

Impact of Antarctic mixed-phase clouds on climate

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Precious little is known about the composition of low-level clouds over the Antarctic Plateau and their effect on climate. In situ measurements at the South Pole using a unique tethered balloon system and ground-based lidar reveal a much higher than anticipated incidence of low-level, mixed-phase clouds (i.e., consisting of supercooled liquid water drops and ice crystals). The high incidence of mixed-phase clouds is currently poorly represented in global climate models (GCMs). As a result, the effects that mixed-phase clouds have on climate predictions are highly uncertain. We modify the National Center for Atmospheric Research (NCAR) Community Earth System Model (CESM) GCM to align with the new observations and evaluate the radiative effects on a continental scale. The net cloud radiative effects (CREs) over Antarctica are increased by $+7.4 \text{ Wm}^{-2}$, and although this is a significant change, a much larger effect occurs when the modified model physics are extended beyond the Antarctic continent. The simulations show significant net CRE over the Southern Ocean storm tracks, where recent measurements also indicate substantial regions of supercooled liquid. These sensitivity tests confirm that Southern Ocean CREs are strongly sensitive to mixed-phase clouds colder than $-20 \text{ }^\circ\text{C}$.

Antarctica | climate | mixed-phase | clouds

Clouds have a major impact on the Earth's radiative budget and climate change (1, 2), yet a dearth of microphysical data have been collected within clouds over the Antarctic Plateau. This lack of microphysical data is associated with challenges deploying and operating instrumentation in the world's harshest, most remote atmospheric environment (3). Clouds have a critical influence on the Antarctic ice sheet's radiation budget and surface mass balance and appear to affect synoptic-scale effects over the Southern Ocean (3–6). Early (1986) airborne lidar measurements of cloud properties over the Antarctic Plateau indicated that the clouds consisted entirely of ice crystals (7). Because supercooled water drops are more likely to freeze as the temperature approaches the homogenous freezing point, about $-37 \text{ }^\circ\text{C}$ in clouds (8), low-level Antarctic clouds, which are the coldest on Earth, have generally been treated as being all ice in numerical models. However, measurements reported in this article show that supercooled water drops can exist in low-level clouds at $-32 \text{ }^\circ\text{C}$.

Model sensitivity simulations demonstrate that uncertainties in the particle phase of Antarctic clouds can have a significant impact on the Antarctic continent, as well as even more far-reaching effects. In the late 1990s, the National Center for Atmospheric Research (NCAR) Community Climate Model version 2 was run with the standard $10\text{-}\mu\text{m}$ water drop clouds and compared with the output when the particles were changed to ice. The results showed that changing from water drops to $10\text{-}\mu\text{m}$ ice crystals produced $1\text{--}2 \text{ }^\circ\text{C}$ temperature increases throughout the Antarctic troposphere (4). The microphysical properties of cloud particles can have a major impact on the Earth's radiation budget (6), and the cloud radiative forcing constitutes the major source of discrepancies between global climate models (GCMs) (9). Bias in the clouds over the Southern Ocean has been correlated with sensitivity to global climate (10).

This article focuses on the microphysical characteristics of clouds observed at the South Pole and their potential impact on Earth's radiation budget. In January–February 2009, a unique tethered balloon system (TBS) with a cloud particle imager (CPI) capable of high-resolution ($2.3 \mu\text{m}$ pixel) digital images of

cloud particles was operated at the South Pole (11). The CPI recorded digital images of particles passing through its viewing area during vertical profiles of low-level clouds. Simultaneous measurements were made with a vertically pointing micropulse lidar (MPL) (12). A strong correlation was found between in situ observations of mixed-phase clouds and MPL backscatter. In contrast, when all-ice clouds were observed, the MPL backscatter was significantly less because of the much smaller ensemble projected area of the ice particles. This strong differential signature motivated us to examine 365 d of continuous MPL measurements, compiling a dataset sorted into 10-min time segments of mixed-phase and all-ice cloud regions. The year-long South Pole results were extrapolated over the entire Antarctic Plateau and compared with simulations, using the NCAR Community Earth System Model (CESM) (13). The model results were analyzed to determine how the percentage of mixed-phase and all-ice clouds affected Earth's radiation budget.

