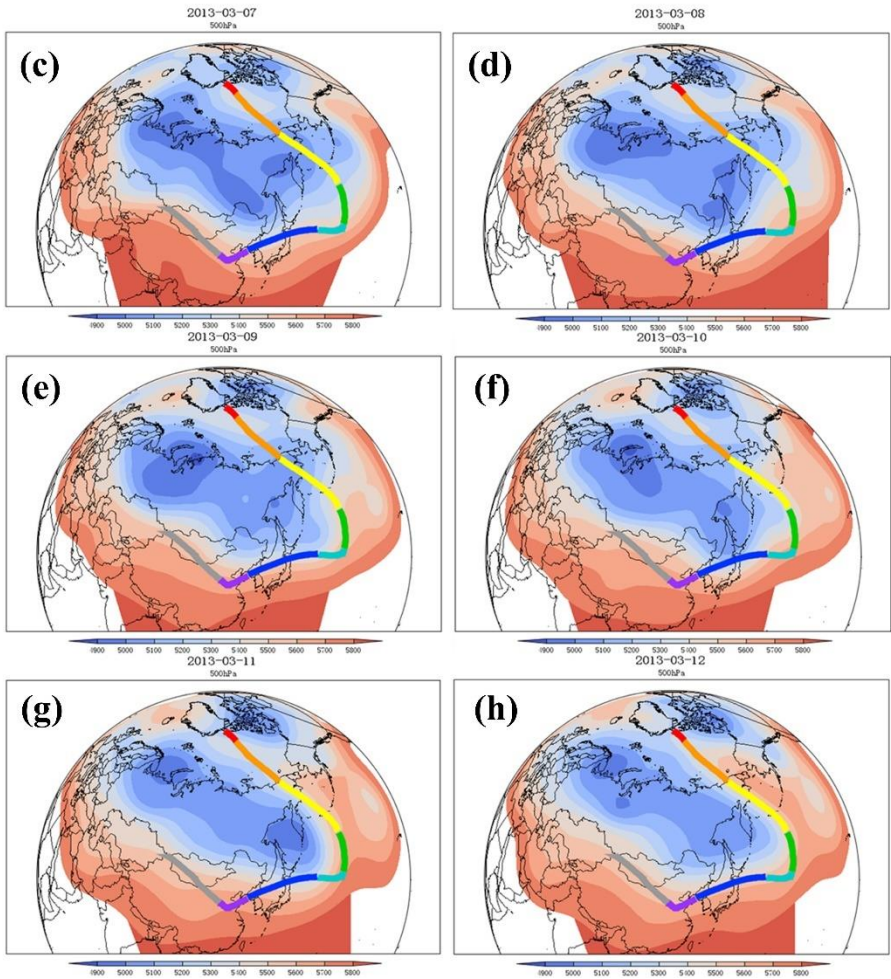
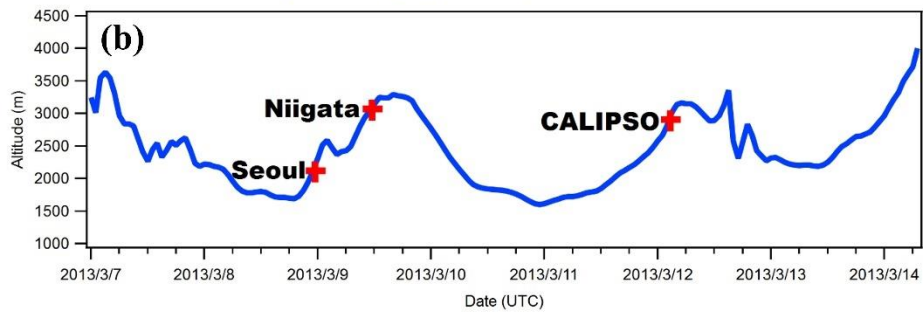
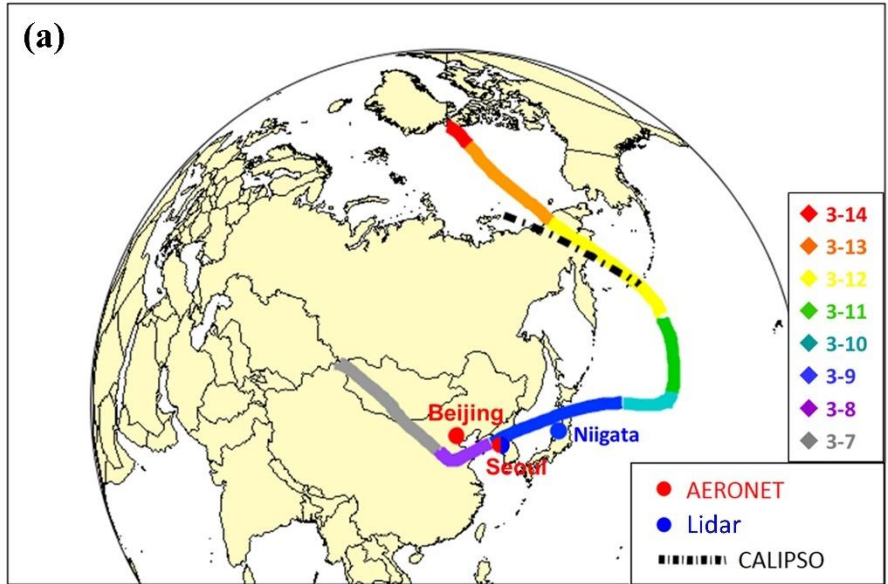
Figure 4. (a) The 7-days backward trajectory simulated at an altitude of 6 km

323 **above Barrow starting from 04:00 on April 20, 2015. The locations of AERONET,**
324 **Lidar sites, and CALIPSO tracks nearby the trajectory are plotted. (b) The height**
325 **of the trajectory along the transport path. The height and time of dust layers**
326 **observed by lidars and CALIPSO in Figure 4a are indicated by the red plus**
327 **symbols. (c-f) Daily geopotential height fields (500 hPa) from the NCEP reanalysis**
328 **data**

