










Sunlight-driven nitrate loss records Antarctic surface mass balance

Pete D. Akers^{1,2}[✉], Joël Savarino¹[✉], Nicolas Caillon¹, Aymeric P. M. Servettaz³, Emmanuel Le Meur¹, Olivier Magand¹, Jean Martins¹, Cécile Agosta⁴, Peter Crockford^{5,6}, Kanon Kobayashi⁷, Shohei Hattori^{7,8,9}, Mark Curran^{10,11}, Tas van Ommen^{10,11}, Lenneke Jong^{10,11} & Jason L. Roberts^{10,11}

Standard proxies for reconstructing surface mass balance (SMB) in Antarctic ice cores are often inaccurate or coarsely resolved when applied to more complicated environments away from dome summits. Here, we propose an alternative SMB proxy based on photolytic fractionation of nitrogen isotopes in nitrate observed at 114 sites throughout East Antarctica. Applying this proxy approach to nitrate in a shallow core drilled at a moderate SMB site (Aurora Basin North), we reconstruct 700 years of SMB changes that agree well with changes estimated from ice core density and upstream surface topography. For the under-sampled transition zones between dome summits and the coast, we show that this proxy can provide past and present SMB values that reflect the immediate local environment and are derived independently from existing techniques.

¹ Université Grenoble Alpes, CNRS, IRD, Grenoble INP, IGE, Grenoble, France. ² Department of Geography, Trinity College Dublin, Dublin, Ireland. ³ Japan Agency for Marine-Earth Science and Technology, Yokosuka, Japan. ⁴ Laboratoire des Sciences du Climat et de l'Environnement, LSCE-IPSL, CEA-CNRS-UVSQ, Université Paris-Saclay, Gif-sur-Yvette, France. ⁵ Department of Marine Chemistry and Geochemistry, Woods Hole Oceanographic Institution, Woods Hole, MA, USA. ⁶ Department of Earth and Planetary Sciences, Harvard University, Cambridge, MA, USA. ⁷ Department of Chemical Science and Engineering, Tokyo Institute of Technology, Yokohama, Japan. ⁸ International Center for Isotope Effects Research, Nanjing University, Nanjing, China. ⁹ School of Earth Sciences and Engineering, Nanjing University, Nanjing, China. ¹⁰ Australian Antarctic Division, Department of Climate Change, Energy, the Environment and Water, Kingston, TAS, Australia. ¹¹ Australian Antarctic Program Partnership, Institute of Marine and Antarctic Studies, University of Tasmania, Hobart, TAS, Australia. ✉email: pete.akers@tcd.ie; joel.savarino@cnrs.fr

Antarctica holds a critical role in the Earth's hydrosphere, providing long-term storage of 27 million km³ of ice¹ and impacting global ocean and atmosphere circulation through its albedo, topography, export of calved glacial ice, and function as an atmospheric heat sink^{2–5}. Since even small shifts in the surface mass balance (SMB) across Antarctic ice sheets can redistribute huge masses of water between the cryosphere, ocean, and atmosphere, a clear understanding of how its SMB has responded to past climate change is crucial for calibrating forecast models of the global environment and properly interpreting ice cores^{6–10}. Despite this pressing importance, much of Antarctica has insufficient records of both modern and past SMB values, particularly in the transitional zone between the <1000 m elevation wet coastal periphery and the >3000 m elevation ultra-dry dome summits. Although this transitional zone comprises 50% of Antarctica's surface area¹¹, it hosts few long-term scientific stations and is much less targeted for intensive scientific research and deep (>100 m) ice core studies. Because this zone has a highly dynamic SMB system affected by strong wind-driven transport, rugged small scale surface features, and infrequent but high impact precipitation events, our lack of dedicated studies of the transitional zone impedes a comprehensive understanding of past and present SMB changes in Antarctica.

This lack of data is largely a result of logistical challenges with observing the intermediate SMB values in this transitional zone when using existing techniques. Determining modern SMB for new sites typically requires either installing stake transects that need multiple return visits spanning several years or coring several meters of firn to identify the increasingly buried 1992 Pinatubo volcanic horizon with geochemical analysis. However, the limited time and resources during research expeditions to remote areas usually prevents intensive modern SMB surveys with these methods, and, as a result, existing SMB records in the transition zone are largely restricted to a few frequently traveled supply traverse routes¹². This has left vast regions of Antarctica with no ground-verified SMB data.

Although ice cores have been drilled from a few sites in the transitional zone, extracting SMB histories from these cores is often difficult. At interior dome sites, proxy air temperature from water isotopes ($\delta^2\text{H}$ or $\delta^{18}\text{O}$) is used to derive snow accumulation rate through water vapor saturation¹⁰. However, this approach does not account for wind-driven transport and sublimation of surface snow at warmer and lower elevation sites^{13–15}. Additionally, water isotopes reflect many environmental factors other than temperature, such as atmospheric circulation changes, transport pathways, and moisture sources, which can lead to large uncertainty and/or bias in reconstructed SMB^{16,17}. Changes in ice density along the cores may be converted to SMB provided that they are well-dated, but density-based reconstructions become increasingly uncertain with depth due to thinning and deformation of ice layers¹⁸ and may be impossible in zones with heavy ice deformation. Cores are also commonly damaged during the drilling and transportation process, and this can make accurate physical measurements of mass and volume very difficult, particularly for the shallow firn segments. There is thus a strong need for alternative independent proxies that record local SMB for modern climatology studies, paleoclimate reconstructions, and ice sheet modeling while avoiding the problems inherent in existing methods.

Here, we present one such SMB proxy based on photolysis-induced changes in the ¹⁵N/¹⁴N ratio ($\delta^{15}\text{N}$, defined as $\delta = \frac{^{15}\text{N}/^{14}\text{N}_{\text{sample}}}{^{15}\text{N}/^{14}\text{N}_{\text{standard}}} - 1$, relative to the N₂-air standard) of nitrate (NO_3^-) (Fig. 1). Naturally deposited on the Antarctic ice sheet surface as the end product of the atmospheric oxidation of reactive nitrogen^{19–22}, NO_3^- within the Antarctic snowpack can

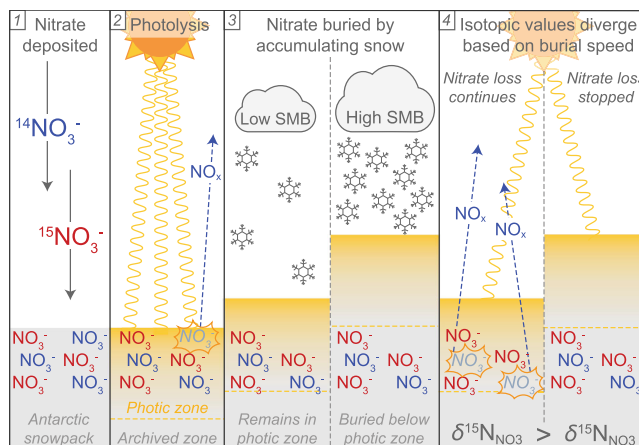


Fig. 1 Schematic diagram of the NO_3^- photolytic process in Antarctica.

After NO_3^- containing either ¹⁴N (blue) or ¹⁵N (red) is deposited on the Antarctic snowpack surface (1), sunlight in the photic zone can trigger photolysis of NO_3^- that favors NO_3^- with a ¹⁴N atom, which leaves the residual NO_3^- enriched in ¹⁵N (2). Because sites with lower surface mass balance will accumulate less snow over a given period of time than high surface mass balance sites (3), the NO_3^- at lower surface mass balance sites will remain in the photic zone longer, experience more photolytic mass loss before burial in the archived zone, and have higher $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values (4).

be photolytically converted to gaseous nitrogen oxides ($\text{NO}_x = \text{NO} + \text{NO}_2$) when exposed to ultraviolet light ($\lambda = 290\text{--}350\text{ nm}$). Because ¹⁴ NO_3^- is more readily photolyzed than ¹⁵ NO_3^- , the $\delta^{15}\text{N}$ of NO_3^- ($\delta^{15}\text{N}_{\text{NO}_3}$) remaining in the snow will increase from its initial depositional value of ≈ -20 to $+20$ ‰ to values as high as $+400$ ‰^{21–28} as the isotopically lighter photolytic NO_x product is ventilated and lost to the atmosphere. Although NO_3^- can also be lost through HNO_3 volatilization, we interpret $\delta^{15}\text{N}_{\text{NO}_3}$ solely through photolysis since volatilization does not strongly fractionate NO_3^- and should be a very minor component of NO_3^- loss outside of the warmest coastal zones^{24,29,30}. Additionally, while the oxygen in NO_3^- also undergoes isotopic fractionation through photolysis, its interpretation is complicated by isotopic interactions with snow and water vapor^{24,25,31} and is not further discussed here.