Instrumentation

The instrument package on the TBS deployed at the South Pole included an aspirated CPI; a meteorological package with sensors for temperature, pressure, Global Positioning System position, wind direction, and speed; a cryogenic frost point hygrometer (14); and an ice nuclei filter system (15). CPI images are used to discriminate water drops from ice crystals. Examples of CPI images of water drops and ice crystals are shown in Fig. 1. The TBS was deployed up to altitudes of 700 m above the surface; the surface is about 2,840 m above mean sea level at the South Pole.

Measurements in Mixed-Phase and All-Ice Clouds

As shown in Fig. 1, CPI images clearly delineate water drops and ice particles in the low-level mixed-phase clouds observed over the South Pole at temperatures colder than $-30 \text{ }^\circ\text{C}$. The MPL lidar was operated continuously in a vertically pointing configuration during all TBS flights. Fig. 2A shows an example of level 1

Significance

Polar regions are foci of climate change, because of more-than-expected warming, problematic remote-sensing retrievals, and large uncertainties about cloud effects on radiation budgets. Antarctica is the world's most remote, coldest, and driest location. Until recently, researchers have assumed that low-level clouds over the frozen Antarctic Plateau consist mainly of ice crystals. Now, measurements with a unique tethered balloon system and a ground-based lidar show that nearly 50% of clouds in the austral summer contain supercooled water which has a significant impact on the radiative properties of Antarctic clouds. Modifying a global climate model to relax the freezing below $-20 \text{ }^\circ\text{C}$ results in a strong simulated radiative (cooling) effect, affecting the entire Antarctic Continent and extending out into the Southern Ocean.

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Data deposition: The tethered balloon and lidar data, and the output from model runs have been deposited in the CISEL Research Data Archive, <http://ftp.cgd.ucar.edu/archive/andrew/lawson2015pnas/>.

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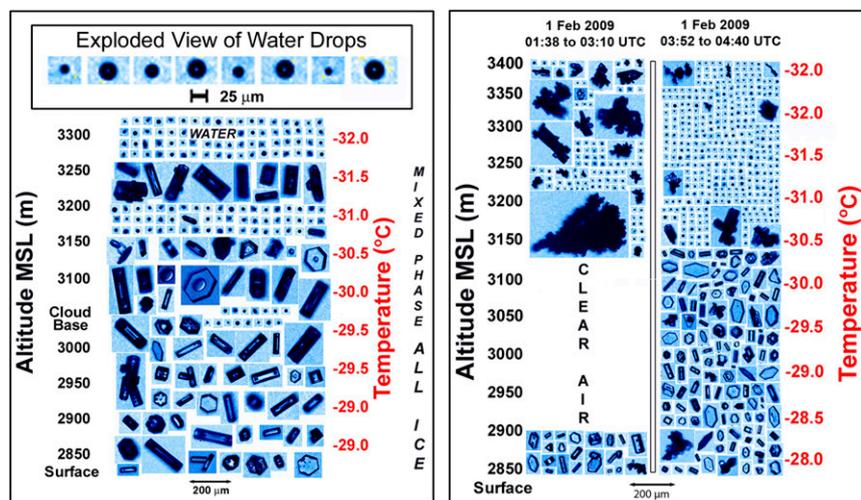


Fig. 1. Examples of CPI images shown as a function of altitude above mean sea level (MSL) in mixed-phase and all-ice clouds (*Left*) from 0214 to 0350 on 26 January 2009, and (*Right*) times shown on 1 February 2009.

backscatter from the MPL on 26 January 2009, when the TBS profiled down through the region of mixed-phase cloud and precipitating ice (Fig. 1). The measurements in Fig. 2A clearly show that MPL backscatter in the layer from about 3.2 to 3.5 km (-31.9 °C to -28.5 °C) is significantly greater than in the all-ice cloud that is precipitating in the region from about 3.15 km down to the surface. Note that the temperatures shown in Fig. 1 are from the TBS and temperatures in Fig. 2 are from the 00Z radiosonde. The backscatter ratio of water drops and ice crystals is directly proportional to the ensemble projected particle area, unless the ice crystals are horizontally oriented or multiple scattering is significant (16, 17). Multiple scattering is not a factor in the optically thin, low-level clouds sampled at close range over the South Pole. Backscatter enhancements from horizontally oriented ice crystals range from 0% to 6% in optically thick mixed-phase clouds and from 0% to 0.5% in cold ice clouds and are negligible for particles <100 μm . On the basis of the sizes and shapes of ice crystals observed in South Pole clouds and the concentration ratio of cloud drops to ice crystals (11, 18), we find that the backscatter contribution from horizontally oriented ice crystals is negligible in mixed-phase clouds over the South Pole.

