1	Simulating black carbon and dust and their radiative forcing in
2	seasonal snow: A case study over North China with field campaign
3	measurements
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## 24 Abstract.

25 A state-of-the-art regional model, WRF-Chem, is coupled with the SNICAR model that includes the most sophisticated representation of snow metamorphism 26 27 processes available for climate study. The coupled model is used to simulate the black 28 carbon (BC) and dust concentrations and their radiative forcing in seasonal snow over 29 North China in January-February of 2010, with extensive field measurements used to 30 evaluate the model performance. In general, the model simulated spatial variability of BC 31 and dust mass concentrations in the top snow layer (hereafter BCS and DSTS, 32 respectively) are consistent with observations. The model generally moderately 33 underestimates BCS in the clean regions but significantly overestimates BCS in some 34 polluted regions. Most model results fall within the uncertainty ranges of observations. The simulated BCS and DSTS are highest with  $>5000 \text{ ng g}^{-1}$  and up to 5 mg g<sup>-1</sup>, 35 respectively, over the source regions and reduce to  $<50 \text{ ng g}^{-1}$  and  $<1 \mu \text{g g}^{-1}$ , respectively, 36 in the remote regions. BCS and DSTS introduce a similar magnitude of radiative 37 warming (~10 W  $m^{-2}$ ) in the snowpack, which is comparable to the magnitude of surface 38 39 radiative cooling due to BC and dust in the atmosphere. This study represents an effort in 40 using a regional modeling framework to simulate BC and dust and their direct radiative 41 forcing in snowpack. Although a variety of observational datasets have been used to 42 attribute model biases, some uncertainties in the results remain, which highlights the need 43 for more observations, particularly concurrent measurements of atmospheric and snow 44 aerosols and the deposition fluxes of aerosols, in future campaigns.

## 46 **1. Introduction**

47 Snow is an important component in the Earth's climate system. Water from snowmelt generates runoff to fill rivers and reservoirs in many regions of the world. 48 49 Snow cover can change the surface albedo of grassland by a factor of 3-4 and forested 50 regions by a factor of 2-3 [Thomas and Rowntree, 1992; Betts and Ball, 1997]. Therefore, 51 snow, at a larger scale, regulates the temperature of the Earth's surface and alters the 52 general circulation, and, at a smaller scale, affects regional climate [e.g., Barnett et al., 53 1988; Walland and Simmonds, 1996]. Small changes in snow albedo can have large 54 impacts on surface warming due to the rapid feedbacks involving changes to snow 55 morphology, sublimation and melt rates [Bond et al., 2013]. Snow albedo can be 56 influenced by many factors including snow depth, snow grain size, and snow impurity. 57 Snow impurity is mainly due to the light absorbing aerosols (LAA) deposited on/in the 58 snowpack, including primarily black carbon (BC), brown carbon (BrC), and dust [Warren 59 and Wiscombe, 1980, 1985; Hansen and Nazarenko, 2004; Painter et al., 2007; Jacobson, 60 2004, 2010; Flanner et al., 2007, 2009, 2012; Skeie et al., 2011; Lin et al., 2014; Wang et 61 al., 2014]. A recent estimate for global effective BC forcing in snow and ice is +0.13 W  $m^{-2}$  [Bond et al., 2013]. Dust residing in snow can also reduce snow albedo, particularly 62 63 for the visible bands. In the upper Colorado river basin, a total end-of-year dust concentration of 0.23-4.16 mg  $g^{-1}$  in the top 3 cm of the snow column can result in mean 64 springtime dust radiative forcing in snow from 31 to 49 W m<sup>-2</sup> at the alpine site and 45 to 65 75 W m<sup>-2</sup> at the subalpine site [Painter et al., 2012; Skiles et al., 2012]. 66

67 The LAA effects in snow could significantly affect the atmospheric general 68 circulation and hydrological cycle at global and regional scales in multiple ways [Qian et

69 al 2009, 2011; Painter et al., 2010; Skiles et al., 2012; Bond et al, 2013; Sand et al., 2013]. 70 For example, over Asia, BC-in-snow could increase the surface air temperature and 71 reduce spring snowpack over the Tibetan Plateau (TP) [Oian et al., 2011]. Earlier 72 snowmelt can shift the timing of peak runoff and its duration and modulate the soil 73 moisture and surface fluxes. These impacts may result in an earlier onset of the South 74 Asian Monsoon and an increase of moisture, cloudiness, and convective precipitation 75 over northern India [Qian et al., 2011]. They may also affect the East Asian Monsoon, 76 resulting in changes in summer precipitation pattern [Qian et al., 2011]. In the western 77 U.S., Qian et al [2009] found that BC deposition on the mountain snowpack could also 78 cause a reduction in snow accumulation and an earlier snowmelt that impacts water 79 resources during the drier summer months. In the upper Colorado river basin, dust 80 radiative forcing in snow could shorten the snow cover duration by 21 to 51 days, cause 81 the peak runoff to occur 3 weeks earlier on average, and reduce the annual runoff by 82 more than  $\sim 5\%$  [Painter et al., 2010; Skiles et al., 2012].

83 Although there have been some modeling studies estimating the LAA 84 concentrations in snow and their impact on snow albedo, solar absorption in snow, and 85 climate and hydrological cycle, most previous studies used global climate models [e.g., 86 Jacobson, 2004, 2010; Flanner et al., 2007, 2012; Skeie et al., 2011; Qian et al., 2011; 87 Bauer, S. E., and S. Menon, 2012; Lin et al., 2014] or snow energy balance models 88 coupled with simplified radiation schemes with observed LAA concentrations in snow as 89 inputs [e.g., Painter et al., 2010; Painter et al., 2012; Skiles et al., 2012]. Both amounts 90 and properties of snow and aerosols are extremely heterogeneous, particularly in regions 91 with complex topography [e.g., Painter et al., 2010; Zhao et al., 2013a]. Global climate 92 models with relatively coarse horizontal resolutions (typically 1~2 degrees) cannot fully 93 resolve the spatial and temporal variability of aerosols in snow. In addition, global 94 climate models with some simplified treatments of physics and chemistry processes may 95 introduce additional uncertainties in simulating snow and aerosols [Zhao et al., 2013b; 96 Zhao et al., 2013c].

97 Few studies of the climatic impacts of LAA in snowpack used regional climate 98 models. Although regional models are more computationally demanding, the ability to 99 resolve complex terrain using high spatial resolution is particularly important for 100 simulating mountain precipitation and snowpack [e.g., Leung et al. 2003; Leung and Qian 101 2003; Rasmussen et al. 2011; Yoon et al., 2012]. More sophisticated physics and 102 chemistry treatments used in some regional models can provide additional benefits. 103 Although Qian et al. [2009] used a regional modeling framework to investigate the 104 impact of BC in snow over the Western U.S., they estimated the BC content in snow 105 based on a single year simulation with a coupled chemistry component and applied the 106 same BC deposition to simulations of multiple years to estimate BC-snow effects. This 107 method limits the interactions between BC deposition and climate that could influence 108 the BC-induced snow albedo perturbations. Furthermore, snow albedo perturbations from 109 snow aging were ignored, which limits the potential for accelerated snow aging induced 110 by BC-in-snow effect. Lastly, they did not simulate the dust-in-snow effect, which likely 111 had a much greater impact than BC in some regions (e.g., remote mountains) in specific 112 seasons [Painter et al., 2007].