Photolysis is limited to the depth where light penetrates and initiates photochemical reactions, and so the snowpack can be divided into an uppermost photic zone (generally 10–100 cm in East Antarctica) and a deeper archived zone^{31–35}. Photolysis and the resulting isotopic fractionation of NO_3^- cease once snowfall buries NO_3^- beneath the photic zone, and the $\delta^{15}\text{N}_{\text{NO}_3}$ value of the NO_3^- buried in the archived zone ($\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$) is assumed to be preserved indefinitely in glacial ice^{24,25,31,32}. The final $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ value reflects the sum total of photolysis inducing radiation experienced by NO_3^- during the burial process, which, assuming stable insolation and photic zone depth, is itself determined by the rate at which the NO_3^- is buried and thus inversely related to SMB^{19,25,28,36}. Modeling (Supplementary Discussion 1) and field observations support SMB as the primary driver of spatial variability in $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values. Based on a new simplified theoretical framework (Methods, Supplementary Discussion 1), this relationship can be expressed as:

$$\ln(\delta^{15}\text{N}_{\text{NO}_3\text{arc}} + 1) = \frac{A}{\text{SMB}} + B \quad (1)$$

where the regression coefficients A and B are parameters that subsume constants and linearly co-varying variables associated with photolytic and fractionation processes. The inverse function

of Eq. (1) can then be used as a transfer function to reconstruct SMB from $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values ($\text{SMB}_{\delta^{15}\text{N}}$). Calculated and referenced SMB values are given here with units of $\text{kg m}^{-2} \text{a}^{-1}$, which is equal to mm w.e. a^{-1} .

Results and discussion

SMB $_{\delta^{15}\text{N}}$ relationship and spatial applicability. To obtain parameter estimates for Eq. (1), we sampled NO_3^- in snow and

firn from 92 East Antarctic shallow pits and cores that are reported here. Combined with 43 previously published $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ samples^{23–25,28,31,37}, this constitutes a database of 135 total $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values representing 114 distinct sites across East Antarctica (Fig. 2a). These $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ data were spatially paired with local SMB measurements either observed directly onsite ($\text{SMB}_{\text{ground}}$) or as an output from the Modèle Atmosphérique Régional (MAR) forced by ERA-interim reanalysis data¹³ and adjusted for a dry-site bias ($\text{SMB}_{\text{adjMAR}}$) (Methods, Supplementary

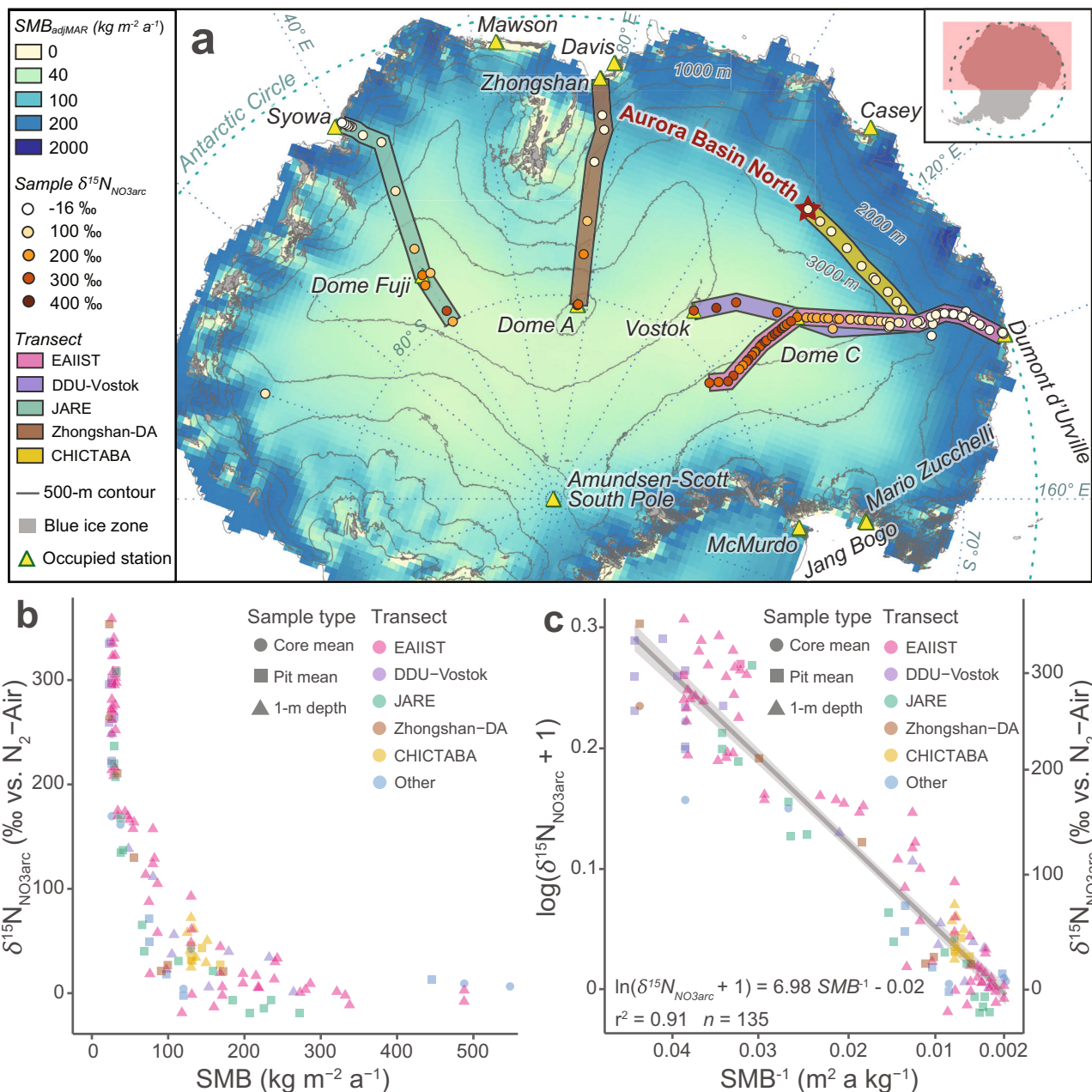


Fig. 2 The relationship between Antarctic snow $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ and surface mass balance (SMB). **a** Map of East Antarctic sites sampled for $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ along different scientific and logistic transect routes. Colored circles indicate the locations and $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values of samples included in our field data set, with $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ data from the EAIIST (pink) and CHICTABA (yellow) transects newly reported here. The base map SMB data were modeled by MAR¹³ and adjusted for dry site bias (see Methods) with elevation contours from REMA¹¹ overlaid. Preservation of NO_3^- is not expected in blue ice zones (gray solid polygons) due to very low or negative SMB and wind scouring⁷⁶. Presently occupied stations in the CONMAP database are shown as labeled triangle icons for spatial reference. **b** Scatter plot of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ vs. SMB for all sites in the field dataset. The color of the points corresponds to the transects where the samples were collected as shown in **a**, and the shape of the points corresponds to the sampling method (i.e., snow core, snow pit, or 1-m depth layer). **c** Scatter plot and linear regression of (1) using all sites in the field dataset. The linear regression (gray solid line) is shown with shaded 95% confidence intervals, and regression parameters are displayed at lower left.

Discussion 2). The sites in our database cover a comprehensive range of East Antarctic SMB, from 20–30 kg m⁻² a⁻¹ at dome summits on the high plateau to >300 kg m⁻² a⁻¹ for sites on the coastal periphery (Fig. 2b).

The SMB and $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ in our field dataset are correlated with a high degree of confidence, producing a linear regression where $\ln(\delta^{15}\text{N}_{\text{NO}_3\text{arc}} + 1) = 6.98 \pm 0.19 \text{ SMB}^{-1} - 0.02 \pm 0.01$ (Fig. 2c, $r^2 = 0.91$, $p \ll 0.001$, $n = 135$). Moreover, this relationship is within modeled expectations that use best estimates for photolytic and isotopic fractionation parameters (Supplementary Fig. 1, Supplementary Discussion 1). Although the linear relationship is strong, the spread in regression residuals leads to a relatively large prediction interval of ± 0.0085 for each reconstructed $\text{SMB}_{\delta^{15}\text{N}}$ value. This imprecision likely results in part because field sampling techniques varied between studies and best sampling procedures (e.g., well-mixed a > 10 cm layer below the photic zone, taking multiple samples per site) may not always have been followed due to logistical challenges and time constraints. Additionally, the resolution of MAR and other regional climate models cannot capture the impact of small surface features on local SMB, and even hyperlocal SMB variability (i.e., the SMB at scales < 1 m) caused by sastrugi and drifts might be missed by nearby stakes or other ground observations of SMB. Assuming that these factors are not biased toward over- or underestimating SMB, we can expect the $\text{SMB}_{\delta^{15}\text{N}}$ regression to provide accurate modeled values despite these prediction intervals. The precision of the regression and its $\text{SMB}_{\delta^{15}\text{N}}$ modeled outputs should also improve in the future with the addition of data from new sites using best sampling protocols and improved regional climate modeling.

