1	On the Seasonality of Arctic Haze
2	Zhaoyi Shen*
3	Program in Atmospheric and Oceanic Sciences, Princeton University, Princeton, New Jersey.
4	Yi Ming, Larry W. Horowitz, V. Ramaswamy and Meiyun Lin
5	NOAA/Geophysical Fluid Dynamics Laboratory, Princeton, New Jersey.

- 6 \*Corresponding author address: Zhaoyi Shen, NOAA Geophysical Fluid Dynamics Laboratory,
- 7 201 Forrestal Rd., Princeton, NJ 08540.
- <sup>8</sup> E-mail: zs@princeton.edu

## ABSTRACT

Arctic haze has a distinct seasonality with peak concentrations in winter but 9 pristine conditions in summer. It is demonstrated that the Geophysical Fluid 10 Dynamics Laboratory (GFDL) atmospheric general circulation model AM3 11 can reproduce the observed seasonality of Arctic black carbon (BC), an im-12 portant component of Arctic haze. We use the model to study how large-scale 13 circulation and removal drive the seasonal cycle of Arctic BC. It is found that 14 despite large seasonal shifts in the general circulation pattern, the transport 15 of BC into the Arctic varies little throughout the year. The seasonal cycle of 16 Arctic BC is attributed mostly to variations in the controlling factors of wet 17 removal, namely the hydrophilic fraction of BC and wet deposition efficiency 18 of hydrophilic BC. Specifically, a confluence of low hydrophilic fraction and 19 weak wet deposition, owing to slower aging process and less efficient mixed-20 phase cloud scavenging, respectively, is responsible for the wintertime peak 21 of BC. The transition to low BC in summer is the consequence of a gradual 22 increase in the wet deposition efficiency, while the increase of BC in late fall 23 can be explained by a sharp decrease in the hydrophilic fraction. The results 24 presented here suggest that future changes in the aging and wet deposition 25 processes can potentially alter the concentrations of Arctic aerosols and their 26 climate effects. 27

# 28 1. Introduction

The accumulation of visibility-reducing aerosols in the Arctic during late winter and early spring 29 (known as Arctic haze) was first discovered in the 1950s (Mitchell 1957). The haze has its root 30 cause in the long-range transport of air pollution originating from the mid-latitude industrial re-31 gions (Barrie 1986), and can have an influence on Arctic climate (Law and Stohl 2007). The haze 32 is a mixture of both light-scattering and light-absorbing aerosols. The aerosols pose strong radia-33 tive perturbations by scattering and/or absorbing solar radiation, by interacting with clouds, and 34 by reducing the surface albedo when deposited onto snow and ice (Quinn et al. 2007). The surface 35 temperature in the Arctic increased more than the global average since the late 20th century, coin-36 ciding with a rapid decline of sea ice (Bindoff et al. 2013). Besides greenhouse gases, decreased 37 (increased) scattering (absorbing) aerosols were postulated to have contributed to this amplified 38 Arctic climate change (Shindell and Faluvegi 2009). 39

Sulfate and black carbon (BC) are the dominant scattering and absorbing aerosols in the Arctic, respectively (Law and Stohl 2007). Distinct seasonal cycles of Arctic sulfate and BC concentrations are present in measurements. Surface observations at Alert and Barrow show that BC concentrations tend to peak during late winter and early spring before starting to decline in April, and reach a minimum during summer (Sharma et al. 2006). Aircraft measurements of sulfate reveal similar seasonal variations, with aerosol layers at higher altitudes persisting into May (Scheuer 2003).

<sup>47</sup> Different hypotheses have been posited to explain the seasonal cycle of Arctic haze. Previous <sup>48</sup> studies have shown that European emissions dominate Arctic aerosols, with smaller contributions <sup>49</sup> from East Asia and North America (e.g., Stohl 2006; Shindell et al. 2008). A dynamically oriented <sup>50</sup> view holds that during the haze season (winter and spring), meridional transport from mid-latitude

<sup>51</sup> source regions to the Arctic is stronger due to vigorous large-scale circulation. The presence of
<sup>52</sup> Siberian high pressure helps steer polluted European air into the Arctic by transient and stationary
<sup>53</sup> eddies (Barrie 1986; Iversen and Joranger 1985). The diabatic cooling of air traveling over ice and
<sup>54</sup> snow also facilitates transport to the Arctic lower troposphere. In contrast, pollution is diabatically
<sup>55</sup> transported to higher altitudes and diluted in summer (Klonecki et al. 2003).