329

330 Figure 5a shows a typical backward trajectory simulated at an altitude of 4 km
331 above Alert on March 14, 2013 (CASE II). On March 7, air masses travelled over the
332 Gobi Desert on the border between Mongolia and the north of China, then passed over
333 Korea and Japan, and directly entered the Pacific Ocean. Afterwards, it kept moving
334 northward across the Arctic Ocean and reached Alert on March 14. Based on the
335 geopotential heights (Figure 5c-5h), a low-pressure system was observed over the
336 eastern coast of Russia and kept moving to the southeast from March 7 to 11. On March
337 11, the low-pressure system moved over the Sea of Okhotsk in Russia and turned to be
338 stronger, causing the air masses deflect and follow the geopotential height contours all
339 the way north to Alert.

340



342 **Figure 5. Same as Figure 4 but for CASE II.**

343

344 **3.5 Verification of dust transport pathways based on satellite and ground-based**
345 **observations**

346 Although the air mass transport pathways of the two Arctic coarse particle pollution
347 cases were visualized based on trajectory modeling, whether dust particles were indeed
348 present in the air masses has not been confirmed. In this section, the aerosol optical
349 properties along the transport pathway were explored using both ground-based
350 observations (AERONET and AD-Net) and satellite inversion data (CALIPSO). In
351 Figure 4a and 5a, the red dots denoted the AERONET sites, which observed columnar
352 aerosol optical properties. The blue dots denoted the AD-Net sites, which observed
353 vertical profiles of aerosol extinctions and particle morphology information. The black
354 dashed lines represented the orbits of CALIPSO profiles, which were used to
355 supplement the aerosol information in the blank areas without available ground-based
356 observations. The validation results of the two cases are described separately as below.

357

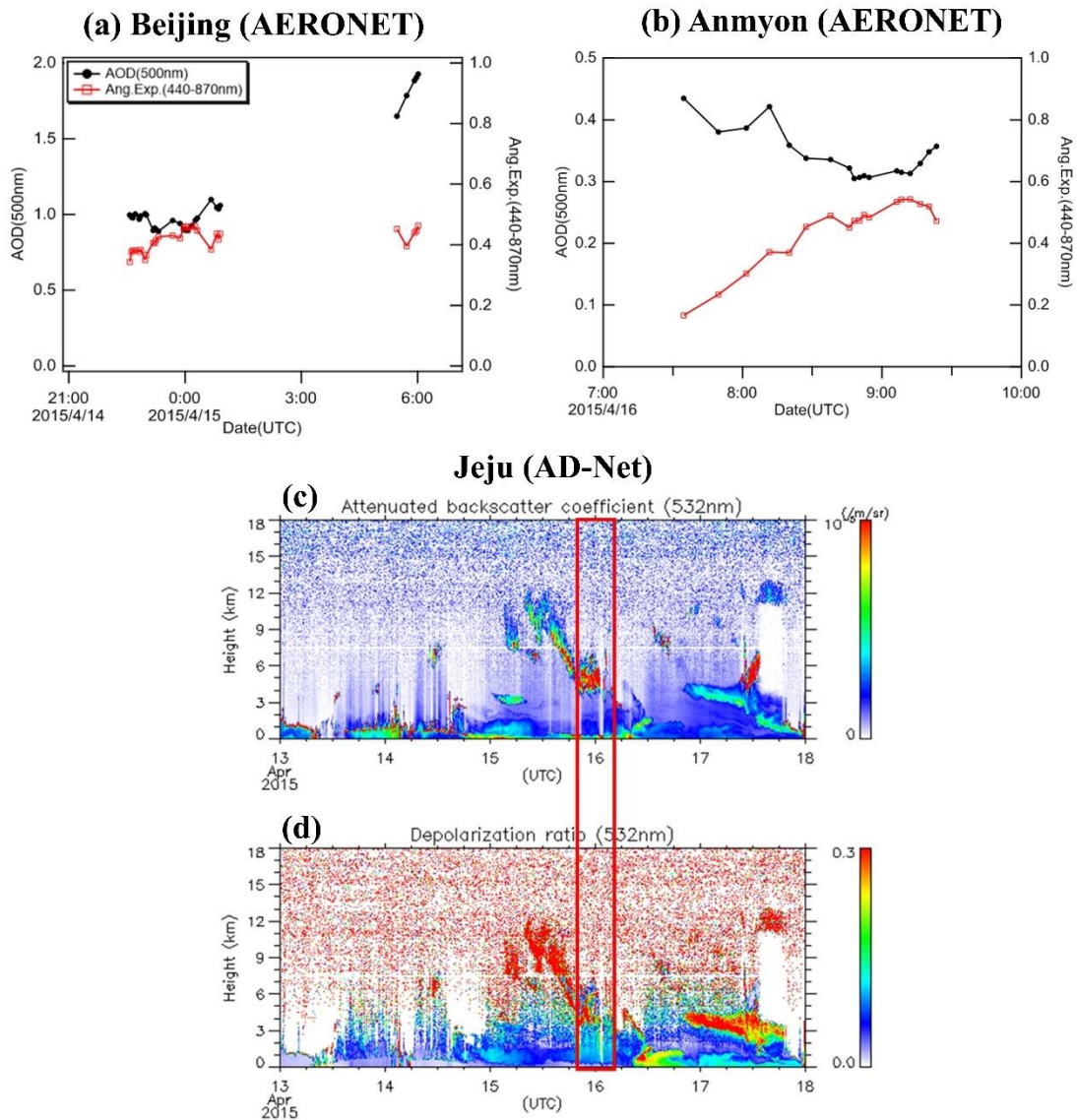
358 **(i) CASE I**

359 Figures 6 shows the aerosol optical properties of two AERONET sites, i.e., Beijing
360 (China) and Anmyon (Korea), which were located nearby the air mass transport
361 pathway in CASE I (Figure 4a). AE (Angström exponent) is a parameter of
362 characterizing the particle size. The smaller AE represents the larger particle size, and
363 vice versa. In general, $AE < 1$ suggested the dominance of coarse particles, which were

364 usually associated with dust or sea salts. While $AE > 1$ suggested the dominance of fine
365 particles, which derived from anthropogenic emissions and biomass burning.