Applying the solved regression to SMB values modeled by MAR across East Antarctica reproduces the spatial variability of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ observed in samples (Fig. 3, Supplementary Table 3). We find that 74% of Antarctica has $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values elevated well above the typical range of atmospheric $\delta^{15}\text{N}_{\text{NO}_3}$ (i.e., >20

‰), illustrating the vast spatial impact of photolytic NO_3^- loss. The highest modeled values, excluding some small coastal regions with very low or negative modeled SMBs (e.g., the McMurdo Dry Valleys and blue ice zones) where NO_3^- archiving is not expected, are found on the interior high plateau of East Antarctica between Dome C and Dome Fuji, in agreement with previous global chemical transport models³³. Although millennial-scale changes in global NO_3^- dynamics and atmospheric oxidative capacity are not currently well constrained, the factors parameterized in Eq. (1) (Supplementary Discussion 1) have likely been stable enough during the Holocene for the $\text{SMB}_{\delta^{15}\text{N}}$ proxy's general use. The large changes in atmospheric chemistry, biogeochemical cycles, and global environment earlier in the Pleistocene possibly changed atmospheric NO_3^- isotopic values, snow character, and/or insolation values enough that our $\text{SMB}_{\delta^{15}\text{N}}$ proxy based on modern observations will not accurately reconstruct past SMB values in glacial times. However, $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ changes observed between glacial and interglacial periods in Greenland ice cores have been interpreted to partially record SMB changes³⁸, and thus $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ may still offer important insight into relative changes in SMB and into how NO_3^- dynamics varied during the Pleistocene.

Since the most advanced established technique for NO_3^- isotopic analysis (see Methods) uses ≈ 5 nmol of NO_3^- for $\delta^{15}\text{N}_{\text{NO}_3}$ analysis and ≈ 100 nmol to include oxygen isotope anomaly ($\Delta^{17}\text{O}_{\text{NO}_3}$) analysis, the potential resolution of the $\text{SMB}_{\delta^{15}\text{N}}$ proxy depends upon the NO_3^- concentration of the snow or ice sample and upon the mass of snow or ice comprising each sample. For the samples included in our field database, NO_3^- concentrations ranged between 5 and 131 ng g⁻¹, with lower values at drier sites. To collect 100 nmol of NO_3^- for maximum isotopic data, these concentrations require between 0.05 to 1.15 kg of snow or ice, with a median requirement of 0.15 kg. For snow pits, sampling at a 2 cm depth interval requires only 0.01–0.16 m² surface area collected per sample, and thus the storage and transport logistics for large numbers of samples are more restrictive for snow pits than physical sampling limitations. Ice core sampling resolution is dependent upon the core diameter and percent of core available for NO_3^- recovery. We find that 2–3 samples per ice core meter are typically achievable even when the ice core is only partly partitioned for NO_3^- , and higher resolution is possible with cores that are drilled solely or primarily for NO_3^- isotopic analysis.

While our field dataset covers sites with a SMB from 22 to 548 kg m⁻² a⁻¹, the $\text{SMB}_{\delta^{15}\text{N}}$ proxy is best suited for sites with SMB values between 40 and 200 kg m⁻² a⁻¹. Shallow cores from very dry Dome A and Dome C have lower $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values at 2–6 m below the surface than at the ~ 1 m base of the photic zone, possibly because photolytic NO_x can be transported downward through firm air convection and re-oxidized into NO_3^- with low $\delta^{15}\text{N}_{\text{NO}_3}$ values (Supplementary Discussion 3). This phenomenon violates the foundational assumption of “locked-in” NO_3^- beneath the photic zone, but we observe it only at the ultra-dry interior sites where $\text{SMB} < 40 \text{ kg m}^{-2} \text{ a}^{-1}$. For sites with $\text{SMB} > 200 \text{ kg m}^{-2} \text{ a}^{-1}$, the expected $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ value falls within the general range of atmospheric $\delta^{15}\text{N}_{\text{NO}_3}$ (-20 – $+20$ ‰) because NO_3^- is buried below the photic zone in less than a year. Despite the short photic zone residence time, more than 80% of NO_3^- is deposited during sunnier months outside of winter polar night^{24,39} and some photolytic loss is still likely. As a result, NO_3^- samples that integrate multiple years of accumulation at high SMB sites might still resolve differences in SMB (Supplementary Fig. 3). Additionally, $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values are increasingly less sensitive to SMB changes with higher SMB values due to the asymptotic nature of SMB^{-1} (i.e., the relationship between $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ and SMB is nearly flat where $\text{SMB} > 200 \text{ kg m}^{-2} \text{ a}^{-1}$

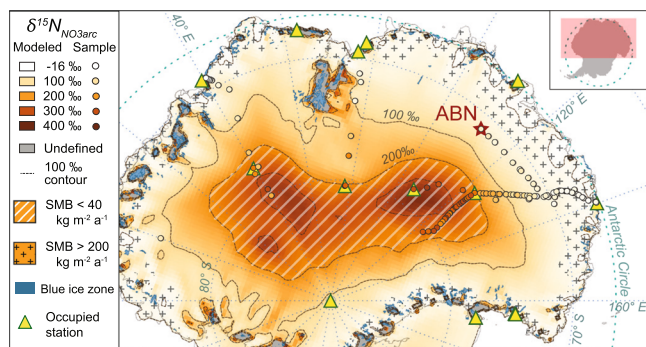


Fig. 3 $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values modeled by (1) across East Antarctica based on surface mass balance (SMB). The spatial variability of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values across East Antarctica are modeled by applying the field data regression of $\ln(\delta^{15}\text{N}_{\text{NO}_3\text{arc}} + 1)$ vs. SMB^{-1} to the 1979–2015 mean SMB output (35 km resolution) from the MAR¹³, adjusted for dry site bias (see Methods). Values of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ are undefined (gray) at some locations near the coast with very low or negative SMBs due to high sublimation and wind scouring. Preservation of NO_3^- is not expected in these locations, which often correspond to blue ice zones (blue polygons, zones with >100 km² extent shown)⁷⁶. Samples of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ from the field database are illustrated by colored circles with the same color gradient as the modeled $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values. Regions with SMB less than or greater than 40–200 kg m⁻² a⁻¹ (i.e., the SMB range targeted by the $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ proxy described here) are illustrated with hatching and crosses, respectively. Presently occupied stations in the CONMAP database are shown as triangle icons for spatial reference, and the Aurora Basin North (ABN) site is indicated with a red star.

as seen in Fig. 2b). Despite these restrictions, over 59 % of Antarctica has a SMB between 40 and 200 kg m⁻² a⁻¹ (Fig. 2a), and additional study of NO₃⁻ dynamics in wet and dry extremes may reveal regional adjustments that allow for further application of this new SMB proxy (Supplementary Discussion 4, Supplementary Fig. 3).

Aurora Basin North SMB reconstruction. As a proof of concept, we applied the SMB_{δ15N} transfer function to δ¹⁵N_{NO3arc} data from the 103 m deep ABN1314-103 ice core. This core was one of three drilled in the Australian Antarctic Program's 2013–2014 summer campaign at Aurora Basin North (ABN; 71.17 °S 111.37 °E, 2679 m above sea level), a site with moderate modern SMB (≈120 kg m⁻² a⁻¹) located midway between coastal Casey Station and the Dome C summit (Fig. 2a). The SMB_{δ15N} history reconstructed from ABN1314-103 covers the period from -47 to 649 years before present (BP, where present = 1950 CE) and has values ranging from 49 to 208 kg m⁻² a⁻¹ (Fig. 4a). Each SMB_{δ15N} value integrates an average of 2.4 years of accumulation (total range: 0.7–4.5 years), and thus any impacts from individual precipitation events or seasonal extremes are attenuated. Overall, the SMB values at this site show fairly large variability (coefficient of variation = 0.21). The mean SMB_{δ15N} in the 20th century (126 ± 26.5 kg m⁻² a⁻¹) is 34% greater than the mean SMB_{δ15N}

before 1900 CE (94 ± 18 kg m⁻² a⁻¹) and nearly 52% greater than the driest century that spans the 1600s CE (83 ± 20 kg m⁻² a⁻¹) (Fig. 4a).

Since δ¹⁵N_{NO3arc} values reflect the snow burial speed of the immediate overlying area, short-term variability in SMB_{δ15N} is likely dominated by small spatial scale factors such as surface roughness (e.g., sastrugi and dune migration)^{40–43} and local weather (e.g., snowfall heterogeneity)^{12,43–45}. However, the SMB_{δ15N} patterns observed over decadal to centennial scales more likely represent changes to the broader regional environment as the local environmental “noise” has less impact when data is aggregated at longer timescales. Finally, it is important to note that the SMB_{δ15N} values reflect the immediate local snow accumulation, and so some short duration events (e.g., atmospheric rivers) with major region-spanning impacts may not be preserved in an individual ice core due to periods of surface erosion and/or mixing⁴⁶. This feature should not, however, be viewed as a drawback of the SMB_{δ15N} proxy. Rather, the SMB_{δ15N} record is accurately reflecting the actual SMB experienced at the core site, which is a critical factor to accurately calculating and interpreting other environmental proxies contained in the ice core, such as biogeochemical fluxes.