A competing theory is that Arctic haze occurs in winter owing to slower removal. As a major 56 sink term for aerosols, wet scavenging by precipitation (rain and snow) is modulated heavily by 57 cloud microphysics. Aerosols are not effectively removed by ice clouds since soluble aerosols 58 such as sulfate are generally poor ice nuclei (IN). BC particles become effective IN only when 59 the temperature is below  $\sim 240$  K (Friedman et al. 2011). In mixed-phase clouds, the Bergeron 60 process (i.e. evaporation of liquid droplets in the presence of ice crystals) releases aerosols con-61 tained in cloud droplets back into air (Cozic et al. 2008), so the wet scavenging in mixed-phase 62 clouds is much less efficient than in liquid clouds (Liu et al. 2011; Browse et al. 2012). The low 63 efficiency of ice cloud and mixed-phase cloud scavenging favors accumulation of aerosols at cold 64 temperatures. Dry deposition also has seasonal variations and is weaker in winter when the stable 65 boundary layer inhibits turbulent mixing (Quinn et al. 2007). It, however, accounts for only a small 66 portion of the total removal and affects mainly the surface concentrations of Arctic haze (Liu et al. 67 2011). Another key factor unique to BC is the aging process, which refers to the transformation 68 from hydrophobic to hydrophilic aerosols due to coating by soluble species (Petters et al. 2006). 69 Only aged BC particles can act as cloud condensation nuclei (CCN) and be removed by in-cloud 70 scavenging. As a result, the aging rate has a large effect on global BC concentrations and distribu-71 tions. Experimental studies have found that condensation of gaseous sulfuric acid (H<sub>2</sub>SO<sub>4</sub>) is an 72 effective aging mechanism for BC particles (Zhang et al. 2008); reduced concentrations of  $H_2SO_4$ 73

<sup>74</sup> due to slower oxidation of  $SO_2$  by the hydroxyl radical (OH) in winter results in a lower aging rate <sup>75</sup> and thus weaker wet deposition (Liu et al. 2011).

It is important to note that the aforementioned mechanisms (namely large-scale circulation, 76 cloud microphysics and aging) are not mutually exclusive; they could all act to induce season-77 ality. Yet, the relative importance of these mechanisms in shaping the pronounced seasonal cycle 78 of Arctic haze remains unclear. While it is hard to separate these factors cleanly using observations 79 alone, we approach the issue here using a comprehensive global model. In this study we apply 80 an atmospheric general circulation model (AGCM) to analyze the factors controlling the seasonal 81 cycle of Arctic haze with a focus on BC, an important constituent of Arctic haze with a potentially 82 important influence on Arctic climate. 83

## **2. Model Description**

This study uses the Geophysical Fluid Dynamics Laboratory (GFDL) AM3 AGCM (Donner 85 et al. 2011) with a cubed-sphere grid resolution of  $\sim 100$  km and 48 hybrid vertical levels from 86 the surface to  $\sim 1$  Pa. We conduct a six-year hindcast simulation (2008-2013), following one year 87 of spin-up. The emission inventories reflect 2008-2013 conditions. Anthropogenic emissions of 88 aerosol and ozone precursors with seasonal variations are based on Hemispheric Transport of Air 89 Pollution (HTAP) v2 - a mosaic of regional and global emission inventories for the years 2008 and 90 2010 (Janssens-Maenhout et al. 2015), and are held constant after 2010. Daily-resolving biomass 91 burning emissions for 2008-2013 are adopted from the Fire Inventory from National Center for 92 Atmospheric Research (NCAR) (Wiedinmyer et al. 2011) and emitted in the model surface layer. 93 The model is forced with observed sea surface temperatures and sea ice, and horizontal winds are 94 nudged to the reanalyses from the National Centers for Environmental Prediction (NCEP) Global 95 Forecasting System at approximately  $1.4^{\circ} \times 1.4^{\circ}$  horizontal resolution using a pressure-dependent 96

<sup>97</sup> nudging technique (Lin et al. 2012). The latter makes it possible to compare model simulations
<sup>98</sup> with observations for specific flight campaigns.