366 As shown in Figure 6a, AOD over Beijing doubled from about 1.0 at around 0:00
367 on April 15 to nearly 2.0 at around 6:00, while AE (440-870nm) remained below 0.5.
368 When the air masses passed over Anmyon, Korea, AOD was about 0.4 at 8:00 on April
369 16 (Figure 6b). AOD at Anmyon was much lower compared to Beijing, which should
370 be due to the removal process during the transport and lower local emissions at Anmyon.
371 Similarly, AE at this site was low below 0.4 and it slightly increased to above 0.5 after
372 8:00. As a whole, the observation of high AOD and low AE at both sites indicated that
373 the air masses contained abundant coarse dust aerosols.

374 Figure 6c shows the vertical profiles of aerosol optical properties over Jeju Island,
375 Korea. The depolarization ratio represents the degree of particle approximation to a
376 sphere in the range of 0 - 1. The depolarization ratio of a spherical object is equal to 0,
377 and vice versa (Mishra et al., 2010). Since dust aerosols were irregularly shaped
378 particles, the depolarization ratio of dust aerosols usually ranged between 0.2 and 0.3.
379 As for the intense dust storm events, the depolarization ratio of particles could reach
380 over 0.4 (Liu et al., 2003). High extinction coefficients and depolarization ratios
381 between 0.1 and 0.3 at around 4 km over Jeju in the early morning of April 16, 2015
382 were observed. By comparing the simulated height of the air mass backward trajectory
383 and the observed plume height over Jeju, good agreement was found (Figure 4b),
384 corroborating the same origin of the Arctic pollution and the Asian downstream dust
385 plumes.



387

388 **Figure 6. Aerosol optical properties observed at ground-based sites during CASE**389 **I. (a) AOD (500nm) and Angström exponent (440-870nm) at the Beijing**390 **AERONET site. (b) AOD and Angström exponent at the Anmyon AERONET site.**391 **Vertical profiles of (c) backscattering coefficient and (d) depolarization ratio at the**392 **Jeju AD-Net site. The red rectangle denotes the time when dust passed over the**393 **site. Clouds are screened and represented by the blank pixels.**

394

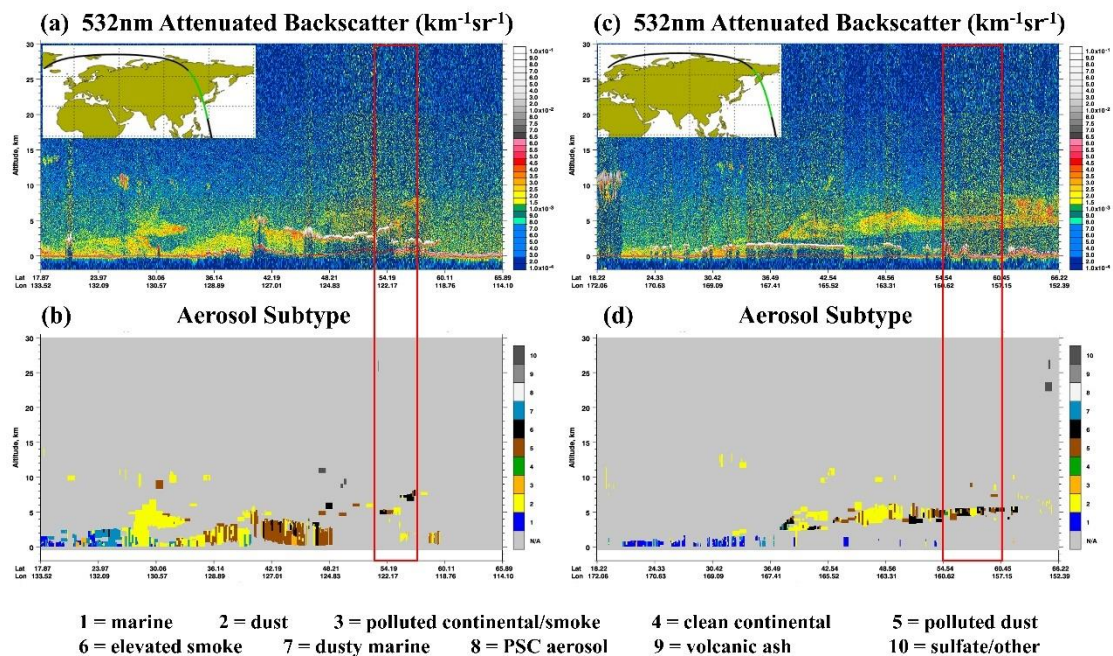
395 After April 16, the dust plume moved towards Russia and the North Pacific. Due

396 to the lacking of ground-based observations in this region, CALIPSO inversion

397 products were used to fill in these blank regions. At about 5:00 UTC on April 17, 2015,

398 over the northeastern part of Russia (54.19°N, 122.17°E), CALIPSO observed an
 399 aerosol layer, about 5 km above the ground. This height was generally consistent with
 400 that of the simulated backward trajectory (Figure 4b) and the plume was identified as a
 401 mixture of dust, polluted dust, and other types of aerosols (Figure 7). At 2:00 UTC on
 402 April 18, CALIPSO observed a similar mixed layer of dust, polluting dust, and lifted
 403 smoke at 4-6 km over the Kamchatka Peninsula in Russia (Figure 7). Compared to the
 404 previous day, the lifted smoke was more abundant, suggesting that smoke aerosols from
 405 forest fires may have been mixed with the air masses passed over Russia.