Validating the SMB_{δ15N} proxy reconstruction. We verified our new proxy's accuracy by comparing the SMB_{δ15N} values with SMB calculated using the physical density of the ice core and its age-depth relationship (SMB_{density}). Because the measurements for SMB_{density} are typically performed on each individual ice core segment, it generally has a lower potential resolution than SMB_{δ15N} which, in contrast, can have multiple values per core segment. Still, SMB_{density} functions well as an established benchmark for validating newer SMB proxies like SMB_{δ15N}. For each 1-m core segment of ABN1314-103, we calculated a SMB_{density} value by dividing the segment's mass (kg) by both its volume (m³) and the age difference between the top and bottom of the segment (a m⁻¹). The SMB_{δ15N} (aggregated to match the 1-m resolution) and SMB_{density} share very similar mean values (100.8 vs. 98.0 kg m⁻² a⁻¹, respectively) and total SMB ranges (62.0–157.3 vs. 61.7–153.4 kg m⁻² a⁻¹, respectively), and the two SMB reconstructions have a similar pattern of variation with a moderate Pearson correlation ($r = +0.46$, $p < 0.001$, $n = 90$) (Fig. 4b). The correlation increases rapidly when a broader running average is applied to the data, reaching +0.72 with 25 year averaging and +0.82 with 50 year averaging. This agreement in mean value, range, and variability validates our SMB_{δ15N} approach and the potential of δ¹⁵N_{NO3arc} as an accurate proxy for paleoenvironmental change.

Interpreting the ABN1314-103 SMB profile is more complicated than for ice cores drilled at dome summits because the ice sheet at the ABN drilling site is flowing horizontally at a rate of 16.2 m a⁻¹¹⁴⁷. This means that the ice in ABN1314-103 actually accumulated as snow along a continuous 11.5 km transect upstream of the current ABN drilling site, with the oldest and deepest ice originating from the most distant upstream position. Using the horizontal ice flow rate and the ABN1314-103 core's age-depth model, we can estimate the position along the upstream transect where the snow for each depth in the core originally accumulated⁴⁸.

Although overall elevation gain is small along the 11.5 km transect (<15 m), the region has abundant 0.5–1 m undulations in surface topography extending over horizontal extents of 3–10 km¹¹ (Fig. 5a). The MAR's horizontal grid size (35 km) cannot resolve any potential SMB impact from these features, but ground penetrating radar (GPR)⁴⁹ data collected along the upstream transect reveals that these surface slope and curvature changes

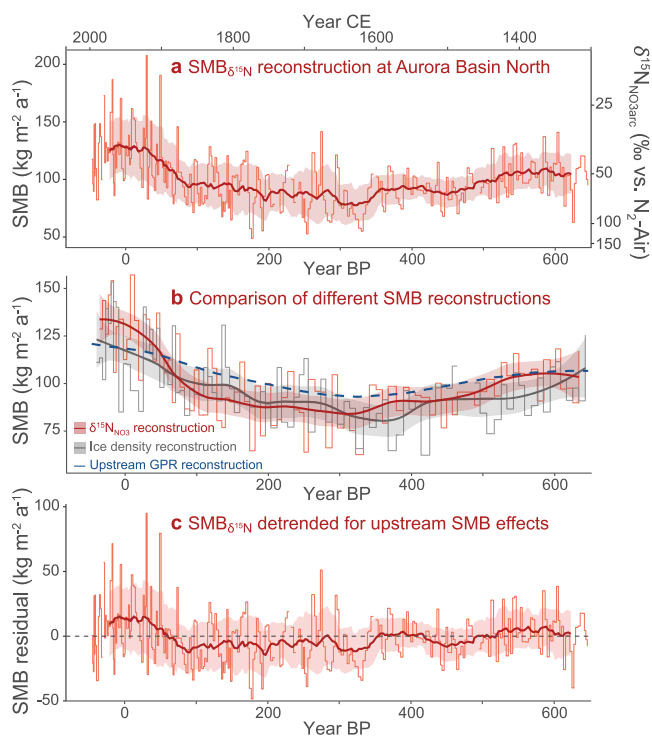


Fig. 4 Reconstructions of surface mass balance (SMB) for an Antarctic ice core from ABN. **a** SMB for Aurora Basin North based on δ¹⁵N_{NO3arc} data from the ABN1314-103 ice core. Reconstructed SMB_{δ15N} values are shown by the red stepped lines with the 50-yr running mean ± 1σ overlaid as a darker thick line and shaded zone. **b** Comparison of SMB values reconstructed from δ¹⁵N_{NO3arc} (red) with those from ice density (gray) and upstream GPR isochron depth⁴⁸. The SMB_{δ15N} and SMB_{GPR} values were aggregated to match the 1-m resolution of the SMB_{density} data. For SMB_{δ15N} and SMB_{density}, smoothed LOESS curves are overlaid to more clearly show long-term patterns. **c** SMB_{δ15N} values after the upstream topographic impact on SMB has been removed, with 50-yr running mean ± 1σ values overlaid. The resulting residuals may better illustrate SMB variability due to climate change.

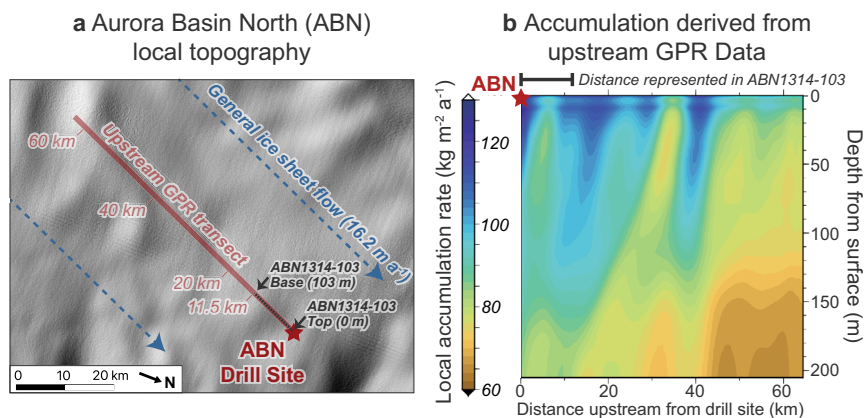


Fig. 5 Topography and accumulation patterns upstream of the Aurora Basin North (ABN) drill site. a Local surface topography of the ice sheet around the ABN ice core drilling site, shown as a hillshade derived from the REMA digital elevation model¹¹ with 100x vertical exaggeration. Ground-penetrating radar measurements were taken along a 60 km transect upstream of the drill site relative to local ice sheet flow, and the ice contained in the ABN1314-103 core corresponds to the first 11.5 km of the transect. **b** Local accumulation rate variability with depth along the upstream ABN transect determined from radar identification of isochronal internal reflective horizons, reflecting past changes in surface mass balance. Regions of relatively higher or lower accumulation preserved with depth likely represent the influence of long-lived surface topographic features. Accumulation rates have an original depth resolution of 0.5 m which is smoothed through a moving age-depth average with a cosine weighting window to reduce isochron artifacts⁴⁹.

correlate with SMB variations of up to $40 \text{ kg m}^{-2} \text{ a}^{-1}$ as determined by internal isochronal radar reflection horizons⁴⁸ (Fig. 5b). These surface features can be identified as buried horizons to depths below the deepest segment of ABN1314-103, which suggests that they have been stable features of the local landscape for at least 700 years.

Because ABN1314-103 is composed of snow that fell along this upstream transect, the ice core SMB record will not only reflect changes due to wetting or drying of the regional climate, but it will also reflect any spatial SMB variability caused by topographic features that existed along the upstream transect. Since the local surface topography has not significantly shifted or changed over the time period covered by ABN1314-103, we take the modern topography-driven SMB changes observed with GPR to be representative of past SMB spatial variability. As each position along the upstream transect is paired to a depth in ABN1314-103, we can transfer the GPR-derived SMB profile along the horizontal transect to ice core depths to produce a SMB reconstruction (SMB_{GPR}) that can be directly compared to the $\text{SMB}_{\text{density}}$ and $\text{SMB}_{\delta^{15}\text{N}}$ reconstructions.

The SMB_{GPR} reconstruction for ABN1314-103 (Fig. 4b) represents the component of the SMB record preserved in the ice core that can be explained by upstream surface topography alone. We find that the general pattern of variability in SMB_{GPR} correlates very well with the patterns recorded in the $\text{SMB}_{\delta^{15}\text{N}}$ ($r = +0.74$) and $\text{SMB}_{\text{density}}$ ($r = +0.63$) records (Fig. 4b). Thus, it appears that the primary SMB pattern preserved in ABN1314-103 is driven by upstream changes in surface curvature, which is important for properly interpreting other environmental proxies contained in the ice and for understanding the local ice flow history.