A recent version (v3.5.1) of WRF-Chem, the Weather Research and Forecasting
(WRF) model [Skamarock et al., 2008] coupled with a chemistry component [Grell et al.,

115 2005], was publicly released with the Community Land Model (CLM) v4.0 [Lawrence et 116 al. 2011] as one of the options for land surface model [Jin et al., 2012]. The Snow, Ice, 117 and Aerosol Radiative Model (SNICAR) [Flanner and Zender, 2005] as part of the 118 CLMv4.0 [Flanner et al., 2007, 2009, 2012] provides an opportunity to use the regional 119 climate modeling framework with fully coupled aerosol and snow to further investigate 120 the impacts of LAA in snowpack on regional climate and hydrological cycle. WRF-Chem 121 is a state-of-the-art regional model that has been used extensively to study aerosols and 122 their impacts on air quality and climate [e.g., Grell et al., 2005; Fast et al., 2006, 2009; 123 Gustafson et al., 2007; Gao et al., 2011, 2014; Shrivastava et al., 2011; Chen et al., 2013, 124 2014; Zhao et al., 2010, 2011, 2012, 2013a.c]. SNICAR has a sophisticated 125 representation of snow metamorphism processes. Coupled to CLM within the 126 Community Earth System Model (CESM) [Flanner et al., 2007], SNICAR has been 127 widely used to simulate snow albedo as well as the radiative impact of LAA in snow on 128 climate [e.g., Flanner et al., 2007, 2009, 2012; Qian et al., 2011, 2014].

129 Although SNICAR is released with the CLMv4.0 in WRF-Chem (v3.5.1), it is not 130 connected with the atmospheric aerosol deposition and, therefore, aerosol radiative effect 131 in snowpack does not function. This study couples the WRF-Chem simulated aerosols 132 with SNICAR and makes aerosol radiative effect in snowpack function. The modification 133 of SNICAR by Flanner et al. [2012] is also implemented into the model. The coupled 134 model is used to simulate the BC and dust concentrations and their radiative forcing in 135 snowpack during a previous field campaign that collected seasonal snow on a road trip at 136 46 sites over North China in January-February of 2010 [Huang et al., 2011]. Brown 137 carbon is excluded from the SNICAR simulations in this study because its optical

138 properties are poorly constrained [Flanner et al., 2007 and 2009]. This study represents 139 the first effort on evaluating WRF-Chem for simulating BC and dust in snowpack at a 140 relatively high spatial resolution against the field campaign measurements of BC content 141 in snow, and on estimating the radiative forcing of BC and dust in snow over North 142 China. The rest of the paper is organized as follows. Section 2 and 3 provide detailed 143 description of the WRF-Chem and SNICAR models and the observations used in this 144 study. In Section 4, the simulated spatial and temporal variation of snow and aerosol 145 content in snow are evaluated against measurements and characterized. Then, the 146 radiative forcing of BC and dust in snow over North China are estimated. The findings 147 are concluded in Section 5.

148

#### 149 **2. Model**

In this study, WRF-Chem (v3.5.1), briefly described in Section 2.1, is used to couple the SNICAR model with interactive aerosols as described in Section 2.2 below. Section 2.3 discusses the setup of model simulations. The emissions used in the simulations including anthropogenic and biomass burning emissions and online calculated emissions of mineral dust and sea-salt are described in Section 2.4.

155 **2.1 WRF-Chem** 

In this study, the MOSAIC (Model for Simulating Aerosol Interactions and Chemistry) aerosol model [Zaveri et al., 2008] coupled with the CBM-Z (Carbon Bond Mechanism) photochemical mechanism [Zaveri and Peters, 1999], one of the chemistry options in WRF-Chem, is used and coupled with the SNICAR model. The MOSAIC aerosol scheme uses the sectional approach to represent aerosol size distributions with a

161 number of discrete size bins, either four or eight bins in the current version of WRF-Chem [Fast et al. 2006]. All major aerosol components including sulfate (SO<sub>4</sub><sup>2-</sup>), nitrate 162  $(NO_3)$ , ammonium  $(NH_4^+)$ , black carbon (BC), organic matter (OM), sea salt, and 163 164 mineral dust are simulated in the model. The MOSAIC aerosol scheme includes physical 165 and chemical processes of nucleation, condensation, coagulation, aqueous phase 166 chemistry, and water uptake by aerosols. Dry deposition of aerosol mass and number is 167 simulated following the approach of Binkowski and Shankar [1995], which includes both 168 particle diffusion and gravitational effects. Wet removal of aerosols by grid-resolved 169 stratiform clouds/precipitation includes in-cloud removal (rainout) and below-cloud 170 removal (washout) by impaction and interception, following Easter et al. [2004] and 171 Chapman et al. [2009]. In this study, cloud-ice-borne aerosols are not explicitly treated in 172 the model but the removal of aerosols by the droplet freezing process is considered. 173 Convective transport and wet removal of aerosols by cumulus clouds follow Zhao et al. 174 [2013c].

175 Aerosol optical properties such as extinction, single-scattering albedo (SSA), and 176 asymmetry factor for scattering are computed as a function of wavelength for each model 177 grid box. Aerosols are assumed internally mixed in each bin, i.e., a complex refractive 178 index is calculated by volume averaging for each bin for each chemical constituent of 179 aerosols. The Optical Properties of Aerosols and Clouds (OPAC) dataset [Hess et al. 180 1998] is used for the SW and LW refractive indices of aerosols, except that a constant 181 value of 1.53+0.003i is used for the SW refractive index of dust following Zhao et al. 182 [2010 and 2011]. A detailed description of the computation of aerosol optical properties 183 in WRF-Chem can be found in Fast et al. [2006] and Barnard et al. [2010]. Aerosol radiative feedback is coupled with the Rapid Radiative Transfer Model (RRTMG) [Mlawer et al., 1997; Iacono et al., 2000] for both shortwave (SW) and longwave (LW) radiation as implemented by Zhao et al. [2011]. The optical properties and direct radiative forcing of individual aerosol species in the atmosphere are diagnosed following the methodology described in Zhao et al. [2013a]. Aerosol-cloud interactions were included in the model by Gustafson et al. [2007] for calculating the activation and resuspension between dry aerosols and cloud droplets.

#### 191 **2.2 SNICAR**

192 The Snow, Ice, and Aerosol Radiation model (SNICAR) is a multilayer model 193 that accounts for vertically heterogeneous snow properties and heating and influence of 194 the ground underlying snow [Flanner and Zender, 2005; Flanner et al., 2007, 2009, and 195 2012]. The model uses the theory from Wiscombe and Warren [1980] and the two-196 stream, multilayer radiative approximation of Toon et al. [1989]. SNICAR can well 197 simulate snow surface albedo as well as the radiative absorption within each snow layer. 198 It can also simulate aerosol content and radiative effect in snow, and was first used to 199 study the aerosol heating and snow aging in a global climate model by Flanner et al. 200 [2007]. The SNICAR simulated change of snow albedo for a given BC concentration in 201 snow has been validated with recent laboratory and field measurements [Brandt et al., 202 2011; Hadley and Kirchstetter, 2012]. More detailed description of the SNICAR model 203 can be found in Flanner and Zender [2005] and Flanner et al. [2007; 2012]. In WRF-204 Chem with CLM chosen as the land surface scheme, SNICAR defines radiative layers 205 that match the five thermal layers in CLM that vertically resolve snow thermal processes, 206 densification, and melt-water transport [e.g., Oleson et al., 2010]. Here, we focus on the

207 description of processes associated with modeling aerosols and their optical properties in208 snowpack.