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409 **Figure 7. CALIPSO profiles of aerosol backscattering coefficients and identified**
 410 **aerosol types on April 17 (a-b) and 18 (c-d), 2015. The red rectangles denote the**
 411 **regions as indicated by the CALIPSO tracks in Figure 4a.**

412

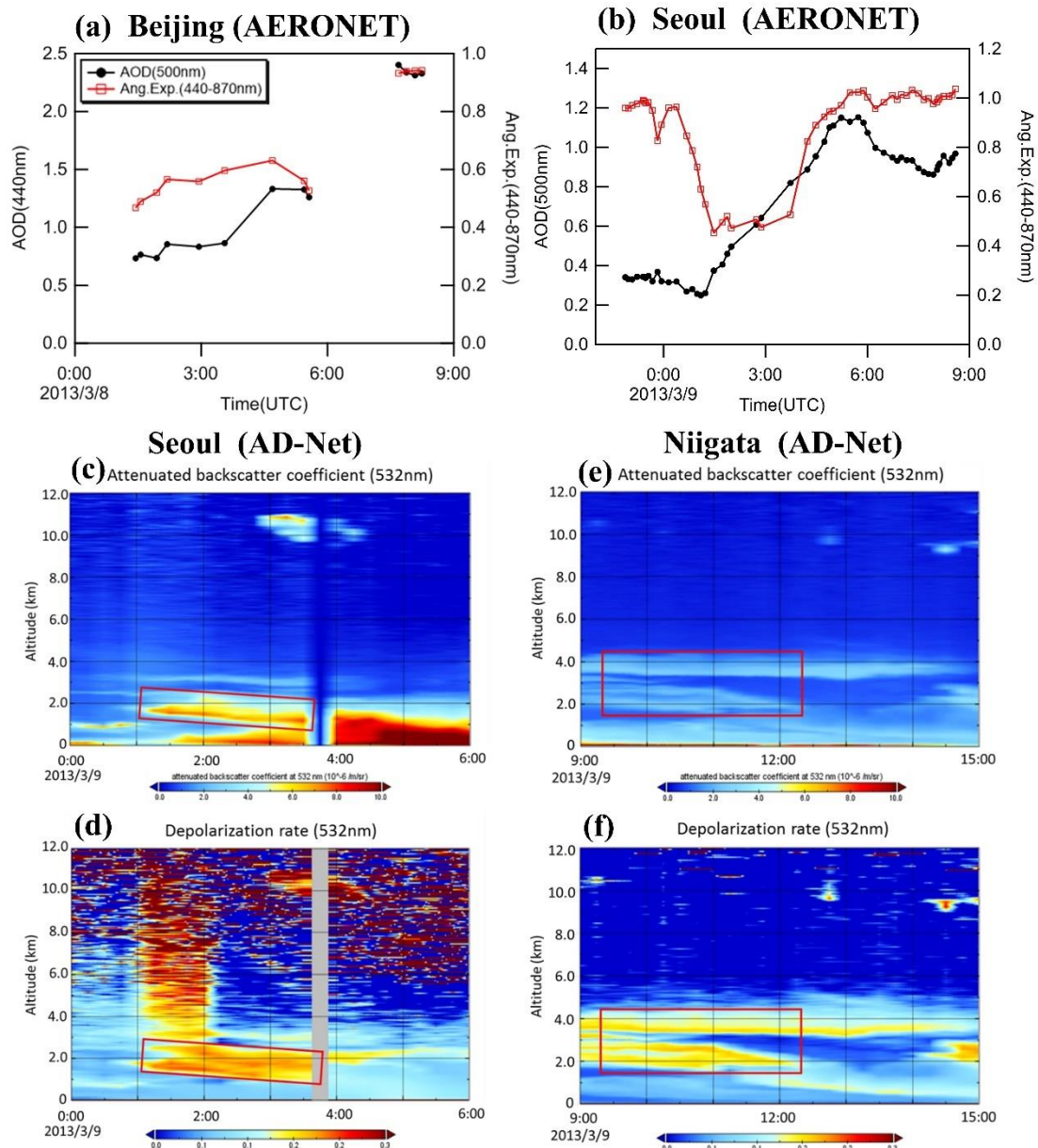
413 **(ii) CASE II**

414 Figure 8 shows the available ground-based observations close to the transport pathway

415 during CASE II. At the Beijing AERONET site, at 3:00 UTC on March 8, 2013, AOD
416 was 0.73 while AE was 0.47. This was indicative of the dominance of dust particles.
417 Afterwards at 8:00, AOD increased more than twice and approached 2.5, while AE also
418 increased to more than 0.9, indicating that the dust in CASE II was more mixed with
419 fine particles than CASE I.

420 From 0:00 to 6:00 UTC on March 9, 2013, observed AE at the Seoul AERONET
421 site decreased to a low level of about 0.6 and increased to around 1.0 for several hours.
422 This process was accompanied by a continuous increase of AOD, reaching a maximum
423 of 1.15. In addition, the vertical profiles of the aerosol optical properties in the early
424 morning of March 9 indicated a 1-2 km thick dust layer at altitudes of 1-3 km height
425 over Seoul (Figure 8c), which was in good agreement with the height of the backward
426 trajectory (Figure 5b). Figure 8d shows the lidar vertical observations in Niigata, Japan.
427 A 1-2km thick dust layer at altitudes of 2 – 4km was also observed at 9:00-12:00 UTC
428 on March 9. The heights of the dust layers observed from lidars were also in good
429 agreement with the time and height of the simulated backward trajectory as shown in
430 Figure 5b.