The treatment of BC in AM3 used in this study differs from that described by Donner et al. 99 (2011), and has been discussed extensively by Liu et al. (2011) and Fan et al. (2012); here we 100 summarize briefly the key features. AM3 includes two types of BC: hydrophobic (BCpo) and 101 hydrophilic (BCpi). 80% (40%) of BC emitted from anthropogenic (biomass burning) sources 102 is assumed to be hydrophobic. The hydrophobic BC is then converted to the hydrophilic form 103 at a variable aging rate (Liu et al. 2011), which depends on condensation of sulfuric acid (the 104 rate of which is assumed to be proportional to OH concentrations) and other processes such as 105 coagulation (represented by adding a small constant term to the aging rate coefficient, see Section 106 6 for more discussion). Only hydrophilic BC can be removed by in-cloud scavenging, which is 107 parameterized using a first-order rate coefficient ( $k_{scav}$ , s<sup>-1</sup>) (Fan et al. 2012): 108

$$k_{scav} = \frac{F_{scav,1}P_{rain} + F_{scav,2}(1 - f_{berg})P_{snow} + F_{scav,3}f_{berg}P_{snow}}{Q_{liq} + Q_{ice}},$$
(1)

where  $P_{rain}$  and  $P_{snow}$  are the 3-dimensional rain and snow rates (kg m<sup>-3</sup> s<sup>-1</sup>), respectively, and 109  $Q_{liq}$  and  $Q_{ice}$  the liquid and ice cloud water contents (kg m<sup>-3</sup>), respectively.  $F_{scav,i}$  is the scaveng-110 ing efficiency (i.e. the fraction of BC that is incorporated into cloud droplets or ice crystals and 111 removed by precipitation) for precipitation type i (i=1, 2, 3).  $f_{berg}$  is the fraction of snow produced 112 by the Bergeron process. In this study,  $F_{scav,1}$  and  $F_{scav,2}$  are set to 0.2, and  $F_{scav,3}$  is set to 0.01 113 to account for the less efficient removal of aerosols by snow produced by the Bergeron process 114 than by rain and snow produced by riming and homogeneous freezing. Both hydrophobic and hy-115 drophilic BC can be removed by below-cloud scavenging and dry deposition. The dry deposition 116 velocity is calculated using the empirical resistance-in-series method with a surface-dependent 117

<sup>118</sup> collection efficiency (Gallagher 2002), resulting in a much smaller dry deposition velocity over <sup>119</sup> snow and ice than over land surfaces (soils and canopy).

#### **3. Simulated and observed seasonal cycle of Arctic BC**

Simulating Arctic BC, especially its seasonal cycle, remains a challenge for the current gener-121 ation of models. Many models underestimate Arctic BC concentrations in winter by more than 122 an order of magnitude and thus fail to reproduce the observed seasonal variations (Shindell et al. 123 2008). Figure 1 shows the AM3 simulated and observed monthly mean BC surface concentrations 124 at Alert, Barrow, and Zeppelin (Eleftheriadis et al. 2009; Sharma 2004; Sharma et al. 2006). Mea-125 sured BC exhibits similar seasonal variations at all three stations. Its concentrations peak in winter 126 or early spring, followed by a rather precipitous decrease in April and May. The lowest concentra-127 tions occur from June to October. On average, BC concentrations in winter (DJF) are higher than 128 in summer (JJA) by a factor of 3-4. The model is able to capture the seasonal cycle, but appears 129 to underestimate BC at Alert and Barrow by a factor of 2-3 throughout the year. This discrepancy 130 may result from model deficiencies, including uncertainties in BC emissions and deposition, or 131 from observational errors, as some of the measurements are indirect and may be subject to rather 132 large biases (Bond et al. 2013). 133

Figure 1 also compares the simulated BC vertical profiles at high latitudes (66°-85°N) with the aircraft measurements made during the HIAPER Pole-to-Pole Observations (HIPPO) campaigns (Schwarz et al. 2013; Wofsy 2011). The seasonal variations are evident in the data. In January, high concentrations of BC are confined within the boundary layer (HIPPO1). During early spring, there are enhancements of BC at higher altitudes (HIPPO3). BC concentrations at all altitudes start to decrease in June, and remain low throughout summer (HIPPO4 and HIPPO5). Despite overestimates in the free troposphere for some flights, the model generally performs well in simulating
 BC vertical profiles during all seasons.