209

## 9 2.2.1 Aerosol deposition and scavenging

210 BC and dust can deposit on/in snow through dry and wet deposition processes as 211 discussed above. In this study, atmospheric aerosol wet deposition is calculated with the 212 prognostic precipitation, thus avoiding inconsistencies associated with prescribed aerosol 213 deposition and meteorology. Following Flanner et al. [2012], BC can mix externally and 214 internally with precipitation hydrometeors while dust can only mix externally with 215 precipitation hydrometeors. BC and dust removed through dry deposition processes 216 (sedimentation and turbulent mix-out), often the dominant sink of large particles near 217 emission sources, are mixed externally with snow grains. Dust removed through wet 218 deposition is also treated as being externally mixed with snow grains. BC removed 219 through below-cloud scavenging, where particles are collected by falling hydrometeors 220 through Brownian motion, electrostatic forces, collision and/or impaction, are also 221 assumed to remain attached to the outside of the hydrometeors rather than becoming 222 internalized. Cloud-borne BC collected by stratiform precipitation is treated as being 223 internally mixed with snow grains. Interstitial and cloud-borne BC removed through 224 convective scavenging processes is assumed to mix externally and internally, 225 respectively, with snow grains. Although determining the mixing state of BC deposited 226 through convective scavenging is uncertain, only a few percent of precipitation falling on 227 snow surfaces comes from convection [Flanner et al., 2007; Section 4.2.1]. Following 228 Flanner et al. [2012], we do not simulate the distribution of aerosol number concentrations within the precipitating hydrometeors, which may influence totalabsorption.

231 In this study, SNICAR in WRF-Chem simulates four tracers of dust and two 232 tracers of BC in snow following Flanner et al. [2012]. The four tracers of dust represent 233 four sizes of dust with diameters of  $0.1 \sim 1 \mu m$ ,  $1 \sim 2.5 \mu m$ ,  $2.5 \sim 5 \mu m$ , and  $5 \sim 10 \mu m$ . All 234 four dust tracers are assumed to mix externally with snow grains. With the MOSAIC 235 aerosol model, WRF-Chem can simulate dust in the atmosphere with four size bins (i.e., 236 0.039-0.156 µm, 0.156-0.625 µm, 0.625-2.5 µm, and 2.5-10.0 µm in dry diameter) or 237 eight size bins (0.039-0.078 µm, 0.078-0.156 µm, 0.156-0.312 µm, 0.312-0.625 µm, 238 0.625-1.25 μm, 1.25-2.5 μm, 2.5-5.0 μm, and 5.0-10.0 μm in dry diameter). Both of them 239 are coupled with the dust tracers in SNICAR. The coupling of dust size distributions 240 between WRF-Chem and SNICAR are summarized in Table 1. Although both four- and 241 eight-bin size representations in MOSAIC are coupled with SNICAR, the analysis 242 presented in this paper focuses on the simulations using the eight-bin size representation 243 because it is more accurate in representing aerosol size distributions [Zhao et al., 2013c]. 244 The two BC tracers in SNICAR represent interstitial and within-ice BC, respectively, in 245 order to account for the light absorption enhancement by snowpack containing BC 246 particles residing within snow grains (will be discussed in Section 2.2.2). Following 247 Flanner et al. [2012], this study fixes two BC tracers in snow with 0.1 µm dry effective 248 radius, although size distributions of BC may influence the BC absorption in snow, which 249 deserves further investigation.

The scavenging of aerosols in snow by melt-water is simulated by SNICAR.CLM accounts for melt-water drainage by adding excess water to the layer beneath when

the liquid content exceeds the layer's holding capacity, defined by snow porosity and irreducible water saturation. SNICAR assumes aerosol inclusion in melt-water is proportional to its mass mixing ratio multiplied by a scavenging factor. Thus the change rate of aerosol mass in each layer *i* is:

256 
$$\frac{dm_i}{dt} = k(q_{i+1}c_{i+1} - q_ic_i) + D$$
(1)

257 where  $m_i$  is the absolute mass of aerosol in layer i, k is the scavenging ratio,  $q_i$  is the mass 258 flux of water out of layer i,  $c_i$  is the mass mixing ratio of aerosol in layer i (aerosol mass 259 divided by liquid and solid water mass), and D is the sum of wet and dry deposition of 260 atmospheric aerosols, added only to the surface layer of snowpack. After deposition, 261 aerosols are mixed instantly and uniformly in the model surface layer, which never 262 exceeds 3-cm thick. In this study, following Flanner et al. [2012], k for interstitial BC 263  $(k_{pho})$  and within-ice BC  $(k_{phi})$  are assumed to be 0.03 and 0.20, respectively, and k for 264 four dust tracers are 0.02, 0.02, 0.01, and 0.01, respectively. These scavenging ratios are 265 highly uncertain and need to be constrained by observations in the future [Flanner et al., 266 2012; Qian et al., 2014], but the values used here are generally reasonable compared to 267 observations in the high latitudes [Doherty et al., 2013]. In addition, as fresh snowfall is 268 added, CLM continuously divides the model surface snow layer and prevents excessive 269 aerosol accumulation. Therefore, the concentrations of each tracer within each snow layer 270 depend on atmospheric deposition rates, new snowfall, ice sublimation, meltwater 271 flushing, and layer combinations and divisions [Flanner et al., 2007 and 2012; Oleson et 272 al., 2010].

#### 273 **2.2.2 Optical properties**

274 Optical properties of BC mixed internally and externally with snow grains are 275 treated separately in SNICAR [Flanner et al., 2012]. In this study, SNICAR accounts for 276 the light absorption by snowpack containing BC particles residing within snow grains, 277 which could significantly increase the solar absorption compared to interstitial BC. The 278 refractive indices of BC from Chang and Charalampopoulos [1990] and the effective 279 radius of 0.1 µm are used for offline calculated Mie parameters for BC (i.e., extinction, 280 SSA, and scattering asymmetry parameters) [Flanner et al., 2007 and 2012]. Building on 281 Chylek et al. [1984], the dynamic effective medium approximation method is applied to 282 derive absorption enhancement ratio over broad size ranges of snow grains and BC 283 expected for snowpack. Then, the mass absorption cross-section of BC internally mixed 284 with snow grains is scaled by the derived enhancement ratio, which is determined as a 285 function of BC and snow effective radius online via a lookup table. Application of the 286 enhancement ratio was justified as a reasonable approach to account for absorption 287 enhancement by BC internally mixed with snow grains [Flanner et al., 2012]. Dust 288 optical properties in snowpack are obtained using the Maxwell-Garnett mixing 289 approximation along with the Mie Theory. Dust in snowpack is assumed to be a blend of 290 SiO<sub>2</sub> (47.6% by volume), limestone (2%), montmorillonite (25%), illite (25%), and 291 hematite (0.4%) with four size bins following the lognormal distribution with a number 292 median radius of 0.414 µm and standard deviation of 2 [Flanner et al., 2009]. Since dust 293 is radiatively active, its co-existence could decrease the absorption by BC in snowpack 294 [Flanner et al., 2009]. Accounting for enhanced absorption by dust mixed internally with 295 snow grains could further decrease BC absorption, but this is not considered in this study 296 following Flanner et al. [2012].