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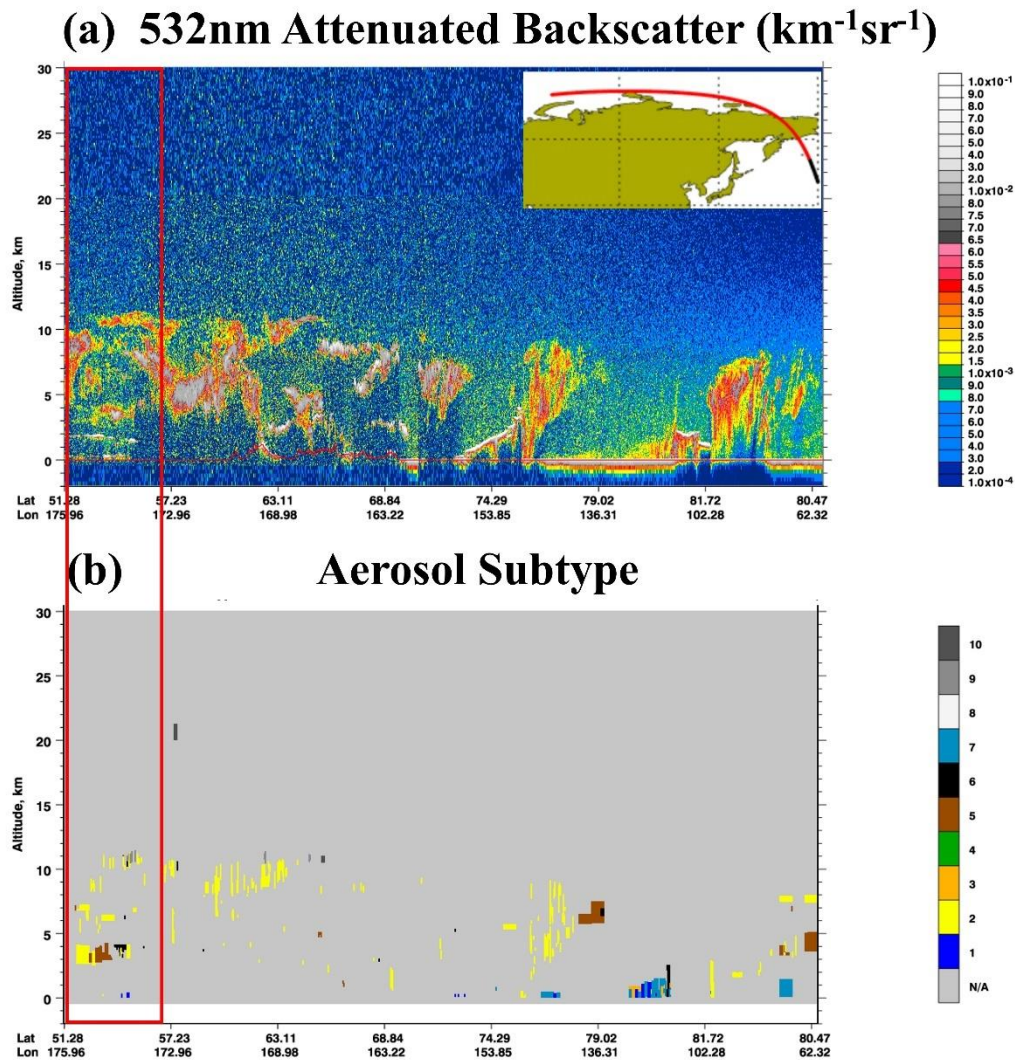
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Figure 8. Aerosol optical properties observed at ground-based sites during CASE II. (a) AOD (550nm) and Angström exponent (440-870nm) at the Beijing AERONET site (b) AOD and Angström exponent at the Seoul AERONET site (c-d) Vertical profiles of backscattering coefficient and depolarization ratio at the Seoul AD-Net site (e-f) Vertical profiles of backscattering coefficient and depolarization ratio at the Niigata AD-Net site. The red rectangle denotes the time when dust passed over the site.

Figure 9 shows the aerosol vertical structure observed from CALIPSO over the Bering Sea (51.28°N, 175.96°E - 57.23°N, 172.96°E) on March 12, 2013. At around 2.5 - 4 km, an aerosol layer was evident, consisting of dust and polluted dust,

444 confirming that the aerosols transported to the remote ocean still contained a large
 445 amount of dust particles.
 446



447
 448
 449 **Figure 9. CALIPSO profiles of (a) aerosol backscattering coefficients and (b)**
 450 **identified aerosol types on March 12, 2013. The red rectangles denote the regions**
 451 **as indicated by the CALIPSO tracks in Figure 5a.**

452

453 By comparing the transport pathways of CASE I and CASE II, CASE I passed

454 over more terrestrial areas, increasing the probability of mixing between dust and air
455 pollutants from anthropogenic emissions. While CASE II travelled more over the open
456 ocean, which was more likely to mix with sea salts. In terms of transport time, the air
457 masses in CASE I took about four days to reach the receptor after getting out of the
458 Asian dust source regions, while the air masses in CASE II took about six days. The
459 longer transport time in CASE II may lead to more deposition of coarse dust particles
460 due to the gravitational effect and other removing processes such as wet scavenging.

461

462 **3.6 Evolution of aerosol optical properties during long-range transport to the** 463 **Arctic**