Extracting a climate-driven SMB record. To examine whether a secondary signal related to climate change was also preserved by the $\delta^{15}\text{N}_{\text{NO}_3\text{ARC}}$, we removed the spatial impact of upstream topography by subtracting the SMB_{GPR} data from the $\text{SMB}_{\delta^{15}\text{N}}$ record. After this “upstream effect detrending” and accounting for a small consistent offset in mean SMB values ($3.7 \text{ kg m}^{-2} \text{ a}^{-1}$) between SMB_{GPR} and $\text{SMB}_{\delta^{15}\text{N}}$, we find that the multi-decadal SMB values have been generally stable over the past 700 years (Fig. 4c), with 50-yr running averages of the SMB always within $15 \text{ kg m}^{-2} \text{ a}^{-1}$ from the mean of the detrended data. These

running averages suggest that drier conditions existed at ABN between 60 and 350 yr BP (1600 and 1890 CE, partially corresponding to the Little Ice Age) and that precipitation has increased in the most recent 100–150 years. This is generally consistent with what has been observed at other East Antarctic sites^{50–53} and for Antarctica as a whole¹⁸, but we recognize that this pattern is similar to the upstream topographic effect and that it might also arise if the SMB_{GPR} record is excessively smoothed relative to true topographic-driven SMB variability (perhaps by the GPR data processing).

On shorter timescales, SMB values frequently change by $\approx 50 \text{ kg m}^{-2} \text{ a}^{-1}$ around a common mean within 10–20 year periods. This pattern likely reflects the high interannual snowfall variability expected at sites like ABN¹⁴. Located at the transition between the coast and the interior East Antarctic Plateau, annual snow accumulation at ABN is sensitive to frequent intrusions of extreme precipitation events and atmospheric rivers^{44,45}, and the observed sub-decadal $\text{SMB}_{\delta^{15}\text{N}}$ variability may represent the frequency of their stochastic occurrence at the site. Additionally, small scale surface roughness features like sastrugi may affect hyperlocal SMB through periods of enhanced accumulation and erosion as they migrate and evolve on the snow surface^{40–42,54}. While the temporal evolution and possible life cycle cyclicity of surface roughness features are as yet poorly known, hyperlocal changes in SMB could also explain some of the short-term SMB variability observed in the ABN record if the sampling interval is shorter than the average duration of a surface feature at a given location.

Applied use and potential of the $\text{SMB}_{\delta^{15}\text{N}}$ proxy. With over 8 million km^2 of Antarctica having a SMB between 40 and $200 \text{ kg m}^{-2} \text{ a}^{-1}$ ¹³ and over 70% of the ice sheet area modeled to have $\delta^{15}\text{N}_{\text{NO}_3}$ values markedly elevated by photolysis, the $\text{SMB}_{\delta^{15}\text{N}}$ proxy holds great potential for expanding our knowledge of Antarctic SMB variability over time and space and serving as an independent supplemental SMB reconstruction. Currently, regions with moderate SMB have only a handful of sites with SMB records older than 200 years, with the East Antarctic Plateau particularly poorly represented¹⁸. For ice coring projects in these regions, the $\text{SMB}_{\delta^{15}\text{N}}$ proxy can perform better at capturing the local effects of strong winds, irregular surface topography, and high interannual snowfall variability than water isotopic

techniques while avoiding problems with layer thinning, density modeling, and core damage that affect density-based methods. As regional climate models still struggle to accurately simulate drifting snow and sublimation fluxes in the coast-to-plateau transition¹³, SMB_{δ15N} can provide critical ground-based data for models predicting future contributions to sea level rise. The SMB_{δ15N} proxy also holds particular value for helping to constrain and validate models of upstream flow effects in research targeting ice streams and broad-scale glacial flow patterns. The SMB_{δ15N} approach may also be useful to estimate relative SMB changes for ice cores that lack robust age-depth models due to severe glacial deformation or discontinuities.

Additionally, sampling for the SMB_{δ15N} proxy can save valuable time and cost compared to existing alternatives to expand current records of modern SMB. Obtaining new ground-based SMB measurements using existing techniques for sites without annually resolved layers requires either coring several meters to the increasingly buried Pinatubo volcanic horizon or repeated visits to newly installed stake transects. However, limited time and resources for research expeditions to remote areas precludes intensive SMB surveys with these methods. With the SMB_{δ15N} proxy, a mean site SMB could be determined with only a series of shallow snow or firn samples extending deep enough into the archived zone to cover only a few seasonal cycles (much shallower than the Pinatubo horizon). After mixing snow well from multiple samples, only 15–75 g (0.3–1.5 kg if Δ¹⁷O_{NO3} results are desired) would need to be kept, transported, and analyzed for each sample, which logistically allows for the rapid collection of robust SMB site means in many locations. On-site melting and NO₃⁻ concentration could further reduce logistical requirements.

The SMB_{δ15N} proxy promises to grow and adapt as studies on Antarctic NO₃⁻ dynamics continue. More NO₃⁻ samples coupled with quality environmental context data from East Antarctica will help us better constrain the uncertainty of SMB_{δ15N} calculations and allow for more confidence in reconstructions. As additional ice cores are analyzed for δ¹⁵N_{NO3arc}, we can better understand under which exact conditions δ¹⁵N_{NO3arc} most accurately records SMB variability and if we can improve our reconstructions with a more complex model. Differences between calculated SMB_{δ15N} values and well-constrained SMB_{density} values may also prove useful in identifying periods of unusual environmental conditions that alter typical photolytic reactivity.

Because the resolution of δ¹⁵N_{NO3arc} sampling is limited only by the minimum amount of NO₃⁻ needed for analysis, very finely-resolved δ¹⁵N_{NO3arc} records can be obtained by increasing the mass of ice collected per depth unit (e.g., by specifically drilling whole cores or replicate cores for NO₃⁻ isotopes) and with advances in NO₃⁻ isotopic analysis expected in the near future⁵⁵. This may allow for more precise multi-annual aggregations for SMB_{δ15N} reconstructions and permit a deeper examination of subannual NO₃⁻ dynamics that can improve the proxy. Given the potential of the SMB_{δ15N} proxy to advance our understanding of the Antarctic environment and its sensitivity to climate change, we strongly recommend that potential ice coring projects incorporate NO₃⁻ analyses into their planning and urge continued studies on Antarctic NO₃⁻ dynamics.

Methods

Mathematical framework for δ¹⁵N_{NO3arc} and SMB relationships. A linear relationship between δ¹⁵N_{NO3arc} and the reciprocal of surface mass balance (SMB⁻¹) has been previously observed and reported in Antarctica^{19,28,36}. Here, we mathematically illustrate how this relationship between δ¹⁵N_{NO3arc} and SMB arises through photolysis of NO₃⁻. We focus solely on the characteristics of NO₃⁻ contained within a given horizontal plane of snow that is located at the snowpack surface at t = 0. We assume simplified conditions with a constant surface mass balance (SMB), clear sky conditions, no surface roughness, and no significant compaction with burial in the

photic zone. Any NO₃⁻ that is photolyzed is immediately and permanently removed from the plane of snow, and NO₃⁻ recycling^{31,36} is assumed not to affect NO₃⁻ in the plane of snow during the burial process modeled here (i.e., after t = 0).

Defining the relationship between δ¹⁵N_{NO3arc} and SMB. The time that it takes for a given horizontal plane of snow to be buried from the surface to a particular depth z is determined by the SMB (kg m⁻² a⁻¹, converted to an equivalent vertical velocity in cm s⁻¹):

$$t_{(z)} = \frac{z}{SMB} \tag{2}$$

The concentration of NO₃⁻ within a plane of snow decays through time according to:

$$\frac{d[NO_3^-]}{dt} = -J_{(z)}[NO_3^-]_{(t)} \tag{3}$$

where J_(z) is the photolytic rate constant at a given depth defined as:

$$J_{(z)} = \sigma\phi I_{(z)} \tag{4}$$

where σ is the absorption cross section for NO₃⁻ photolysis (cm²), φ is the quantum yield for NO₃⁻ photolysis (molec photon⁻¹), and I_(z) is the actinic flux of ultraviolet irradiance (photon cm⁻² s⁻¹ nm⁻¹) integrated over wavelengths that can induce photolysis of NO₃⁻. However, this photolytic rate “constant” changes with depth because actinic flux exponentially decays with depth as:

$$I_{(z)} = I_0 e^{-\frac{z}{z_c}} \tag{5}$$

where I₀ is the initial actinic flux that strikes the snow surface and z_c is the e-folding depth (cm) of the snowpack. Note that non-exponential decay of I in the top ~2 cm of snowpack³² is simplified here by assuming the decay to be exponential from the snow surface. Equation (3) can then be expressed as:

$$\frac{d[NO_3^-]}{dt} = -\sigma\phi I_0 e^{-\frac{z}{z_c}} [NO_3^-]_{(t)} \tag{6}$$

Through Eq. (2), we can rewrite Eq. (6) as:

$$\frac{d[NO_3^-]}{dt} = -\sigma\phi I_0 e^{-\frac{SMBt}{z_c}} [NO_3^-]_{(t)} \tag{7}$$