297 SNICAR treats the snow particle as a collection of ice spheres, with effective 298 number median radius of 30-1500 µm. Mie parameters for one visible (0.3-0.7 µm) and 299 four near-infrared (NIR) (0.7-1.0, 1.0-1.2, 1.2-1.5, and 1.5-5.0 µm) wave bands are 300 computed offline for lognormal distributions of this wide size range of snow grains for 301 computational efficiency. For radiative transfer calculations, the snow grains and six 302 aerosol tracers are treated as external mixtures (with absorption enhancements applied to 303 within-ice BC), by summing the extinction optical depths of each component, weighting 304 the individual SSA by optical depths, and weighting the asymmetry parameters by the 305 product of optical depths and SSA [Flanner et al., 2007 and 2012]. A detailed description 306 of the computation of optical properties of snow with aerosols in SNICAR can be found 307 in Flanner et al. [2012].

308 2.3 Numerical experiments

In this study, the WRF-Chem simulation is performed at 36x36 km<sup>2</sup> horizontal 309 310 resolution with 120×90 grid cells (95°E-140°E, 30°N-60°N) (Fig. 1) and 35 vertical 311 layers up to 100 hPa. Although only the results for January-February of 2010 are analyzed, the simulation is conducted from October 1st 2009 to February 25th 2010 to 312 313 allow accumulation of snowpack and aerosols in snowpack. The meteorological initial 314 and lateral boundary conditions are derived from the National Center for Environmental 315 Prediction final analysis (NCEP/FNL) data at 1-degree horizontal resolution and 6-h 316 temporal intervals. The modeled u-component and v-component wind and atmospheric 317 temperature are nudged towards the NCEP/FNL reanalysis data with a nudging time scale 318 of 6 hours [Stauffer and Seaman, 1990]. The MYJ (Mellor-Yamada-Janjic) planetary 319 boundary layer scheme, CLM land surface scheme, Morrison 2-moment microphysics 320 scheme, Kain-Fritsch cumulus scheme, and RRTMG longwave and shortwave radiation 321 schemes are used in this study. The chemical initial and boundary conditions are provided 322 by a quasi-global WRF-Chem simulation for the same time period to include long-range 323 transported chemical species. The quasi-global WRF-Chem simulation is performed at 324 1°x1° horizontal resolution using a quasi-global channel configuration (using periodic 325 boundary conditions in the zonal direction) with 360×130 grid cells (180°W-180°E, 326 60°S-70°N). The quasi-global simulation is configured in a way similar to the regional 327 simulation and also driven by the NCEP/FNL data. More details about the quasi-global 328 WRF-Chem simulation can be found in Zhao et al. [2013c].

329

#### **330 2.4 Emissions**

331 Anthropogenic emissions are obtained from the Asian emission inventory described by Zhang et al. [2009] at 0.5°x0.5° horizontal resolution for 2006 except that 332 333 BC, OM, and sulfate emissions over China are from the China emission inventory for 2010 described by Lu et al. [2011] at a 0.1°x0.1° horizontal spatial resolution and a 334 335 monthly temporal resolution for the simulation period. Biomass burning emissions for the 336 simulation period (October 2009 - February of 2010) are obtained from the Global Fire 337 Emissions Database, Version 3 (GFEDv3) with a monthly temporal resolution and a 0.5°x0.5° horizontal resolution [van der Werf et al., 2010] and vertically distributed 338 339 following the injection heights suggested by Dentener et al. (2006) for the Aerosol 340 InterComparison project (AeroCom). Sea salt and dust emissions follow Zhao et al. 341 [2013c]. Vertical dust fluxes are calculated with the GOCART dust emission scheme 342 [Ginoux et al., 2001], and the emitted dust particles are distributed into the MOSAIC

343 aerosol size bins following a theoretical expression based on the physics of scale-344 invariant fragmentation of brittle materials derived by Kok [2011]. For MOSAIC 8-bin, dust particles are emitted into eight size bins with mass fractions of  $10^{-6}$  %,  $10^{-4}$  %, 345 346 0.02%, 0.2%, 1.5%, 6%, 26%, and 45%, respectively. For MOSAIC 4-bin, dust particles are emitted into four size bins with mass fractions of 10<sup>-4</sup> %, 0.22%, 7.5%, and 71%, 347 348 respectively. WRF-Chem has been widely used to simulate the dust life cycle and 349 climatic impact at a global scale [Zhao et al., 2013a] and regional scales over West Africa 350 [Zhao et al., 2010, 2011], Saudi Arabia [Kalenderski et al., 2013], North America [Zhao 351 et al., 2012], and East Asia [Chen et al., 2013, 2014]. The BC and dust emissions within 352 the model domain are indicated in Figure 1.

353 For the quasi-global WRF-Chem simulation that provides the chemical boundary 354 for the regional simulation, anthropogenic emissions are obtained from the Reanalysis of 355 the (RETRO) chemical inventories TROpospheric composition 356 (http://retro.enes.org/index.shtml) except over East Asia and the United States, where 357 anthropogenic emissions are from the Asian 2006 emission inventory [Zhang et al., 2009] 358 and from the US National Emission Inventory (NEI) 2005 (WRF-Chem user guide from 359 http://ruc.noaa.gov/wrf/WG11/Users guide.pdf), respectively. Emissions of biomass 360 burning aerosols, sea salt, and dust are treated in the same way as described above for the 361 regional simulation.

362

## **363 3. Observation**

364 **3.1 Snow and its BC content dataset** 

365 The primary observational dataset used in this study to evaluate the model 366 simulations of snow and its BC content is from a field campaign described by Huang et al. 367 [2011], where they collected seasonal snow in January/February 2010 on a road trip at 46 368 sites in North China. The sampling locations are shown in Figure 1. At each site, samples 369 were gathered from individual snow pits at several depths to examine snow deposited at 370 different times during the winter. The sampling sites were chosen to be far from local 371 sources of pollution. About 300 snow samples were collected. Processing and initial 372 analyses were carried out at Lanzhou University in China and at three temporary 373 laboratories, using the filtering techniques pioneered by Clarke and Noone [1985] and 374 also used for Arctic snow by Doherty et al. [2010]. Each sample was melted rapidly in a 375 microwave oven and then immediately drawn through a 0.4-µm Nuclepore filter to 376 extract the particulates. The BC masses in snow samples are estimated using the 377 wavelength dependence of the measured absorption from the Integrating Sandwich 378 Sphere (ISSW) spectrophotometer [Grenfell et al., 2011]. The spectrally-resolved total 379 light absorption is divided into BC and non-BC fractions based on the absorption 380 Angstrom exponent of the material on the filter, and by assigning different absorption 381 Angstrom exponents to BC and non-BC light absorbing aerosols [Wang et al., 2013]. The 382 measured BC mass is an equivalent mass assuming a 550 nm BC mass absorption efficiency of 6.3  $m^2 g^{-1}$  [Wang et al., 2013]. This method is not possible to state with 383 384 confidence that any of the light absorption in the snow is due to BC, when the soil and 385 snow particulates in snow samples are the same color, which is particularly likely to happen when the snow is thin and patchy. For the sites (e.g., 41-46) with those snow 386 387 samples, the BC mass concentration in snow is not reported [Wang et al., 2013]. More

388 details about the measurements in the North China campaign can be found in Wang et al. 389 [2013] and Zhang et al. [2013]. For comparison between simulations and observations, 390 model results are sampled at the observation sampling time at each site in January and 391 February of 2010. Although snow samples were gathered at several depths during the 392 campaign, the BC mass concentrations in snow are mainly estimated at the top snow 393 layer. Therefore, the simulated BC mass content in the top snow layer (which never 394 exceeds 3 cm thickness) is compared with the observational values averaged at the top 395 layer (2-5 cm depending on sites) snow samples.