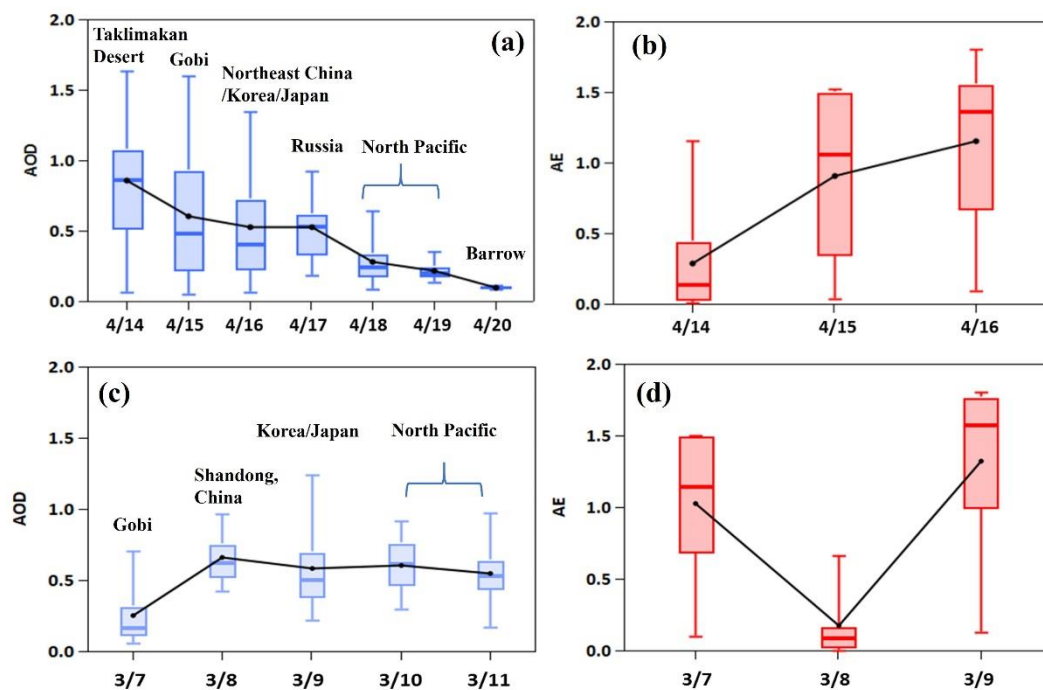
464 In the previous section, it has been well demonstrated that the Arctic air pollution events
465 in both CASE I and CASE II were caused by the long-range transport of Asian dust.
466 However, only a limited observation from ground-based sites and CALIPSO was
467 available for the analysis of aerosol properties. In order to analyze the evolution of
468 aerosols during the transport, MODIS data with a wide spatial coverage was used to
469 quantify the changes of aerosol optical properties.

470 As shown in Figure S1, MODIS data were analyzed on a daily basis. Since
471 simulated backward trajectories were subject to certain uncertainties (Draxler and Hess,
472 1998), the rectangular subsection that covered the daily trajectory was extracted to
473 represent the aerosol properties along the transport pathway. Figure 10 compares the
474 mean values of AOD and AE over the daily transport coverage area between the two
475 cases. As shown in Figure 10a, AOD in CASE I exhibited an evidently decreasing trend

476 with time. It averaged 0.86 on April 14, 2015 over the dust source regions, while it was
477 0.10 at Barrow on April 20, indicating a tremendous AOD decrease of nearly 8 times.
478 In the meanwhile, AE showed an increasing trend (Figure 10b). This indicated that, on
479 the one hand, the high aerosol concentrations from the dust source regions had been
480 significantly eliminated by various physical scavenging processes. In the meantime,
481 local air pollutants could be reduced by the strongly invaded dust (Wang et al., 2018a).
482 On the other hand, dust mixed with fine particles such as black carbon, nitrate, and
483 sulfate and gradually modified the irregular dust particles to be more spheric (Xu et al.,
484 2020).

485 In contrast, less variation of AOD during the transport was observed in CASE II
486 (Figure 10c). AOD was relatively low over the Gobi Desert on March 7 while the mean
487 AOD even increased to 0.56 - 0.68 from March 8 to 11. As shown in Figure S1b, the
488 eastward movement of aerosol plume was evident. This probably indicated the dust
489 plume had already drifted away from the dust source region, which explained the lower
490 AOD in the source region than the downwind regions. Meanwhile, except for the low
491 value of AE on March 8 (possibly due to the small number of data points as shown in
492 Figure S1b), the mean AE values were above 1.0 on March 7 and 9. This suggested that
493 dust mixed with more fine particles and coarse particles were more removed. Overall,
494 by comparing these two cases, it was evident that different transport routes to the Arctic
495 had divergent effects on the evolution of aerosol optical properties.

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Figure 10. Regional (a) AOD and (b) Angström exponent in CASE I. Regional (c) AOD and (d) Angström exponent in CASE II. The dots and lines inside the boxes represent the mean and median values, respectively; bottom and top of the boxes represent the 25 and 75% limits, respectively; and bottom and top short lines represent the minimum and maximum values, respectively. The geographic region in each day is defined in Figure S1.

506 3.7 Impact assessment of transported aerosols on the Arctic surface albedo

507 Surface albedo is an important parameter for energy exchange between the surface and
 508 the atmosphere in polar regions. The changes in snow and ice albedos could have
 509 important climatic impacts on the polar regions as well as the whole world. Due to the
 510 large difference between the multiple scattering effect of snow and ice and absorption
 511 effects of absorbing impurities (e.g. black carbon and dust), very small amounts of
 512 deposited impurities can lead to a decrease of snow and ice albedo (Zhang et al., 2017).
 513 Hansen and Nazarenko (2004) showed that the effect of soot on reducing snow and ice
 514 albedo was around 1.5% in the Arctic and 3% in the snow and ice covered areas of the

515 Northern Hemisphere. Kaspari et al. (2014) showed that black carbon reduced snow
516 and ice albedo by 6-10% relative to pure snow in the Himalayas in winter and spring,
517 and other impurities such as dust even reduced snow and ice albedo by 40 - 42%. In
518 this regard, decreases of snow and ice albedo would cause surface warming, thinning
519 of sea ice, melting permafrost, and consequently sea level rise that may have serious
520 impacts on the global water resources and ecosystems.

521 In this section, the impacts of the two Arctic pollution events on changing the surface
522 albedo were assessed. The SNICAR snow and ice albedo model was applied to estimate
523 the contributions of dust and black carbon to the reduction of snow and ice albedo.