Based on the above comparisons, we conclude that the model is capable of simulating the sea-142 sonal cycle of Arctic BC, and thus can be used to study its underlying mechanisms. This improve-143 ment in AM3 simulated Arctic BC is attributed to the modified BC-related processes (aging, wet 144 removal and dry deposition) in the model, and Liu et al. (2011) discussed the sensitivity of BC 145 simulation to each process in detail. Since observations show similar seasonality of Arctic BC at 146 the surface and in the free troposphere, we will focus on the BC column burden averaged over the 147 Arctic for the rest of the paper. This allows us to take full advantage of the model and generalize 148 the results to the entire Arctic. 149

#### **4. Controlling factors of Arctic BC**

<sup>151</sup> We employ a box model of the Arctic region to quantify the key factors controlling Arctic BC <sup>152</sup> concentrations. Given the relatively small emissions from local sources, the prevailing balance is <sup>153</sup> between the meridional BC transport into the Arctic and local deposition. One can write the rate <sup>154</sup> of change in the average BC column burden (C, kg m<sup>-2</sup>) as:

$$\frac{dC}{dt} = \frac{F}{S} - W - D,\tag{2}$$

where *F* is the total meridional flux into the Arctic (kg s<sup>-1</sup>), *S* the Arctic surface area (m<sup>2</sup>), and *W* and *D* the average wet and dry deposition rates (kg m<sup>-2</sup> s<sup>-1</sup>), respectively. Since the dry deposition of BC and the below-cloud scavenging of BCpo are small (less than 10% of the total BC deposition in the model simulation) and can be neglected, Eq. (2) can be simplified as:

$$\frac{dC}{dt} = \frac{F}{S} - W_{pi},\tag{3}$$

where  $W_{pi}$  is the average BCpi wet deposition rate (kg m<sup>-2</sup> s<sup>-1</sup>).  $W_{pi}$  can be written as  $r \cdot w \cdot C$ , where *r* represents the dimensionless hydrophilic fraction of BC ( $C_{pi}/C$ ,  $C_{pi}$  being the average BCpi column burden) and *w* represents the wet deposition efficiency of BCpi ( $W_{pi}/C_{pi}$ , s<sup>-1</sup>), which can be thought of as the BC concentration-weighted in-cloud scavenging rate coefficient ( $k_{scav}$ ) defined in Eq. (1), and is different from the wet scavenging efficiency ( $F_{scav,i}$ ). As the AM3 simulated residence time of Arctic BC ranges from 6-20 days depending on the season (not shown), we assume steady state on the monthly time scale and arrive at an expression for *C*:

$$C = \frac{F}{S \cdot r \cdot w}.\tag{4}$$

An inspection of Eq. (4) suggests that elevated BC concentrations could result from stronger transport from mid-latitude source regions and/or weaker wet removal. General circulation patterns are important for determining long-rage transport fluxes. Wet removal is reduced when a smaller fraction of BC is hydrophilic or the wet deposition efficiency of BCpi is lower. The aging process exerts a strong control over the hydrophilic fraction. The wet deposition efficiency is affected mainly by the phase of precipitation because in-cloud scavenging efficiency differs among liquid, ice and mixed-phase clouds.