In order to determine the NO₃⁻ concentration at a given depth, we use the relationship between depth and time (z = SMB × t) to derive:

$$\frac{d[NO_3^-]}{[NO_3^-]_{(t)}} = -\sigma\phi I_0 e^{-\frac{SMBt}{z_c}} dt \tag{8}$$

And integrate to produce:

$$\ln[NO_3^-]_{(t)} = \frac{\sigma\phi I_0 z_c e^{-\frac{SMBt}{z_c}}}{SMB} + C \tag{9}$$

Which simplifies to:

$$[NO_3^-]_{(t)} = e^C e^{\frac{\sigma\phi I_0 z_c e^{-\frac{SMBt}{z_c}}}{SMB}} \tag{10}$$

At t = 0, [NO₃⁻]₍₀₎ = [NO₃⁻]₀ and therefore:

$$e^C = [NO_3^-]_0 e^{\frac{\sigma\phi I_0 z_c}{SMB}} \tag{11}$$

And thus combining Eqs. (10) and (11):

$$[NO_3^-]_{(t)} = [NO_3^-]_0 e^{-\frac{\sigma\phi I_0 z_c}{SMB}} e^{\frac{\sigma\phi I_0 z_c e^{-\frac{SMBt}{z_c}}}{SMB}} = [NO_3^-]_0 e^{\frac{\sigma\phi I_0 z_c (e^{-\frac{SMBt}{z_c}} - 1)}{SMB}} \tag{12}$$

According to Eq. (12), as time (i.e., burial depth) increases, the NO₃⁻ concentration will decrease. However, the rate of decrease will lessen over time as the value of SMB × t approaches 3z_c and 95% of the initial irradiance is gone. Here, below the photic zone (i.e., z > 3z_c), the NO₃⁻ concentration is largely stable and equal to e^C.

Therefore, we can calculate the fraction of NO₃⁻ archived below the photic zone (f_{NO3arc}) as:

$$f_{NO3arc} = \frac{e^C}{[NO_3^-]_0} = \frac{[NO_3^-]_0 e^{\frac{\sigma\phi I_0 z_c}{SMB}}}{[NO_3^-]_0} = e^{\frac{\sigma\phi I_0 z_c}{SMB}} \tag{13}$$

To determine the δ¹⁵N_{NO3arc} of this NO₃⁻, Rayleigh fractionation states that δ¹⁵N_{NO3} can be calculated with the fractionation factor a by:

$$\ln(\delta^{15}N_{NO3arc} + 1) = (a - 1) \ln(f_{NO3arc}) + \ln(\delta^{15}N_{NO3_0} + 1) \tag{14}$$

Through our prior calculation of f_{NO3arc} in Eq. (13), we thus produce:

$$\ln(\delta^{15}N_{NO3arc} + 1) = (a - 1) \frac{\sigma\phi I_0 z_c}{SMB} + \ln(\delta^{15}N_{NO3_0} + 1) \tag{15}$$

Because (a - 1) is negative for nitrogen during photolysis of NO₃⁻^{23,24,33,56–58} and the other parameters are positive, this means that δ¹⁵N_{NO3arc} will vary linearly and positively with SMB⁻¹ when other parameters are held constant or scale linearly with SMB⁻¹. We examine the potential impacts of variability in these other parameters more thoroughly in Supplementary Discussion 1.

Based on modeling and field observations, SMB is the primary driver of change in $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values. Thus, the non-SMB variables can be subsumed into two parameters A and B to function as linear regression coefficients, producing Eq. (16) of the main text:

$$\ln(\delta^{15}\text{N}_{\text{NO}_3\text{arc}} + 1) = \frac{A}{\text{SMB}} + B \quad (16)$$

The inverse function of Eq. (16) can be used as a transfer function to calculate SMB based on a $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ value:

$$\frac{1}{\text{SMB}} = \frac{\ln(\delta^{15}\text{N}_{\text{NO}_3\text{arc}} + 1) - B}{A} \quad (17)$$

Finally, since $\ln(x + 1) \approx x$ when $x \approx 0$, a simpler relationship of Eq. (15) can be approximated, in a form similar to that previously reported from field observations^{25,28,36}:

$$\delta^{15}\text{N}_{\text{NO}_3\text{arc}} = (a - 1) \frac{-\sigma\phi I_o z_e}{\text{SMB}} + \delta^{15}\text{N}_{\text{NO}_3_0} \quad (18)$$

Snow sampling techniques. The $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values in our database are taken from a mix of previously reported values from Antarctic research traverses and values newly reported here (Fig. 2). For all values, snow and ice containing NO_3^- was sampled in the field in one of three techniques: 1) 1–2 m deep snow pit with continuous sampling at regular intervals from top to bottom, 2) single sample taken of a well-mixed 5–10 cm layer around the 1-m depth layer, and 3) drilled core later cut at desired intervals. For isotopic measurement of NO_3^- that included $\Delta^{17}\text{O}_{\text{NO}_3}$ analysis, 0.3–1.5 kg of snow or ice per sample were gathered to ensure a sufficient amount of NO_3^- . Generally, the multiple samples produced by the snow pit technique offered the best and most flexible results, but the 1-m depth layer technique was valuable for quick sampling during limited stops, and cores are necessary to collect samples deeper than ≈ 5 m.

Laboratory analyses. For $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ results included in our database that have been previously reported, readers are directed to the original papers for specific analytical and sampling techniques. For the $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ data newly reported here, snow and ice samples were collected into clean sealed plastic bags or tubs and stored frozen until melted at room temperature for analysis. The NO_3^- mass fraction ($\omega(\text{NO}_3^-)$) was determined on aliquots by either a colorimetric method or ion chromatography with detection limits $<0.5 \text{ ng g}^{-1}$ and precision of $<3\%$ ^{23,24}. The remaining melted samples were passed through an anionic exchange resin (Bio-Rad™ AG 1-X8, chloride form), and the resulting trapped NO_3^- was eluted with 10 ml of NaCl 1 M solution.

Isotopic analysis occurred at IGE-CNRS, Grenoble, France, where NO_3^- in these samples was converted to N_2O with the denitrifying bacteria *Pseudomonas aureofaciens* (lacking nitrous oxide reductase), thermally decomposed into O_2 and N_2 on a 900 °C gold surface, and separated by gas chromatography with a GasBench II™. Oxygen and nitrogen isotopic ratios were then measured on a Thermo Finnigan™ MAT 253 mass spectrometer^{59–62}. Isotopic effects from this analysis were corrected^{23,60}, using the international reference materials USGS 32, USGS 34, and USGS 35 with ultrapure Dome C water used for standards and samples throughout the analyses to account for potential oxygen isotopic exchanges. Results are reported relative to Vienna Standard Mean Ocean Water (V-SMOW) for oxygen isotopes⁶³ and N_2 -Air for nitrogen isotopes⁶⁴.

For snow pits with multiple sequential $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values, a single $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ value was calculated as the aggregate of samples 30+ cm deep, weighted by the relative mass of NO_3^- per sample. Although the photic zone boundary can extend lower than 30 cm at some sites^{31,32}, this cutoff was deemed an acceptable compromise to include more data from pits that stopped at 50 cm depth as the great majority of photolysis will have occurred within the top 30 cm due to exponential decay of actinic flux and $\omega(\text{NO}_3^-)$ with depth. Exceptions to this were made for three coastal pits from Cap Prud'homme (weighted-means of 3+ cm samples), where high accumulation greatly reduces photolytic impact, higher snow impurities reduce the photic zone depth, and a broader aggregation is necessary to smooth seasonal cycles. Additionally, two pits from Dronning Maud Land were aggregated with 15+ cm samples based on shallow $3z_e$ values (2–5 cm) calculated on site during snow pit sampling³¹. For cores included in our database, a single $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ value to be considered representative of the site was calculated as the isotopic mean of samples extending from present back to no earlier than 1800 CE.

Noro et al. (2018) reported $\delta^{15}\text{N}_{\text{NO}_3}$ values for 16 pits along the JARE54 and JARE57 transects²⁸, but the sampling methodology for these pits took a single well-mixed sample of the entire pit depth which included the entire photic zone. In order to estimate the $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values of these sites (i.e., the value as if the photic zone snow had been excluded), we applied a correction factor calculated using data from other pits in our database that were taken on two similar transects spanning from the coast to other interior domes (Dome A and Dome C) of East Antarctica^{24,25}. Because each of the pits on the Dome A and Dome C transects were continuously sampled at discrete intervals from the surface to a point below the photic zone, we calculated different weighted-mean $\delta^{15}\text{N}_{\text{NO}_3}$ values for selected depth spans that matched the three extents of the JARE pits: 0–30 cm, 0–50 cm, and 0–80 cm. Corrective factors were calculated through the linear regression of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ vs. $\delta^{15}\text{N}_{\text{NO}_3,X}$ from Dome A/Dome C transect pits (where $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ is our database's $\delta^{15}\text{N}_{\text{NO}_3}$ value from the archived zone and $\delta^{15}\text{N}_{\text{NO}_3,X}$ is the

weighted-mean value of samples from the surface to depth x : 30, 50, or 80 cm) and applied to the JARE pit data through the appropriate depth correction (Supplementary Tables 4, 5). Corrections were not made for JARE samples where $\delta^{15}\text{N}_{\text{NO}_3} < 0\text{‰}$, as these low $\delta^{15}\text{N}_{\text{NO}_3}$ values strongly suggest that photolysis was not a significant factor at these coastal sites, and photic zone corrections were thus not warranted.