524

525 **3.7.1 Estimation of mass concentrations of impurities in snow and evaluation of** 526 **model performance**

527 In this study, we only considered airborne dust and elemental carbon (EC) as the
528 dominant contributors to the impurities in the Arctic snow and ice. Firstly, the
529 atmospheric concentrations of absorbing aerosols were estimated by using the revised
530 IMPROVE (The Interagency Monitoring of Protected Visual Environments) Equation
531 (Pitchford et al., 2007). It was assumed that airborne dust and EC dominated the
532 scattering of coarse particles and absorption of fine particles, respectively (Eq. 1-2).

$$533 C_{\text{dust}} = b_{\text{sca},(\text{PM}_{10} - \text{PM}_1)} / 0.6, \quad (1)$$

$$534 C_{\text{EC}} = b_{\text{abs},\text{PM}_1} / 10, \quad (2)$$

535 Of which, the constant 0.6 and 10 (m^2/g) is the mass scattering efficiency and mass
536 absorption efficiency of dust and EC, respectively (Pitchford et al., 2007). Since the

537 concentrations of impurities in snow were required as inputs for the SNICAR model,
538 we estimated them based on the following assumption. Dou et al. (2017) conducted
539 field sampling at Barrow during April and May in 2015 and measured elemental carbon
540 concentration of 3.30 ng/g in the snow sample on April 30, 2015. The airborne
541 elemental carbon concentration was estimated to be 6.25 ng/m³ on the same day by
542 using the equations above. Thus, the ratio of the particulate matter in the snow versus
543 that in the atmosphere was calculated to be 0.528m³/g. This ratio was then applied to
544 estimate the concentrations of dust and elemental carbon in snow during the two cases
545 based on the assumption that particulate dust and elemental carbon could be well mixed
546 under the sufficiently long transport duration. Since the cumulative effect of impurities
547 in reducing the surface albedo was not considered in this study, the simulation result by
548 the SNICAR model was considered as the instantaneous surface albedo in the following
549 discussions.

550 To evaluate the model performance, Figure S2 compares the simulated values of
551 surface albedo and the observations at an ARM (Atmospheric Radiation Measurement)
552 site located at Barrow during 14 – 19, April, 2015. A correlation coefficient of 0.74 was
553 derived, indicating the relatively good model performance on simulating the Arctic
554 surface albedo. However, deviations of simulated values from observations were still
555 found. The bias may derive from the following aspects. First, the concentrations of dust
556 and elemental carbon in snow as inputs for the model were not in-situ measured, as well
557 as for the other input parameters such as snow radius, thickness, and density. Secondly,
558 the simulation only considered the absorbing substances deposited from the atmosphere

559 while the pre-existing impurities in snow and ice were ignored. Last but not the least,
560 impurities such as brown carbon were not included for the simulation.

561

562 **3.7.2 Comparison of the changes of Arctic surface albedo between two cases**

563 In this section, the impacts of transported particles on the change of surface albedo in
564 both cases were evaluated. Figure S3 shows the time-series of estimated dust and
565 elemental carbon in snow during the two pollution cases. As for CASE I (Figure S3a),
566 the peak time of elemental carbon was about half a day ahead of that of dust. This
567 phenomenon was as similar as some other dust events that anthropogenic air pollutants
568 were ahead of dust pushed by the cold front (Guo et al., 2004; Wang et al., 2018a). In
569 regard of the variations of pollutants, four representative moments were selected, i.e.,
570 0:00 on April 18 (the beginning of pollution), 13:00 on April 19 (the peak time of
571 elemental carbon), 3:00 on April 20 (the peak time of dust), and 15:00 on April 21 (the
572 end of pollution). As for CASE II (Figure S3b), the estimated concentrations of
573 impurities in snow stayed at relatively low levels and varied less strongly compared to
574 CASE I. We chose 12:00 on March 14 (the beginning of pollution), 17:00 on March 15
575 (the peak time of dust), and 13:00 on March 18 (the end of pollution) for the analysis.

576 By using the SNICAR model, the effects of dust, elemental carbon, and
577 combination of dust and elemental carbon on the surface albedo were separately
578 assessed. As shown in Table 4, the reduction of surface albedo caused by long-range
579 transported Asian light-absorbing pollutants ranged from 0.35% to 2.63%, which were
580 consistent with previous studies. For instance, Dou et al. (2017) calculated a 1.6-5.1%

581 reduction in snow and ice albedo caused by dust and black carbon at Barrow from late
582 April to May 2015, with a 5-10 fold increase in pollutant concentrations compared to
583 the pre-April period due to the snowmelt period during that time. Zhang et al. (2017)
584 calculated that dust and black carbon reduced snow and ice albedo by 0.72-1.00% on
585 glaciers in the southeastern Tibetan Plateau in June 2015. In CASE I, the highest
586 concentration of elemental carbon in snow reached more than 72 ng/g, which could
587 reduce the albedo by 1.47%. And the highest concentration of dust reached more than
588 37 $\mu\text{g/g}$, which could reduce the albedo by 2.26%. During this pollution event, the
589 combined effect of dust and elemental carbon significantly reduced the snow and ice
590 albedo by 2.28%. In CASE II, elemental carbon concentrations were much lower than
591 CASE I and its effect on albedo was below 0.40%, while dust can reduce albedo up to
592 1.87%. The combined effect of dust and elemental carbon reached more than 2%
593 compared to the pure snow condition.