We apply the box model to quantify the roles of the three main variables, namely the meridional 173 BC flux (F), BC hydrophilic fraction (r) and BCpi wet deposition efficiency (w), in controlling 174 the seasonality of Arctic BC. The monthly mean values of F, r and w averaged over the Arctic 175 (defined as poleward of 66°N) are computed from our AM3 model simulation. Figure 2a compares 176 the monthly mean BC column burdens calculated using the box model with AM3 simulations. The 177 good agreement validates the assumptions made in deriving Eq. (4). The box model captures the 178 seasonal cycle, suggesting that one can rationalize the seasonality of Arctic BC by examining the 179 three variables defined above. 180

## **5.** Meridional transport

Like other anthropogenic aerosol species, BC is emitted mainly at the mid-latitude industrial 182 regions and carried into the Arctic by atmospheric transport. Isentropic airflow facilitates high-183 level transport from warm and humid (high equivalent potential temperature,  $\theta_{e}$ ) areas such as 184 North America and East Asia, and low-level transport from comparatively low  $\theta_e$  areas such as 185 Europe (Stohl 2006). Cross-isentropic transport due to diabatic heating or cooling also plays 186 an important role (Klonecki et al. 2003). The total meridional BC flux (F) can be decomposed 187 into contributions from the mean meridional circulation (MMC), stationary eddies, and transient 188 eddies: 189

$$\{\overline{vc}\} = \underbrace{\{[\overline{v}][\overline{c}]\}}_{MMC} + \underbrace{\{\overline{v}^*\overline{c}^*\}}_{stationary\ eddies} + \underbrace{\{\overline{v'c'}\}}_{transient\ eddies},$$
(5)

where v is the meridional wind velocity (m s<sup>-1</sup>), and c the BC mass mixing ratio (kg kg<sup>-1</sup>). 190 Overbars denote monthly means, square brackets zonal means, asterisks deviations from zonal 191 means, primes deviations from monthly means, and curly brackets zonal and vertical integrals 192 (from the surface to  $\sim 100$  hPa). Figure 2b shows the annual cycle of the total monthly mean 193 meridional BC flux into the Arctic (at  $66^{\circ}$ N) and its three components. Generally, the total BC 194 flux does not show much variation with time. The average flux is only  $\sim 20\%$  higher in DJF than 195 in JJA, far from sufficient to account for the column burden difference between the two seasons 196 (Figure 2a). The contribution of the mean meridional circulation is very small. The transport is 197 realized almost entirely by the eddy components. The flux by stationary eddies is comparable to 198 that by transient eddies in DJF, while the latter dominates in JJA. 199

Although the vertically integrated BC flux changes little throughout the year, its vertical structure does vary with the season (Figure 3). The flux in DJF is characterized by two peaks (one in the boundary layer, and the other at about 500 hPa), which are of different origins. In winter the polar

dome (surface of constant potential temperatures) extends to about  $40^{\circ}$ N, allowing the low-level 203 transport of BC from Europe (Stohl 2006). The diabatic cooling occurring when relatively warm 204 air travels over a cold surface (i.e. strong inversion) keeps European BC in the boundary layer. 205 The flux at about 500 hPa is more likely to be a result of transport from lower-latitude regions such 206 as East Asia and North America. In JJA when BC from all regions experiences diabatic heating 207 and wet removal caused by precipitation, the flux has only one notable peak at about 800 hPa 208 originating from anthropogenic emissions in Europe and boreal forest fires over Eurasia. BC from 209 North America and East Asia is more likely to be transported diabatically to higher altitudes, and 210 diluted and rained out along the path to the Arctic (Klonecki et al. 2003). 211

We further explore the meridional BC flux in frequency space by applying a time filter. Since 212 the mean meridional flux is negligible,  $\{\overline{v_n c_n}\}$  approximates BC transport carried out by eddies 213 with time scales greater than 2n days (Hall et al. 1994). Note that the subscript n denotes means 214 of consecutive non-overlapping *n*-day periods. Figure 4 shows the time-filtered BC flux into the 215 Arctic as a fraction of the total flux. The relative contributions from eddies of different frequencies 216 to the total BC transport are different in the two seasons. In DJF, about 90% of the BC flux is 217 realized by eddies with time scales longer than 10 days. Slightly more than 40% of the BC flux 218 arises from eddies that persist longer than 60 days. In contrast, eddies with time scales longer 219 than 10 days account for less than 50% of the JJA flux, and eddies that persist longer than 60 days 220 have very little contribution to the total flux. Thus, while synoptic eddies dominate in JJA, low 221 frequency eddies contribute substantially to the total transport in DJF. 222