396 **3.2 CMC reanalysis** 

397 The Canadian Meteorological Center (CMC) reanalysis dataset consists of 398 Northern Hemisphere snow depth analysis data processed by the CMC. Snow depth data 399 are obtained from surface synoptic observations, meteorological aviation reports, and 400 special aviation reports that are acquired from the World Meteorological Organization 401 (WMO) information system. The CMC reanalysis dataset includes daily observations from 1998 at a spatial resolution of 24x24 km<sup>2</sup>. Monthly averages of snow depth and 402 403 estimated snow water equivalent (SWE) are provided, where SWE is estimated using a 404 density look-up table. More descriptions and the data can be found from the CMC 405 website (http://nsidc.org/data/nsidc-0447.html).

406

407 **4. Results** 

## 408 **4.1 Snowpack simulations**

409 Before characterizing the distributions of BC and dust in snow, it is necessary to 410 evaluate and understand potential biases of the WRF-Chem simulated snow distributions

411 with available observations or reanalysis over North China. Figure 2 shows the spatial 412 distributions of snow depth and SWE from the CMC reanalysis data and the WRF-Chem 413 simulation averaged for January-February of 2010, with the North China campaign 414 observations of snow depth at specific locations embedded in each panel. In general, the 415 simulation and CMC reanalysis data are consistent with spatial correlation coefficient of 416 0.6, both showing snow depth increases northward and with increasing topography, 417 although the model simulates much larger snow depth near the northern boundary and 418 snow cover extends further south. Although both model and reanalysis data capture 419 reasonably the campaign observed spatial variation of snow depth (Fig. 2), the model 420 overestimates the observed snow depth, while reanalysis underestimates it (Fig. 3). 421 Overall, the reanalysis better captures the observed spatial variability with a correlation 422 coefficient of 0.73 compared to 0.51 for the simulation, but the model matches the 423 observed average snow depth over the 46 observation sites better, as indicated by the 424 mean values of 13.6 cm and 9.7 cm from the simulation and reanalysis, respectively, 425 compared to 13.2 cm from observations. In addition, the spatial distributions of SWE 426 from the CMC reanalysis data and the WRF-Chem simulation averaged for January-427 February of 2010 are also shown in Figure 2. Again, the model results and CMC 428 reanalysis data show consistent spatial distribution of SWE with a correlation coefficient 429 of 0.66. Model simulates a much larger SWE than the CMC reanalysis near the north 430 boundary. The comparison is consistent with that for snow depth.

431 One key factor affecting the snow simulation is surface temperature. Figure 4
432 shows the spatial distribution of 2-m temperature from the observations (colored circle)
433 and the corresponding WRF-Chem simulation over North China in January-February of

434 2010. Daily observations of 2-m temperature in January-February of 2010 at 225 sites in 435 North China are obtained from the Chinese National Meteorological Center (CNMC). 436 The simulation can capture well the observed 2-m temperature with spatial correlation 437 coefficient of 0.95 over the region of interest. The 2-m temperature decreases 438 dramatically from around freezing level to about -30°C with increasing latitude. The 439 simulated 2-m temperature averaged over the observation sites is -13°C, which is 2 °C 440 colder than that from observations, but the caveats in comparing grid mean simulated 441 values with station data should be noted. The model cold bias is particularly noticeable 442 over areas north of 40°N. Another key factor affecting the snow simulation is surface 443 precipitation of snow. However, there is no publicly available observation for evaluation.

#### 444 **4.2** Simulations of BC and dust concentrations in snow

445 4.2.1 BC concentrations in snow

446 Figure 5 shows the spatial distribution of BC mass concentration in the top snow 447 layer from the WRF-Chem simulation over North China in January-February of 2010. 448 The campaign observed BC mass concentrations in the top snow layer (BCS) are also 449 shown as the overlaid colored circles. The model simulates the highest BCS with >5000 ng g<sup>-1</sup> over Northeast China (110°E-130°E and 38°N-48°N), where both BC deposition 450 451 and snow depth are high (Fig. 2 and 6). BCS reduces away from Northeast China and reaches <50 ng g<sup>-1</sup> near the north boundary of the domain. This is consistent with the 452 North China campaign data that show high BCS in heavily industrialized regions and 453 smaller concentrations (30-50 ng  $g^{-1}$ ) farther north in North China (51°N). Figure 6 shows 454 455 the spatial distribution of dry and wet deposition fluxes of BC on snow from the WRF-456 Chem simulation in January-February of 2010. The deposition fluxes are averaged 457 spatially and temporally over only snow-covered surface, representing the deposition on 458 snow. Dry and wet deposition fluxes of BC are more comparable over Central China 459 (105°E-120°E and 30°N-40°N), but dry deposition dominates the total BC deposition in 460 Northeast China, where the highest BCS is found. The reason is that, over the surface that 461 is frequently covered by snow, dry deposition is more efficient than wet deposition that is 462 limited to rainy or snow days (figures not shown). Wet deposition mainly results from 463 resolved stratiform precipitation that accounts for more than 95% of the total 464 precipitation during the study period (figures not shown).

465 BCS are compared more explicitly with observations at each site in Figure 7, 466 following the sequence of each stop in the campaign from left to right on the x-axis. 467 During the campaign, the road trip started from Inner Mongolia (sites 1-15), which is 468 relatively clean compared to Northeast China. Most of the observed BCS over this region are around hundreds of ng  $g^{-1}$ . The cleanest snow (tens of ng  $g^{-1}$ ) was sampled near the 469 north boundary of China (sites 21-24). Polluted snow was sampled in the industrial 470 471 regions of Northeast China (sites 26-40). There was no BCS data available for sites 41-46. 472 The WRF-Chem simulation captures the observed sharp increase of BCS towards more polluted sites, from 30-50 ng g<sup>-1</sup> at 51°N to over thousands of ng g<sup>-1</sup> at 42°N. The model 473 474 generally agrees well with the observations and has negative biases (within a factor of 475 two) in the relatively clean sites (e.g., sites 1-32) with a median model-to-observation 476 ratio of 1.03. It is noteworthy that the simulation exhibits large daily and diurnal variation 477 of BCS as denoted by the box and the whisker bar, respectively, in Figure 7. This large 478 temporal variation of BCS is partly driven by the evolution process of snow and its BC 479 content in the model. When snow starts accumulating on the ground, the BC mass in

480 snow is much less than the snow mass (minimum BCS value). Then, BCS increases with 481 the accumulation of snow due to both dry and wet deposition. When snow starts melting, 482 BCS keeps increasing due to dry deposition till the snow disappears. Nevertheless, we 483 would also like to point out that this large temporal variation of simulated BCS might be 484 sometimes due to the artifact introduced by the discretization of snowpack into layers for 485 numerical solutions. As the top snow layer becoming thinner and thinner, it retains most 486 of its BC but losing its snow water, and therefore results in large BCS values. We 487 therefore caution the comparison of simulated BCS with the measurements that sampled 488 2-5 cm snowpack as the top snow layer.