SMB data. In our database, 74 $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ samples are represented by 51 unique direct ground measurements of SMB ($\text{SMB}_{\text{ground}}$) values observed at or near the NO_3^- sampling site, with the numerical discrepancy due to some sites having replicate $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ samples. These previously reported $\text{SMB}_{\text{ground}}$ values were determined by measuring the change in surface height on established stakes or poles, by measuring the mass between known volcanic or radioactivity horizons in an ice core, or by GPR identification of dated horizons^{10,12,24,25,65–71}.

Regional climate models can be used to estimate modern SMB rates for sites lacking ground observations^{7,13}, and we used the Modèle Atmosphérique Régional (MAR) version 3.6.4 with European Centre for Medium-Range Weather Forecasts “Interim” re-analysis data (ERA-interim) data as applied by Agosta et al. (2019) to model mean annual SMB at all database sites for the period 1979–2017¹³. Because the MAR overestimates SMB at high elevation (>3000 m) interior sites of the East Antarctic plateau⁷², we calculated a correction factor through linear regressions of $\text{SMB}_{\text{ground}}$ vs. MAR-estimated SMB (SMB_{MAR}) for our 51 sites that have both values (Supplementary Table 6, Supplementary Fig. 4). This correction was applied to all original MAR estimates to produce “adjusted-MAR” SMB ($\text{SMB}_{\text{adjMAR}}$) that match more closely with ground observations.

These sites were then split into two overlapping subsets of roughly equal count ($\text{SMB}_{\text{MAR}} < 175 \text{ kg m}^{-2} \text{ a}^{-1}$ and $\text{SMB}_{\text{MAR}} \geq 175 \text{ kg m}^{-2} \text{ a}^{-1}$), and a linear regression was calculated for each subset of sites. This regression for sites where $\text{SMB}_{\text{MAR}} < 175 \text{ kg m}^{-2} \text{ a}^{-1}$ is tightly constrained ($\text{SMB}_{\text{ground}} = 1.0 \pm 0.1 \times \text{SMB}_{\text{MAR}} - 5.8 \pm 7.1$, $r^2 = 0.84$), and it performs well to align the SMB_{MAR} estimates with the $\text{SMB}_{\text{ground}}$ values at low SMB sites. The subset of $\text{SMB}_{\text{MAR}} \geq 175 \text{ kg m}^{-2} \text{ a}^{-1}$ has some samples where the difference between SMB_{MAR} and $\text{SMB}_{\text{ground}}$ are very large, particularly at lower elevation sites where intense aeolian erosion and deposition often produce highly variable local SMB rates that are difficult to accurately model^{13,14}. As a result, this regression is weaker ($\text{SMB}_{\text{ground}} = 0.9 \pm 0.2 \times \text{SMB}_{\text{MAR}} + 4.2 \pm 57.9$, $r^2 = 0.35$) than the first regression, but we apply it while acknowledging the possibility of wide deviations. The two regressions intersect at ($\text{SMB}_{\text{MAR}} = 138 \text{ kg m}^{-2} \text{ a}^{-1}$, $\text{SMB}_{\text{ground}} = 130 \text{ kg m}^{-2} \text{ a}^{-1}$), and thus $\text{SMB}_{\text{adjMAR}}$ values were calculated by applying the first regression to all sites where $\text{SMB}_{\text{MAR}} \leq 138 \text{ kg m}^{-2} \text{ a}^{-1}$ and applying the second regression to all sites where $\text{SMB}_{\text{MAR}} > 138 \text{ kg m}^{-2} \text{ a}^{-1}$. We constructed our final primary SMB dataset for the analysis of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ samples by using the best quality SMB data for each site: $\text{SMB}_{\text{ground}}$ if available and $\text{SMB}_{\text{adjMAR}}$ otherwise.

Transfer function and SMB reconstruction. We modeled linear relationships between $\ln(\delta^{15}\text{N}_{\text{NO}_3\text{arc}} + 1)$ and SMB^{-1} based on Eq. (15) using previously reported parameter values to compare our theoretical framework to field results and to better understand the sensitivity of the relationships to photolytic and fractionation factors (Supplementary Discussion 1). To determine the coefficients in Eq. (1) from our field data, we performed linear regressions using all database $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ samples and the primary SMB dataset of best available SMB. Additional regressions (Supplementary Discussion 2) were performed for subsets of the database based on SMB type ($\text{SMB}_{\text{ground}}$ vs. $\text{SMB}_{\text{adjMAR}}$). With regression coefficients determined for Eq. (1), we modeled the spatial distribution of $\delta^{15}\text{N}_{\text{NO}_3\text{arc}}$ values across Antarctica using gridded mean SMB (MAR-ERA-interim, 1979–2015) at a 35 km resolution¹³ that were converted to $\text{SMB}_{\text{adjMAR}}$ as previously described.

For reconstructing the ABN $\text{SMB}_{\delta^{15}\text{N}}$ history, the ABN1314-103 ice core was cut into 0.33 m samples from 5 to 103 m, and these were processed for NO_3^- isotopes in 2016 as previously described. We applied an annually resolved age model (ALC0112018) based on seasonal ion and water isotope cycles and constrained by volcanic horizons that was originally developed for a longer core also taken at ABN. Each 1 m ice core segment was individually weighed prior to cutting, and the mass and volume were used to calculate a SMB profile based on dated ice density changes ($\text{SMB}_{\text{density}}$).

To determine past topographical effects on SMB, a MALA GPR device towing a RTA antenna on the surface (50 MHz out, 100 MHz in) was operated for a 65 km transect upstream of the coring site as part of the 2013–2014 campaign. Radar was triggered every 2 s (i.e., every 6–7 m along the transect) with a recording time window of 3000 nanoseconds that captured returns down to 300 m depth. After postprocessing⁴⁹, isochronal internal reflecting horizons were identified to 220 m depth, digitized with ReflexW software, and dated by connecting to the ALC0112018 age-depth model. Using a density profile taken from a longer ice core simultaneously drilled at ABN, 2D fields (depth by transect distance) were calculated for age, mean accumulation rate, and local accumulation rate. The mean accumulation rate to the most shallow reflecting horizon was taken as the upstream topographical effect on SMB (i.e., SMB_{GPR}).

Statistical analyses, regressions, SMB reconstructions, visualizations, and other statistical analyses were performed using the R programming language with packages *ggplot2*, *RColorBrewer*, *gridExtra*, *cowplot*, and *tidyverse* and with Adobe

Illustrator. QGIS was used for spatial analyses and map creation using data produced here or cited in image captions.

Data availability

The data generated in this study have been deposited in the PANGAEA online repository^{73,74} at <https://doi.org/10.1594/PANGAEA.941480> and <https://doi.org/10.1594/PANGAEA.941491>. All original source and figure data are available in this data or produced using the code linked below.

Code availability

Code for reproducing analyses and figure creation⁷⁵ is available at <https://doi.org/10.5281/zenodo.6806404>.

Received: 28 January 2022; Accepted: 6 July 2022;