The prominence of transient eddies in all seasons suggests that the long-range transport of Arctic haze can be represented, to first order, as turbulent diffusion of mid-latitude sources, despite the complexities at the process level (Shaw 1981). The idea of simplifying eddy transport as turbulent diffusion is widely used in understanding the atmospheric transport of heat and potential vorticity (Held 1999). Here we apply it to study tracer transport. For a local down-gradient diffusion pro cess, the vertically integrated meridional transient eddy BC flux can be assumed to be proportional
 to the meridional gradient of the BC column burden:

$$\{\overline{v'c'}\} = -D\frac{\partial}{\partial y}\{\overline{c}\},\tag{6}$$

where D is the turbulent diffusivity. It is clear from Figure 5 that there is a strong negative correlation (r = -0.75) between the transient eddy flux and meridional gradient averaged at a number of latitudes between 40°-66°N. The magnitude of the slope of the best linear fit with zero intercept (2.24 × 10<sup>6</sup> m<sup>2</sup> s<sup>-1</sup>) represents the eddy diffusivity, which is within the range of the estimated values in previous studies (e.g., Bolin and Keeling 1963; Newell et al. 1969; Held 1999). Note that this diffusivity does not change substantially with the season.

#### **6.** Hydrophilic fraction

Figure 6a shows the monthly mean hydrophilic fraction (r) of Arctic BC, which has a pro-237 nounced seasonal cycle that can be attributed to the parameterized aging mechanisms. The hy-238 drophilic fraction in DJF is only  $\sim 40\%$ , while almost all BC is hydrophilic in JJA. The hydrophilic 239 fraction of Arctic BC is very close to that of the meridional BC flux into the Arctic (Figure 6a), in-240 dicating that the annual cycle is shaped mainly by the aging process along the long-range transport 241 path rather than locally in the Arctic. Figure 6b shows the monthly mean e-folding aging time of 242 BC (the inverse of the aging rate coefficient, computed as the average BCpo concentration divided 243 by the average conversion rate from BCpo to BCpi) at  $40^{\circ}$ - $66^{\circ}$ N and over the Arctic. During the 244 transport from mid-latitudes to the Arctic, the average aging time is much longer in DJF ( $\sim 10$ 245 days) than in JJA ( $\sim 1$  day), resulting in a substantially lower hydrophilic fraction in winter. In 246

the Arctic, the seasonal variations of BC aging time are even greater, which further amplifies the seasonal cycle of the hydrophilic fraction.

In the model the BC aging is assumed to result primarily from the condensation of  $H_2SO_4$  onto 249 BC aerosol surface, a common process that has been examined extensively in observational and 250 experimental studies.  $H_2SO_4$  is produced from the gas-phase oxidation of  $SO_2$  by the OH radical 251 and is rapidly converted to aerosol phase via nucleation or condensation onto existing particles. 252 The aging rate is thus assumed to be proportional to OH concentrations. As a result of enhanced 253 solar radiation and specific humidity, OH concentrations are much higher in JJA than in DJF, 254 resulting in more rapid aging by condensation in summer. The aging can also occur through other 255 processes (e.g. coagulation), which are believed to be slower and less important than condensation 256 during long-range transport (Oshima et al. 2009). Therefore they are assumed to have a fixed e-257 folding time of 20 days, which is longer than that for the aging via condensation, and thus do not 258 contribute to the seasonal cycle of the hydrophilic fraction. 259

The change in the hydrophilic fraction also helps explain the change in Arctic BC during spring and fall. From October to November, there is a sharp decrease in the hydrophilic fraction, resulting in a rapid buildup of BC. Similarly, from March to April, the increase in the hydrophilic fraction contributes to the decline in BC concentrations. The hydrophilic fraction, however, is fairly constant from April to September, in contrast with the continuous decrease in BC starting from April. The wet deposition efficiency plays an important role in driving BC changes during this time period, as discussed in the next section.

## **7. BCpi wet deposition efficiency**

Figure 6c shows the monthly mean wet deposition efficiency of BCpi (*w*) in the Arctic. The wet deposition efficiency in JJA is  $\sim 20\%$  higher than in DJF, contributing to the lower BC in JJA than in DJF. The magnitude of its seasonal cycle, however, is much weaker than that of the hydrophilic fraction (r) (Figure 6a). Yet, the wet deposition efficiency increases continuously by a factor of 2 from May to August, driving the transition from moderate BC burdens in late spring to exceedingly low burdens in summer.