The much higher backscatter ratio of mixed-phase to ice clouds is further validated in the scatter plot in Fig. 2B, which shows the level 1 MPL backscatter when the TBS was sampling all ice clouds (blue points) and when it sampled mixed-phase clouds (red points). The MPL backscatter measurements when the CPI was imaging ice crystals are clearly less intense than the backscatter intensity from mixed-phase clouds. In fact, there is a clear separation in ice and mixed-phase points at an MPL backscatter intensity level of 4.0. An MPL backscatter level >4.0 is therefore used to identify regions of mixed-phase clouds.

Fig. 2C shows a plot of the relative frequency of all-ice (blue points) and mixed-phase clouds (red points) that occurred for all of 2009, based on the criteria developed from Fig. 2B. In Fig. 2C, all of the 10-min average maximum MPL backscatter measurements in 2009 that correspond to a radiosonde temperature of <-37 °C (the temperature of homogeneous freezing of supercooled water observed in the atmosphere) (19) were used to identify all-ice clouds. It can be seen that only a few of the (blue) MPL backscatter points, all of which are at temperatures <-37 °C (all-ice), exceed the cutoff value of 4.0. The blue data points that exceed a lidar backscatter value >4.0 can generally be attributed to blowing snow, mostly during the austral winter. The red data points in Fig. 2C correspond with MPL values >4.0 , with a corresponding radiosonde temperature ≥ -37 °C. The red data points are classified as mixed-phase cloud, based on the correlation between MPL backscatter and CPI images shown in Fig. 2B.

The data in Fig. 2C are 10-min averages of continuous MPL coverage for all of 2009. These same data are plotted on a

monthly basis in Fig. 2D. The most frequent occurrence of mixed-phase clouds is in the austral summer (December–February). In January and December, the frequency of all-ice and mixed-phase clouds was about equal. Mixed-phase clouds occurred throughout the entire austral winter in 2009, except in the month of August. The surface temperature inversion over the Antarctic Plateau in the winter can be very sharp. Even with surface temperatures 15 °C colder than the homogeneous freezing temperature of water, MPL lidar measurements suggest that elevated mixed-phase clouds can form in the dead of the austral winter.

The frequency of mixed-phase clouds is of interest from a clouds physics standpoint, because unlike the Arctic (20), the Antarctic clouds often occur at temperatures <-30 °C. The high frequency of occurrence of supercooled liquid water at these very cold temperatures is likely a result of the exceptionally clean air over the Antarctic Plateau. Although pure water can be supercooled to -40 °C in the laboratory, it is observed only rarely at temperatures <-30 °C in clouds. The most common observations are in wave clouds over mountain ranges (19, 21) and in deep, vigorous convection (22).

Climate models generally use ice nucleation schemes (23) based on empirical measurements typical of observations in the midlatitudes and tropics (21, 24). The models typically idealize the vapor deposition process as perfectly efficient (for deposition onto a pure ice surface in equilibrium). This implies that ice and liquid in clouds are well mixed down to the diffusion scale. Given subgrid variability in clouds, this is likely not the case in reality at the large (100 km) scale of global climate models. As a consequence of these assumptions, models generally freeze a large fraction of the available supercooled liquid at temperatures <-10 °C. According to the observations presented here, it may be necessary to modify the nucleation and freezing (vapor deposition) schemes in climate models that include the Antarctic Plateau. Because of their similar conditions, the frequent presence of mixed-phase clouds observed at the South Pole can be extrapolated over the entire Antarctic Plateau, which has an average elevation of about 3,000 m and covers about 785,000 square kilometers in the center of the continent. As suggested by climate model runs, clouds over Antarctica can have a strong influence on the earth's radiation budget and can even affect synoptic scale climate in the Southern Ocean and Tropics (3, 4). In the next section, we investigate the effect our observations of mixed-phase clouds may have on the radiation budget of Antarctica and the surrounding area.