489 Although the simulated BCS at the sampling time at site 6 significantly 490 overestimates the observed BCS, the simulated mean value of January-February is closer 491 to the observation and has a negative bias. Besides site 6, differences between the 492 simulated values at the snow sampling time and the monthly average exist in many other 493 sites to different degrees. Due to the large temporal variability of seasonal snow and the 494 uncertainty in simulating the exact timing of weather systems and aerosol emissions and 495 deposition, the comparison between long-term averages of observed and simulated BCS 496 is desired. However, the snow sampling at the all sites from this North China campaign 497 was only made at specific times relatively far apart along the road trip. In addition, more 498 comparisons are also conducted using the average of model results sampled within a few 499  $(e.g., \pm 2)$  hours and a few  $(e.g., \pm 2)$  days around the observation sampling time at each 500 site. The comparisons do not change significantly (figures not shown). The large 501 temporal variability of BCS may also indicate the caveats in comparing model simulated 502 monthly mean values with observations from seasonal snow sampling at a specific time, a 503 common practice in global modeling studies [e.g., Huang et al., 2011; Qian et al., 2014]. 504 The relative biases increase at sites 32-40 located within the industrial source regions. 505 The model generally overestimates the BCS in these sites. It is interesting to see from 506 Figure 7b that the model generally has smaller biases in regions outside of the industrial 507 source regions but large positive biases are common near or inside the industrial source 508 regions. It may be partly due to the sampling strategy that sites were chosen to be far 509 from local sources [Huang et al., 2011]. It may be difficult for the model to resolve the 510 sub-grid variability, which is typically larger over the source regions with large emissions 511 than relatively clean areas.

512 Model biases in simulating BCS may result from the biases in simulating BC 513 lifecycle in the snow and atmosphere. For example, the biases may be partly due to the 514 uncertainties in treating BC scavenging by snowmelt. As discussed above, the aerosol 515 scavenging ratios in snow are prescribed in this study. These values are highly uncertain, 516 and there are no direct measurements over the study region to constrain these model 517 parameters. On the other hand, the biases may also result from the biases in simulating 518 the atmospheric BC. Since observations of atmospheric BC concentrations are not 519 publicly available in this region, satellite retrieved AOD is used to evaluate the general 520 model performance in simulating aerosols in the atmosphere. The AOD retrieved from 521 the Moderate Resolution Imaging Spectroradiometer (MODIS) instrument [Kaufman et 522 al., 1997] on board the NASA Aqua platforms and the Multi-angle Imaging 523 SpectroRadiometer (MISR) instrument [Diner et al, 1998, 2001; Martonchik et al., 2004] 524 on board the NASA Terra platform are used. The MODIS "Deep Blue" product [Hsu et

al., 2006] that can retrieve AOD over bright surfaces is used. MISR can also retrieveaerosol properties over highly reflective surfaces.

527 Figure 8 shows the spatial distribution of AOD over North China in January-528 February of 2010 from the Terra-MISR and Aqua-MODIS retrievals and the 529 corresponding WRF-Chem simulation. The model results are sampled at the Terra-MISR (~10:45 Local Time) and Aqua-MODIS (~13:30 Local Time) overpass time, 530 531 respectively, at the locations where retrievals are available. In general, MISR and 532 MODIS show consistent spatial patterns of AOD over North China. But the magnitude of 533 MODIS retrieved AOD is higher than that of MISR over land. Part of the difference 534 between the MODIS and MISR retrievals may be due to their different overpass time, as 535 aerosol concentrations may build up from morning to early afternoon. Ge et al. [2010] 536 found that the MISR retrieved AOD has more reasonable agreements with ground-based 537 observations over China compared to the MODIS "Deep-Blue" products. Overall, the 538 model captures well both satellite retrievals, showing high AOD over the industrial 539 regions of Central and Northeast China. The model results are more consistent with the 540 MISR retrievals. The region with high BC deposition fluxes (Fig. 6) also has large AOD. 541 Although satellite AOD can generally evaluate the model performance in simulating 542 aerosols, more explicit measurements are needed to evaluate the simulated BC in the 543 atmosphere. In addition, some biases of simulated BCS may also come from uncertainties 544 of BC deposition rate, particularly for dry deposition rate that dominates the BC 545 deposition over Northeast China where the simulated BCS show relatively large biases. 546 In order to identify the uncertainty sources of BCS, concurrent measurements of 547 atmospheric and snow BC and the deposition fluxes of BC are needed in future campaign.

548 Besides uncertainties in the model, the difference between observations and 549 simulations could also result from uncertainties in the BCS estimates [Wang et al., 2013]. 550 The measured BC mass is an equivalent mass with assumptions of BC optical properties in snowpack, such as assuming a 550 nm BC mass absorption efficiency of 6.3  $m^2 g^{-1}$ 551 552 [Wang et al., 2013]. Therefore, the observations also show large uncertainty ranges (Fig. 553 7). In general, most model results fall into the uncertainty ranges of the observations. 554 Furthermore, the observations at each site are assumed to be representative of the average over a 36x36 km<sup>2</sup> model grid cell, which may not be true in some cases due to the 555 556 inhomogeneous spatial distribution of snow and BCS.

557 4.2.2 Dust concentrations in snow

558 Figure 9 shows the spatial distribution of dust mass concentrations in the top 559 snow layer from the WRF-Chem simulations over North China in January-February of 560 2010. The dust mass concentrations in the top snow layer (DSTS) are highest over 561 Northwest China and Mongolia (90°E-110°E and 40°N-45°N) and Liaoning province, which generally follow the dust source distribution (Fig. 1). DSTS can reach  $\sim 5 \text{ mg g}^{-1}$ 562 563 near the dust source regions, which is comparable to the magnitudes of the observed dust 564 mass concentrations in snow after dust storms in the Upper Colorado River Basin of the 565 United States [Painter et al., 2012]. DSTS gradually reduces with distance away from the dust source regions and reaches  $\sim 10 \ \mu g \ g^{-1}$  over Northeast and Central China and  $\sim 100 \ ng$ 566 g<sup>-1</sup> near the northern boundary of the domain. The spatial distribution of DSTS follows 567 568 the coincidence of dust deposition (Fig. 10) and snow coverage (Fig. 2). Both the MODIS 569 and MISR retrievals show a band of moderate AOD in the northwest of the domain (Fig. 570 8), which is captured by the model. This band of moderate AOD is mainly contributed by

dust (figures not shown) emitted locally from the Gobi Desert or transported eastward
from the Taklimakan Desert to the west [Chen et al., 2014]. The region with high dust
deposition fluxes (Fig. 10) coincides well with this AOD band.

574 Although, there is no direct measurement of DSTS in the North China campaign, 575 the simulated DSTS spatial distribution is consistent with the campaign finding that 576 DSTS was the dominant absorbing aerosol in snow over the grasslands of Northwest 577 China and Mongolia (site 1-15), but is reduced significantly eastward as mentioned by 578 Huang et al. [2011] and Wang et al. [2013]. In addition, the North China campaign also 579 found a significant amount of dust along with BC in snow in Liaoning province (site 40) 580 [Huang et al., 2011; Wang et al., 2013], and DSTS is much higher than BCS near the dust 581 source regions but comparable to, if not lower than, BCS over Northeast China and 582 Central China, where BC emissions dominate. The estimated absorbing aerosol concentrations in snowpack range from 100 to 4300 ng g<sup>-1</sup> BC equivalent in the dust-583 584 dominated regions (e.g., Inner Mongolia), higher than those in the BC-dominated regions (e.g., Northeast China) that ranged from 40 to 1600 ng g<sup>-1</sup> [Huang et al., 2011; Wang et 585 586 al., 2013].