594

595 **Table 4. Simulated changes of albedo due to dust, elemental carbon, and**
596 **combination of dust and elemental carbon (SA represents the simulated surface**
597 **albedo of pure snow)**

Time (UTC)	BC snow (ng/g)	Dust snow (μ g/g)	SA Pure	SA+EC	SA+Dust	SA+EC & Dust	EC (%)	Dust (%)	EC&Dust (%)
Barrow									
2015/4/18 0:00	24.31	8.31	0.7990	0.7901	0.7915	0.7852	1.12%	0.94%	1.73%
2015/4/15 15:00	72.14	21.39	0.8392	0.8270	0.8300	0.8218	1.47%	1.10%	2.07%
2015/4/20 3:00	21.16	37.11	0.8143	0.8077	0.7959	0.7929	0.83%	2.26%	2.63%
2015/4/21 15:00	6.08	1.93	0.8379	0.8361	0.8365	0.8350	0.22%	0.17%	0.35%
Alert									
2013/3/14 13:00	7.75	10.77	0.7995	0.7964	0.7912	0.7891	0.39%	1.04%	1.30%
2013/3/15 17:00	7.37	20.74	0.7923	0.7892	0.7775	0.7758	0.40%	1.87%	2.08%
2013/3/18 13:00	6.52	3.68	0.7956	0.7929	0.7921	0.7899	0.34%	0.44%	0.72%

599 As discussed above, the concentrations of dust and elemental carbon were
600 relatively higher in CASE I, hence the resulting effects on snow and ice albedo were
601 more obvious. On the one hand, the transport time in CASE I was shorter and the
602 particulate matters were scavenged less along the transport. On the other hand, the air
603 masses in CASE I passed over a large number of terrestrial areas, including northeast
604 China and Siberia. Fine particles from anthropogenic emissions and biomass burning
605 in Siberia mixed with dust and transported to Barrow together, making the elemental
606 carbon at the receptor significantly higher. As for CASE II, the receptor site at Alert is
607 a higher latitudinal area, which was much less affected by local anthropogenic activities.
608 In addition, the transport pathway of CASE II was mostly over the open ocean with

609 longer duration. This finally induced much lower air pollutant concentrations and
610 weaker impact on the reduction of surface albedo.

611

612 **4. Conclusions**

613 In this study, the long-range transport of Asian dust to the Arctic was investigated.
614 During 2011-2015, 50 dust events in China were recorded, of which 38 dust events had
615 the capability to reach the Arctic based on the air mass trajectory simulation. Two main
616 transport routes were identified. One typical transport type was characterized of wide
617 geographic coverage, long transport duration (generally 7-10 days), and mainly marine
618 transport due to the high lifting altitude of dust particles (mostly over 1500m) over the
619 dust source regions. The other typical transport type was characterized of dust transport
620 mostly over land with relatively short duration of about 4-8 days. This was due to the
621 presence of a low-pressure system over northern Japan in spring, which induced the air
622 masses deflecting northward.

623 Two typical coarse particle dominated cases observed in the Arctic were
624 specifically investigated, i.e., one at Barrow in April 2015 (CASE I) and the other one
625 at Alert in March 2013 (CASE II), respectively. Based on the air mass trajectory
626 simulation, in CASE I, dust originated from the Taklamakan and Gobi deserts in China,
627 then passed over East Asia, Siberia of Russia, and the Pacific Ocean, and finally reached
628 Barrow. In CASE II, dust originated from the Gobi Desert, then passed over Korea and
629 Japan and directly entered the Pacific Ocean, and finally moved northward across the
630 Arctic Ocean and reached Alert.

631 The dust transport pathways during both cases were verified based on a synergy
632 of NCEP reanalysis data (geopotential height fields), ground-based observations
633 (AERONET aerosol columnar properties and lidar aerosol profiles), and satellite
634 products (CALIPSO profiles). The passing time and height of the dust plume based on
635 trajectory simulation coincided very consistently with various observations. The
636 evolution of aerosol optical properties during the transport was assessed by using the
637 large-scale MODIS data. In CASE I, AOD showed a significant decreasing trend while
638 Angström exponent showed an increasing trend from the dust source region to the
639 receptor. In contrast, AOD varied much less significantly in CASE II. It was evident
640 that different transport routes to the Arctic had divergent effects on the evolution of
641 aerosol properties.

642 The SNICAR snow and ice model was applied to simulate the impact of impurities
643 on the reduction of surface albedo in the Arctic during the two cases. The concentrations
644 of dust and elemental carbon in snow were estimated and the effects of dust, elemental
645 carbon, and combination of dust and elemental carbon on snow and ice albedo were
646 separately quantified. The reduction of snow and ice albedo caused by long-range
647 transported Asian light-absorbing pollutants ranged from 0.35% to 2.63%. This study
648 highlighted that the long-range transport of Asian dust to the Arctic was ubiquitous and
649 its impact on changing the radiative forcing and regional climate in the Arctic should
650 be considered by the atmosphere-ocean-cryosphere interaction.

651 It has to be noted that the simulation of surface albedo due to the transport of dust
652 particles was subject to large uncertainties. The concentrations of impurities in snow

653 were estimated by empirical equations but not in-situ measurement data. As a result,
654 the cumulative effect of impurities in reducing the surface albedo was not considered.
655 Also, the evolution of dust microphysical properties was not accounted in the model
656 simulation. The atmospheric aging processes, i.e., dust particles coated with various
657 type of aerosols during the long-range transport, could further enhance the reduction of
658 snow albedo. The dust particle refractive index is regarded as an important factor for
659 dust absorption in snowpack (He, 2022). To reduce the uncertainties of snow albedo
660 simulation, simultaneous in-situ measurements of particle composition and optical
661 properties in both the air and snowpack are essentially needed in the future Arctic
662 studies.

663

664 **Data availability**

665 The measurement data at Barrow and Alert are from the EBAS database
666 (<https://ebas.nilu.no/>). Aerosol columnar data are from AERONET
667 (<https://aeronet.gsfc.nasa.gov/>). Aerosol vertical profiles are from AD-Net
668 (<https://www-lidar.nies.go.jp/AD-Net>). The MODIS Level-3 aerosol products are
669 from NASA's Giovanni (<https://giovanni.gsfc.nasa.gov/giovanni/>). The NCEP/NCAR
670 reanalysis data are from <https://www.esrl.noaa.gov/psd/data/gridded/reanalysis/>

671

672 **Author contributions**

673 KH designed this study. XZ analyzed data. All reviewed and wrote the paper.

674

675 **Competing interests**

676 The authors declare that they have no conflict of interest.

677

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