Simulations with the NCAR GCM

To compare with the observations, experiments are performed with constrained versions of the atmospheric component of CESM, version 5.2 (23, 25). Perhaps most important for these

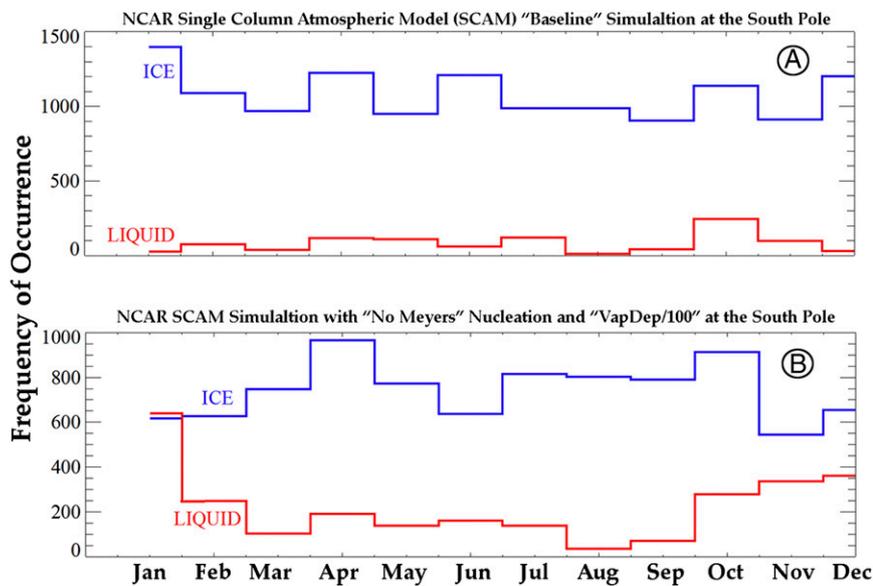


Fig. 3. (A) SCAM “Baseline” simulations at the South Pole occurrence of 20 min (single time step), ice (blue), and liquid (red) clouds by month. (B) As in A, except for the case where mixed-phase ice nucleation is shut off (“NoMeyers”) and vapor deposition is reduced by a factor of 100 (“VapDep/100”).

A detailed analysis of the microphysical process rates in the Baseline simulation indicates that the largest depletion of liquid is occurring because of an overestimate of mixed-phase ice nucleation, based on the Meyers and colleagues (1992) empirical scheme in the model (8), and because of the rapid vapor deposition of liquid onto ice. The rapid conversion is because the cloud microphysical scheme assumes perfect efficiency of the vapor deposition process, which is equivalent to assuming that the ice and liquid in clouds are well mixed to the diffusive scale. However, given turbulence and the small-scale variations of updrafts leading to variations in ice supersaturation, this assumption is probably invalid. To address these two issues, the model is altered by shutting off the mixed-phase ice nucleation scheme (“NoMeyers”) and by reducing the rate of vapor deposition by a factor of 100 (“VapDep/100”), which is an arbitrary amount to nudge the simulation toward the observations. Note that these changes are intended as a sensitivity test, and a more physical treatment of these processes is warranted. The intent is to allow supercooled liquid in the model that is representative of observations at the South Pole. Ice nucleation still occurs by heterogeneous and homogeneous freezing (23). The results of rerunning the model over the South Pole with these modifications are shown in Fig. 3B and in Table 1. This change results in significantly more liquid and a very different annual cycle of liquid clouds (Fig. 3B), which agrees much better with the observations in Fig. 2D.

The quantitative impact of turning off the mixed-phase nucleation scheme (8) and reducing vapor deposition to provide better agreement with the observations increases the amount of liquid in clouds, which in turn affects the top-of-atmosphere (TOA) cloud radiative effect (CRE). CRE is defined as the TOA all-sky flux, minus the clear-sky flux in the absence of clouds. It can be decomposed into shortwave (SW; solar) and longwave

(LW) components. Table 1 illustrates the annual averaged CRE at the South Pole (for all-sky and just cloudy-sky periods) from the Baseline case (Fig. 3A) and the case in which the mixed-phase ice nucleation is shut off (“NoMeyers”). Because the CRE at the South Pole is small to begin with, local radiative perturbations are modest, but as seen in Fig. 3B, there are considerable changes in the relative frequency of occurrence of ice and liquid clouds, with the largest effect coming in the austral summer months of December, January, and February.