### 587 **4.3 Direct radiative forcing of BC and dust in snow**

The single scattering co-albedo (1-SSA) of BC, dust, and snow grains are calculated offline following the methods described in Section 2.2.2 and shown in Figure 11. BC has the strongest absorption at all the five wavebands compared to dust and snow grains. BC absorption at the five wavebands decreases with increasing size from 0.05  $\mu$ m to 0.5  $\mu$ m (figures not shown). On the contrary, absorption of dust and snow grains increases with increasing size, except for the waveband of 1.5-5.0  $\mu$ m, at which dust 594 absorption is strongest at the smallest size (submicron particles). Dust and snow grains 595 also have larger variation of co-albedo among the five wave bands than BC. Generally, 596 absorption of snow grains increases with increasing wavelength, while that of dust 597 decreases with increasing wavelength except for submicron dust particles. Although dust 598 is much more absorbing than snow grains at wavelengths shorter than 1.0  $\mu$ m, it is 599 noteworthy that dust co-albedo could be smaller than that of snow grains, depending on 600 the snow and dust effective radius and wavelengths. This indicates that dust in snow 601 could increase snow albedo at some specific cases, unlike BC, which always reduces snow albedo. 602

603 Figure 12 shows the absorption enhancement ratio of BC (at 0.1 um effective 604 radius) mixed internally with snow grains, which is also calculated offline (Sect. 2.2.2) at 605 five spectral wavebands as a function of snow grain effective radius. BC absorption is 606 enhanced when BC is mixed internally with snow grains compared to mixed externally, 607 as indicated by the enhancement ratios larger than one, except for the waveband of 1.5-608 5.0  $\mu$ m, at which BC absorption could be reduced when mixed internally with snow 609 grains larger than  $\sim 250 \ \mu m$  effective radius. In general, the BC absorption enhancement 610 effect increases with decreasing wavelength and decreases with increasing snow grain 611 effective radius. In most cases, BC absorption could be enhanced by a factor of 1.5-2 612 dependent on the snow grain effective radius and wavelength.

Figure 13 shows the spatial distributions of direct radiative forcing by BC and dust in the atmosphere and in snowpack from the WRF-Chem simulation over North China in January-February of 2010. The forcing is averaged when snow is present, representing the mean increase in energy absorption by snowpack. It is shown that both

617 BC and dust introduce radiative warming in snow. The warming patterns are consistent 618 with the spatial distributions of BCS and DSTS (Fig. 5 and 9). The warming effect reaches  $\sim 10$  W m<sup>-2</sup> for both BC and dust in snow. Although dust is much less absorbing 619 620 than BC (Fig. 11), it results in similar magnitude of warming in snow as BC due to its 621 much larger mass content in snow than BC. As a reference, the direct radiative forcing of 622 atmospheric BC and dust at the surface is also shown. The patterns of direct radiative 623 forcing of atmospheric BC and dust follow the distributions of their concentrations in the 624 atmosphere (figures not shown). Atmospheric BC and dust reduce radiation reaching the surface and have a cooling effect of  $\sim -10$  W m<sup>-2</sup> near the source regions. The pattern of 625 626 BC warming in snow shows higher magnitude in the south than in the north, while that of 627 BC cooling at the surface is reversed. The cooling pattern at the surface of atmospheric 628 dust roughly coincides with the warming pattern induced by dust in snow. It is interesting 629 to note that BC and dust in snow result in comparable magnitudes of surface radiative 630 forcing as in the atmosphere but with an opposite sign, which may indicate that BC and 631 dust radiative forcing in snow and at the surface could offset each other in winter over 632 some regions of North China, particularly for dust.

633

#### 634 **5. Conclusions**

In this study, the WRF-Chem model is coupled with the SNICAR model to simulate the BC and dust concentrations and their radiative forcing in seasonal snow over North China in January-February of 2010, consistent with a field campaign region and period. This study represents the first effort in evaluating WRF-Chem for simulating seasonal snowpack and its impurities against various observations made over North

640 China. The direct radiative forcing of BC and dust in snow is also estimated for the first 641 time at a relatively high spatial resolution over North China. In general, the model 642 captures well the observed spatial distributions of surface temperature, snow properties, 643 and aerosol contents in snow. The difference between observed and simulated BCS may 644 be partly because the observations at each site are assumed to be representative of the  $36x36 \text{ km}^2$  model grid cell, which may not be true in some cases due to the 645 646 inhomogeneous spatial distribution of snow and BCS. The simulated large daily and 647 diurnal variation of BCS cautions comparison of model simulated mean values with 648 observations from seasonal snow sampling at a specific time adopted in some global 649 modeling studies [e.g., Huang et al., 2011; Qian et al., 2014].

650 The model simulates similar magnitudes of BCS and DSTS induced radiative 651 warming in snow. The magnitudes of radiative warming of BCS and DSTS are 652 comparable to those of the surface radiative cooling due to BC and dust in the 653 atmosphere, which may indicate that BC and dust radiative forcing in snow and at the 654 surface could offset each other in winter over some regions of North China. Our estimated BC forcing (~10 W m<sup>-2</sup>) in snow is larger than the annual mean value (~1-4 W 655 m<sup>-2</sup>) (averaged spatially and temporally over only snow-covered surface) estimated by 656 657 Flanner et al. [2007] for North China. One reason could be that our estimation is for 2010 658 that has more than double the BC emissions in 1998 used in Flanner et al. [2007]. 659 Another reason could be the difference of period for average (two months versus the 660 snow seasons of entire year). It may also be partly due to model differences. Our 661 estimated dust radiative forcing in snow is roughly consistent with that in the Upper Colorado River Basin (tens of W  $m^{-2}$ ) induced by several mg  $g^{-1}$  dust in snow [Skiles et 662

al., 2012]. Our estimated dust radiative forcing per unit dust mass in snow is smaller than
that of Skiles et al. [2012], perhaps partly due to our estimation being for JanuaryFebruary, when the surface insolation is weaker than that of Skiles et al. [2012] for
March-April.

667 There are also many uncertain factors and processes affecting the simulation of 668 aerosols and their radiative forcing in snowpack. Besides aerosol refractive index, shape, 669 and mixing state with other materials discussed in Flanner et al. [2012], aerosol size 670 distribution is also critical, not only in snow but also in the atmosphere. The size 671 distribution is particularly important for dust, since it could significantly affect the dust 672 deposition fluxes [Zhao et al., 2013c] and determine the relative absorption of dust with 673 respect to snow grains. Unlike BC, dust could be less absorbing than snow grains at near-674 infrared wavebands depending on the sizes. In one of our sensitivity simulations with the 675 modal approach to represent dust size distributions as in Zhao et al. [2013c], dust could 676 result in cooling effect in snow in some specific cases. In addition, following Flanner et 677 al. [2012], the size-resolved atmospheric BC is lumped together in snow and assumed a 678 fixed effective radius. More work is needed to resolve the BC size distribution in snow. 679 Furthermore, the atmospheric dust, if mixed internally with other aerosols, can be 680 activated as cloud droplet. However, the effect of particles mixed internally with snow 681 grains is only considered for BC in snowpack. Dust particles are all assumed to mix 682 externally with snow grains. BC amounts in snow grains may also be underestimated. 683 Although this study accounts for the ice nucleation of liquid droplets, which may contain 684 BC through cloud droplet activation, ice nucleation of aerosols for ice- and mixed-phase 685 clouds are not included. Therefore, the deposition of ice-borne aerosols is not considered.