The wet deposition efficiency is largely controlled by the in-cloud scavenging rate coefficient  $k_{scav}$  in Eq. (1)]. To better understand the factors determining  $k_{scav}$ , we analyze the conversion rate coefficients of cloud condensate to rain ( $k_{rain}$ ) and snow ( $k_{snow}$ ) through which in-cloud scavenging occurs, which are defined as:

$$k_{rain} = \frac{P_{rain}}{Q_{liq} + Q_{ice}}, \ k_{snow} = \frac{P_{snow}}{Q_{liq} + Q_{ice}}.$$
(7)

According to Eq. (1),  $k_{scav}$  and thus the wet deposition efficiency is determined by  $k_{rain}$  rather than 278  $k_{snow}$  in areas such as the Arctic where most snow is produced by the Bergeron process (Fan et al. 279 2012), since the scavenging efficiency for rain is much larger than for snow produced by Bergeron 280 process. Figure 6d shows the annual cycle of AM3 simulated  $k_{rain}$  and  $k_{snow}$  in the Arctic. [ $P_{rain}$ , 281  $P_{snow}$ ,  $Q_{liq}$  and  $Q_{ice}$  are first averaged over the Arctic and then  $k_{rain}$  and  $k_{snow}$  are calculated using 282 Eq. (7)]. As the atmosphere becomes warmer and holds more water vapor from DJF to JJA, both 283 rainfall ( $P_{rain}$ ) and cloud water content ( $Q_{liq} + Q_{ice}$ ) increase, and  $k_{rain}$  is higher in JJA than in 284 DJF since rainfall increases more rapidly, consistent with the seasonal cycle of the wet deposition 285 efficiency. From May to August, k<sub>rain</sub> increases by a factor of 2, which helps explain the two-fold 286 increase in the wet deposition efficiency. On the other hand,  $k_{snow}$  is much larger in DJF than in 287 JJA because cold temperature favors snow formation, which is opposite to the seasonal variations 288 in the wet deposition efficiency. Therefore one may expect that models without different removal 289 efficiencies for liquid and mixed-phase clouds cannot reproduce the seasonal cycle of the wet 290 deposition efficiency, and thus the seasonal cycle of Arctic BC concentrations. 291

#### 292 8. Concluding remarks

It has long been recognized that aerosols from mid-latitude source regions undergo long-range transport and accumulate in the Arctic during late winter and early spring. Here we apply the GFDL AM3 model to analyze the key factors affecting the seasonal variations in Arctic BC. The model is able to reproduce the observed Arctic BC concentrations and seasonality, with 3-4 times higher values in DJF than in JJA. We find that the seasonal cycle of Arctic BC is caused mainly by the seasonality of wet deposition, with a secondary contribution from the long-range transport flux.

The transport of BC at mid- to high latitudes occurs mainly through stationary and transient 300 eddies, rather than through the mean meridional circulation. Stationary eddies account for  $\sim 40\%$ 301 of the total flux in DJF, while virtually all the transport is realized through transient eddies in JJA. 302 The vertical distribution of meridional BC transport also varies seasonally. The vertical profile of 303 the BC flux into the Arctic in DJF has two peaks (one in the boundary layer and the other in the 304 mid-troposphere), while the BC flux in JJA is concentrated in the lower troposphere. The total 305 meridional BC flux into the Arctic, however, changes little throughout the year despite the shift in 306 large-scale circulation. 307

The wet removal depends on both BC hydrophilic fraction and BCpi wet deposition efficiency. The hydrophilic fraction is smaller in DJF than in JJA due to the slower BC aging along the long-range transport path to the Arctic during winter. This difference in the hydrophilic fraction plays a dominant role in the large difference in BC concentrations between DJF and JJA. The wet deposition efficiency is lower in DJF mainly because snow produced in mixed-phase clouds is less efficient in removing BC than rain. The decrease in BC concentrations from late spring to summer is due to a gradual but steady increase in the wet deposition efficiency, while the return of BC in
 late autumn is mainly caused by a sharp decrease in the hydrophilic fraction.