The impact of increasing the ratio of supercooled liquid water in the model is to make the clouds optically thicker, which has an effect on CRE. CRE at the South Pole is small compared with at other locations because in the SW, there is very little albedo contrast with the surface, and because low clouds also mean there is little thermal contrast with the surface. In Table 1, the optically thicker clouds increase the SWCRE at TOA substantially, especially with the change in vapor deposition (“VapDep/100” and “NoMeyers + VapDep/100”). The clouds get optically thick enough to change the sign of the TOA LWCRE at the South Pole. Compared with the Baseline, the NoMeyers simulation increases the net TOA CRE when clouds are present at the South Pole from -3.2 Wm^{-2} to -3.9 Wm^{-2} . The reduction of cloud frequency does mitigate the total effect somewhat. Larger effects are seen when vapor deposition is reduced (i.e., VapDep/100): The net cloudy sky effect is increased to -5.1 Wm^{-2} because the clouds get optically thicker. However, the annual average (all sky) effect is small, at -0.26 Wm^{-2} (versus -0.8 Wm^{-2} for the Baseline case).

Although the effects shown in Table 1 are important, the radiative fluxes at the South Pole represent a small region over the high Antarctic Plateau. To explore the effects of these changes beyond just the South Pole, global experiments were conducted with CESM, using fixed sea surface temperature and calendar

Table 1. SCAM simulations at the South Pole, each 1 y long with the same forcing

	SWCRE (Wm^{-2})		LWCRE (Wm^{-2})		Net CRE (Wm^{-2})	
	All sky	Cloudy	All sky	Cloudy	All sky	Cloudy
South Pole average simulation						
Baseline	-0.24	-1.61	-0.50	-1.62	-0.74	-3.23
NoMeyers	-0.38	-2.52	-0.42	-1.37	-0.80	-3.89
VapDep/100	-1.28	-8.41	1.02	3.32	-0.26	-5.09
NoMeyers+VapDep/100	-1.34	-8.78	1.07	3.49	-0.21	-5.39

Simulations are as indicated in the text. Shown are the top of atmosphere SWCRE, the LWCRE, and the net CRE (SW+LW) CRE. All fluxes are in Wm^{-2} and are shown for all sky, and just when clouds are present (cloudy).

Discussion and Conclusion

Tethered balloon in situ observations of near-surface clouds at the South Pole, coupled with closely located lidar backscatter measurements, have shown that mixed-phase clouds (supercooled liquid water coexisting with ice crystals) are more prevalent than is currently represented in global models. Mixed-phase clouds were observed in situ during the austral summer in shallow layers between about -28°C and -32°C . Simultaneous multipulse lidar backscatter measurements showed that water drops in mixed-phase clouds provided a strong backscatter signature not observed from all-ice clouds. Extrapolation of the lidar data to calendar year 2009 showed that water drops were present in near-surface cloud layers during 11 of 12 mo, even above strong temperature inversions, when surface temperatures were as cold as -54°C . To estimate the impact of the new observations of mixed-phase clouds over the South Pole, sensitivity experiments were performed with constrained versions of the atmospheric component of the NCAR CESM.

Perturbations to the model cloud processes to allow supercooled liquid, as observed over the South Pole, were explored. These simple changes to mixed-phase ice nucleation and to the vapor deposition process were designed to maintain more supercooled liquid clouds in the absence of a full implementation of a more comprehensive mixed-phase cloud scheme (34). The modifications to the single-column model had the desired effect at the South Pole and are able to better represent the annual cycle and frequency of liquid clouds. Once the model microphysics

were modified in a sensitivity test to maintain more supercooled liquid, significant radiative effects were seen in the South Pole simulations. The result changes the annual net CRE over Antarctica by $+7.4\text{ Wm}^{-2}$, mostly over Eastern Antarctica, which is enough to change the sign of CRE from cooling to warming. In global simulations, adjustments to the cloud microphysics change liquid and ice partitioning (and CREs) over the Southern Hemisphere storm tracks (in a warmer temperature regime) and confirm results with other models (35) that CREs are very sensitive to the representation of mixed-phase clouds and supercooled liquid. These simple sensitivity experiments will need to be replaced with improved mixed-phase and supercooled liquid parameterizations spanning temperature regimes from the South Pole to the Southern Oceans to better represent this regime in climate models.

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