Finally, the inconsistency between the size distributions of deposited dust and that used
for dust optical properties calculation in snowpack may also introduce uncertainties.
Future study should define consistent optical properties for the atmospheric and snow
dust.

690 In this study, although the simulated spatial distributions of BC and dust content 691 in snowpack are generally evaluated with observations, it is still difficult to fully quantify 692 and attribute the model biases in simulating snow impurities, which could result from 693 uncertainties in many model processes, including emissions, deposition processes, and 694 snow melting scavenging. To appropriately represent BC and dust content in snow, the 695 model needs to simulate reasonably well the aerosol lifecycle in snow as discussed by 696 Flanner et al. [2007 and 2012] and Qian et al. [2014]. The parametric uncertainties of the 697 SNICAR model need to be quantified and constrained with observations. Furthermore, 698 the aerosol lifecycle in the atmosphere should also be reasonably well simulated. The 699 model needs to reproduce the atmospheric aerosol concentrations and treat the deposition 700 processes correctly. Although the WRF-Chem simulated AOD is generally consistent 701 with satellite retrievals, no direct measurement of BC or dust in the atmosphere is 702 available for comparison. In addition, there is also no measurement to evaluate the 703 simulated deposition fluxes. In order to fully understand model biases in simulating snow 704 impurities, concurrent measurements of atmospheric and snow aerosols and the 705 deposition fluxes of aerosols are needed in future field campaigns.

Finally, this study only estimates the direct radiative forcing by BC and dust in
snowpack, which results from the enhanced absorption of solar radiation by BC and dust.
It should be noted that BC and dust can indirectly enhance snow absorption by increasing

709 the grain size due to acceleration of grain growth from the direct effect (first indirect 710 effect) and by the earlier exposure of a darker substrate (second indirect effect) [Flanner 711 et al., 2007], which cannot be diagnosed in a single experiment. Further studies are 712 needed to examine BC and dust impact with both direct and indirect effects in snow and 713 hence the impact on climate and hydrological cycle, which can be quantified with 714 numerical experiments by including and excluding aerosols in snow. The WRF-Chem 715 model coupled with SNICAR can also be applied to other regions of the globe to 716 understand the impact of BC and dust in snowpack on the regional climate and water 717 supplies.

718

#### 719 Acknowledgements

720 This research was supported by the Office of Science of the U.S. Department of Energy 721 (DOE) as part of the Regional & Global Climate Modeling (RGCM) program. J. Huang 722 acknowledges support from the National Basic Research Program of China 723 (2012CB955301). H. Wang acknowledges support from the DOE Earth System Modeling 724 program. R. Zhang was supported by the China Scholarship Fund. This study used 725 computing resources from the PNNL Institutional Computing. Pacific Northwest 726 National Laboratory is operated by Battelle Memorial Institute for the DOE under 727 contract DE-AC05-76RL01830. We thank Ari Laaksonen for the editorial help. Insightful 728 comments offered by the two anonymous referees are highly appreciated.

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- 1016

1018

1024 Table 1 Matching of dust size distributions between WRF-Chem and SNICAR. The values
 1025 represent mass fractions of deposited atmospheric dust from WRF-Chem into each size of dust in
 1026 snow in SNICAR.

SNICAR						
	4 bin (diameter in μm)					
			0.1-1	1-2.5	2.5-5	5-10
	4 bin	0.039-0.156	1	0	0	0
		0.156-0.625	1	0	0	0
	(Diameter in µm)	0.625-2.5	0	1	0	0
		2.5-10	0	0	0.5	0.5
	m 8 bin (Diameter in μm)	0.039-0.078	1	0	0	0
WDE Cham		0.078-0.156	1	0	0	0
wkr-Chem		0.156-0.312	1	0	0	0
		0.312-0.625	1	0	0	0
		0.625-1.25	0	1	0	0
		1.25-2.5	0	1	0	0
		2.5-5.0	0	0	1	0
		5.0-10.0	0	0	0	1





1035 46 observation sites in the North China campaign are denoted by pentagrams in black.



Figure 2 Spatial distribution of snow depth (cm) and snow water equivalent (cm) from
the WRF-Chem simulations and CMC reanalysis over North China in January-February
of 2010. Snow depth (cm) from the campaign observations (colored circle) is also shown.







**Figure 3** The campaign observations of snow depth (cm) versus the corresponding WRF-

1058 Chem simulations (black dots) and CMC reanalysis (red dots).





1067 Figure 4 Spatial distribution of 2-m temperature from the observations (colored circle)1068 and the corresponding WRF-Chem simulations over North China in January-February of

- 1069 2010.



Figure 5 Spatial distribution of BC mass concentration in the top snow layer from the
WRF-Chem simulations over North China in January-February of 2010. The campaign
observed BC mass concentrations in the top snow layer (colored circle) are also shown.









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1107 Figure 7 a) BC mass concentrations in the top snow layer from the campaign 1108 observations (black) and the corresponding WRF-Chem simulations (red). The box plot 1109 of observations shows the minimum and maximum possible values from estimates and 1110 the bar within the box shows the most likely value; the whisker bar of model results 1111 shows the 10th and 90th percentiles of simulated hourly values of January-February. The 1112 asterisk represents the 24-h average value for January-February. The box of model results 1113 shows the 10th and 90th percentiles of simulated values at observation sampling hour of 1114 January-February. The bar within the box represents the simulated value at the 1115 observation sampling hour and day. b) Ratio (red circles) of BC mass concentration in the 1116 top snow layer from the model at the observation sampling time and observation along 1117 with latitudes (green line).

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Figure 8 Spatial distribution of AOD over North China in January-February of 2010 from the MISR and Aqua-MODIS retrievals and the corresponding WRF-Chem simulations. The model results are sampled at the MISR (~10:45 Local Time (LT)) and Aqua-MODIS (~13:30 Local Time (LT)) overpass time, respectively, at the locations where retrievals are available.

1127



1134 Figure 9 Spatial distribution of dust mass concentration in the top snow layer from the

1135 WRF-Chem simulations over North China in January-February of 2010.



1146 Figure 10 Spatial distribution of dry and wet deposition fluxes of dust on snow from the

- 1147 WRF-Chem simulations over North China in January-February of 2010.





Figure 11 Single scattering Co-albedo (1-SSA) at the five spectral wavebands of snow grains as a function of effective radius (colored solid lines), BC with an effective radius of 0.1 um (asterisk), and dust with four different sizes (Dust1 (circle), Dust2 (square),

1163 Dust3 (triangle), and Dust4 (diamond)).





Figure 12 Absorption enhancement ratio of BC (0.1 um effective radius) internally
mixed with snow grains at the five spectral wavebands as a function of snow grain
effective radius.



Figure 13 Spatial distribution of BC and dust direct radiative forcing at the surface and in
the snow from the WRF-Chem simulations over North China in January-February of
2010.