Our results are consistent with the observational analysis of Garrett et al. (2011), which argued 316 that some combination of dry deposition and wet scavenging drives the seasonal cycle of aerosols 317 at low altitudes in the North American Arctic. Here we show that the dominance of wet deposition 318 in determining BC seasonal cycle applies to the entire Arctic. We further explain the seasonality 319 of wet deposition in terms of aging and cloud microphysical processes. While being influenced 320 by complicated physical and chemical factors, these processes are parameterized in the model in 321 a relatively simple way. Measurements of Arctic BC mixing state at different times are required 322 for verifying the assumed OH dependence of the aging rate. Measurements of BC wet deposi-323 tion and concentrations in rain and snow will be particularly useful for constraining the rain and 324 snow scavenging efficiencies. It should also be noted that besides transport and wet deposition, 325 large uncertainties remain in BC emission inventories, which have not been discussed in this paper. 326 High-latitude BC emissions from gas flaring and residential combustion, which are underestimated 327 or completely missing in most current inventories, have a large contribution to Arctic BC concen-328 trations and are potentially crucial for affecting its seasonality (Stohl et al. 2013). However, as 329 most of these BC emissions remain close to the surface, their contributions to BC in the mid- and 330 upper troposphere in the Arctic are small (Stohl et al. 2013) and will not affect our conclusions, 331 which are based on the BC column burden. Although the analysis in this paper focuses on BC, the 332 findings should be generally applicable to other components of Arctic haze. For example, sulfate 333 has a similar seasonal cycle, but with peak concentrations in spring as opposed to winter (as is the 334 case for BC) (Shindell et al. 2008). The difference in the scavenging efficiencies by rain and snow 335 probably dominates the seasonal variations in sulfate. Reducing wet deposition by snow has been 336 found to improve model's ability to reproduce the observed sulfate concentrations over the United 337

States (Paulot et al. 2016) and in the Arctic (Browse et al. 2012). The shift in the peak may be due to the absence of an aging process since all sulfate is hydrophilic and the seasonal cycle of sulfate production by SO<sub>2</sub> oxidation.

The results discussed here may have implications for understanding the variability and trend in 341 Arctic aerosols and their climate impacts. Since large-scale circulation influences the key pro-342 cesses of long-range transport and the spatial pattern of precipitation, natural climate variability at 343 annual to decadal timescales may play an important role in determining changes in aerosol con-344 centrations in the Arctic (Christoudias et al. 2012; Eckhardt et al. 2003). It would be interesting 345 to apply our analysis to study the effect of climate variability on the characteristics of atmospheric 346 transport and wet deposition. As climate warms, precipitation at high latitudes is expected to in-347 crease, but the fraction of snow may decrease (Barnett et al. 2005; Singarayer et al. 2006). These 348 changes tend to enhance the wet scavenging of aerosols and result in a cleaner Arctic atmosphere. 349 The aging process, which is affected by atmospheric composition, may also vary over time.  $SO_2$ 350 emissions at mid-latitudes have generally declined in recent decades (Streets et al. 2006) and are 351 projected to decrease even more in the future (Levy et al. 2008). This long-term trend in  $SO_2$ 352 emissions will result in a decrease in sulfate concentrations but an increase in BC concentrations 353 in the Arctic due to a slower aging process by condensation of  $H_2SO_4$  and thus weaker wet re-354 moval. Therefore it is important to consider the changes in aerosol sources and sinks when using 355 models to examine how aerosols may alter Arctic climate under future emission scenarios. 356

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FIG. 1. (top) Model simulated and observed monthly mean surface BC at Alert (2008-2012), Barrow (2008-2013), and Zeppelin (2008-2013). Error bars denote one standard deviation from monthly means. (bottom) Model simulated and observed BC vertical profiles at high latitudes (66°-85°N) during HIPPO (HIPPO1: January 2009, HIPPO2: October-November 2009, HIPPO3: March-April 2010, HIPPO4: June-July 2011, HIPPO5: August-September 2011). Error bars associated with observational profiles represent one standard deviation of the HIPPO data. For the comparison, daily BC fields archived from the model are first sampled along the flight track and then averaged over 66°-85°N for each campaign.



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