Published online: 25 July 2022

References

- Fretwell, P. et al. Bedmap2: improved ice bed, surface and thickness datasets for Antarctica. *Cryosphere* **7**, 375–393 (2013).
- Juckes, M. N., James, I. N. & Blackburn, M. The influence of Antarctica on the momentum budget of the southern extratropics. *Q. J. R. Meteorological Soc.* **120**, 1017–1044 (1994).
- van den Broeke, M. R. On the role of Antarctica as heat sink for the global atmosphere. *J. Phys. IV Fr.* **121**, 115–124 (2004).
- Bronselaer, B. et al. Change in future climate due to Antarctic meltwater. *Nature* **564**, 53–58 (2018).
- Starr, A. et al. Antarctic icebergs reorganize ocean circulation during Pleistocene glacials. *Nature* **589**, 236–241 (2021).
- IPCC. Climate Change 2014: Synthesis Report. Contribution of Working Groups I, II and III to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change [Core Writing Team, R. K. Pachauri and L. A. Meyer (eds.)]. 151 (2014).
- Shepherd, A. et al. Mass balance of the Antarctic Ice Sheet from 1992 to 2017. *Nature* **558**, 219–222 (2018).
- Martín-Español, A. et al. Spatial and temporal Antarctic Ice Sheet mass trends, glacio-isostatic adjustment, and surface processes from a joint inversion of satellite altimeter, gravity, and GPS data. *J. Geophys. Res. Earth Surf.* **121**, 182–200 (2016).
- Stauffer, B., Flückiger, J., Wolff, E. & Barnes, P. The EPICA deep ice cores: first results and perspectives. *Ann. Glaciol.* **39**, 93–100 (2004).
- Parrenin, F. et al. 1-D-ice flow modelling at EPICA Dome C and Dome Fuji, East Antarctica. *Climate* **3**, 243–259 (2007).
- Howat, I. M., Porter, C., Smith, B. E., Noh, M.-J. & Morin, P. The reference elevation model of Antarctica. *Cryosphere* **13**, 665–674 (2019).
- Favier, V. et al. An updated and quality controlled surface mass balance dataset for Antarctica. *Cryosphere* **7**, 583–597 (2013).
- Agosta, C. et al. Estimation of the Antarctic surface mass balance using the regional climate model MAR (1979–2015) and identification of dominant processes. *Cryosphere* **13**, 281–296 (2019).
- Agosta, C. et al. A 40-year accumulation dataset for Adelie Land, Antarctica and its application for model validation. *Clim. Dyn.* **38**, 75–86 (2012).
- Gallée, H. et al. Transport of snow by the wind: a comparison between observations in Adélie Land, Antarctica, and simulations made with the regional climate model MAR. *Bound. Layer. Meteorol.* **146**, 133–147 (2013).
- Vimeux, F., Cuffey, K. M. & Jouzel, J. New insights into Southern Hemisphere temperature changes from Vostok ice cores using deuterium excess correction. *Earth Planet. Sci. Lett.* **203**, 829–843 (2002).
- Cauquoin, A. et al. Comparing past accumulation rate reconstructions in East Antarctic ice cores using 10Be, water isotopes and CMIP5-PMIP3 models. *Climate* **11**, 355–367 (2015).
- Thomas, E. R. et al. Regional Antarctic snow accumulation over the past 1000 years. *Climate* **13**, 1491–1513 (2017).
- Freyer, H. D., Kobel, K., Delmas, R. J., Kley, D. & Legrand, M. R. First results of 15N/14N ratios in nitrate from alpine and polar ice cores. *Tellus B* **48**, 93–105 (1996).
- Legrand, M., Wolff, E., Wagenbach, D. & Jacka, T. Antarctic aerosol and snowfall chemistry: implications for deep Antarctic ice-core chemistry. *Ann. Glaciol.* **29**, 66–72 (1999). Vol 29, 1999.
- Wolff, E. Nitrate in polar ice. In *Ice core studies of global biogeochemical cycles* (Springer-Verlag, 1995).
- Röthlisberger, R. et al. Nitrate in Greenland and Antarctic ice cores: a detailed description of post-depositional processes. *Ann. Glaciol.* **35**, 209–216 (2002).
- Frey, M., Savarino, J., Morin, S., Erbland, J. & Martins, J. Photolysis imprint in the nitrate stable isotope signal in snow and atmosphere of East Antarctica and implications for reactive nitrogen cycling. *Atmos. Chem. Phys.* **9**, 8681–8696 (2009).
- Erbland, J. et al. Air-snow transfer of nitrate on the East Antarctic Plateau - Part 1: Isotopic evidence for a photolytically driven dynamic equilibrium in summer. *Atmos. Chem. Phys.* **13**, 6403–6419 (2013).
- Shi, G. et al. Investigation of post-depositional processing of nitrate in East Antarctic snow: isotopic constraints on photolytic loss, re-oxidation, and source inputs. *Atmos. Chem. Phys.* **15**, 9435–9453 (2015).
- Grannas, A. et al. An overview of snow photochemistry: evidence, mechanisms and impacts. *Atmos. Chem. Phys.* **7**, 4329–4373 (2007).
- Berhanu, T. et al. Laboratory study of nitrate photolysis in Antarctic snow. II. Isotopic effects and wavelength dependence. *J. Chem. Phys.* **140**, 244306 (2014).
- Noro, K. et al. Spatial variation of isotopic compositions of snowpack nitrate related to post-depositional processes in eastern Dronning Maud Land, East Antarctica. *Geochemical J.* **52**, e7–e14 (2018).
- Shi, G. et al. Isotope fractionation of nitrate during volatilization in snow: a field investigation in Antarctica. *Geophys. Res. Lett.* **46**, 3287–3297 (2019).
- Noro, K. & Takenaka, N. Post-depositional loss of nitrate and chloride in Antarctic snow by photolysis and sublimation: a field investigation. *Polar* **39**, (2020). <https://polarresearch.net/index.php/polar/article/view/5146>.
- Winton, V. H. L. et al. Deposition, recycling, and archival of nitrate stable isotopes between the air–snow interface: comparison between Dronning Maud Land and Dome C, Antarctica. *Atmos. Chem. Phys.* **20**, 5861–5885 (2020).
- Zatko, M. C. et al. The influence of snow grain size and impurities on the vertical profiles of actinic flux and associated NOx emissions on the Antarctic and Greenland ice sheets. *Atmos. Chem. Phys.* **13**, 3547–3567 (2013).
- Zatko, M., Geng, L., Alexander, B., Sofen, E. & Klein, K. The impact of snow nitrate photolysis on boundary layer chemistry and the recycling and redistribution of reactive nitrogen across Antarctica and Greenland in a global chemical transport model. *Atmos. Chem. Phys.* **16**, 2819–2842 (2016).
- France, J. L. et al. Snow optical properties at Dome C (Concordia), Antarctica; implications for snow emissions and snow chemistry of reactive nitrogen. *Atmos. Chem. Phys.* **11**, 9787–9801 (2011).
- Wolff, E., Jones, A., Martin, T. & Grenfell, T. Modelling photochemical NOx production and nitrate loss in the upper snowpack of Antarctica. *Geophys. Res. Lett.* **29**, 5-1-5-4 (2002).
- Erbland, J. et al. Air-snow transfer of nitrate on the East Antarctic Plateau - Part 2: An isotopic model for the interpretation of deep ice-core records. *Atmos. Chem. Phys.* **15**, 12079–12113 (2015).
- Jiang, S. et al. Nitrate preservation in snow at Dome A, East Antarctica from ice core concentration and isotope records. *Atmos. Environ.* **213**, 405–412 (2019).
- Geng, L. et al. Effects of postdepositional processing on nitrogen isotopes of nitrate in the Greenland Ice Sheet Project 2 ice core. *Geophys. Res. Lett.* **42**, 5346–5354 (2015).
- Savarino, J., Kaiser, J., Morin, S., Sigman, D. & Thiemens, M. Nitrogen and oxygen isotopic constraints on the origin of atmospheric nitrate in coastal Antarctica. *Atmos. Chem. Phys.* **7**, 1925–1945 (2007).
- Frezzotti, M., Gandolfi, S., Marca, F. L. & Urbini, S. Snow dunes and glazed surfaces in Antarctica: new field and remote-sensing data. *Ann. Glaciol.* **34**, 81–88 (2002).
- Libois, Q., Picard, G., Arnaud, L., Morin, S. & Brun, E. Modeling the impact of snow drift on the decameter-scale variability of snow properties on the Antarctic Plateau. *J. Geophys. Res. Atmos.* **119**, 11662–11681 (2014).
- Picard, G., Arnaud, L., Caneill, R., Lefebvre, E. & Lamare, M. Observation of the process of snow accumulation on the Antarctic Plateau by time lapse laser scanning. *Cryosphere* **13**, 1983–1999 (2019).
- Eisen, O. et al. Ground-based measurements of spatial and temporal variability of snow accumulation in East Antarctica. *Rev. Geophys.* **46**, RG2001 (2008).
- Wille, J. D. et al. Antarctic atmospheric river climatology and precipitation impacts. *J. Geophys. Res. Atmospheres* **126**, e2020JD033788 (2021).
- Turner, J. et al. The dominant role of extreme precipitation events in Antarctic snowfall variability. *Geophys. Res. Lett.* **46**, 3502–3511 (2019).
- Gautier, E., Savarino, J., Erbland, J., Lanciki, A. & Possenti, P. Variability of sulfate signal in ice core records based on five replicate cores. *Clim* **12**, 103–113 (2016).
- Mouginot, J., Rignot, E. & Scheuchl, B. Continent-wide, interferometric SAR phase, mapping of Antarctic ice velocity. *Geophys. Res. Lett.* **46**, 9710–9718 (2019).
- Servettaz, A., Landais, A. & Orsi, A. *Two thousand years of temperature variability on the lower East Antarctic Plateau inferred from the analysis of stable isotopes of water and inert gases in the Aurora Basin North ice core* (Université Paris-Saclay, 2021).

49. Le Meur, E. et al. Spatial and temporal distributions of surface mass balance between Concordia and Vostok stations, Antarctica, from combined radar and ice core data: first results and detailed error analysis. *Cryosphere* **12**, 1831–1850 (2018).
50. Stenni, B. et al. Eight centuries of volcanic signal and climate change at Talos Dome (East Antarctica). *J. Geophys. Res. Atmos.* **107**, 13 (2002).
51. Frezzotti, M., Scarchilli, C., Becagli, S., Proposito, M. & Urbini, S. A synthesis of the Antarctic surface mass balance during the last 800 yr. *Cryosphere* **7**, 303–319 (2013).
52. Urbini, S. et al. Historical behaviour of Dome C and Talos Dome (East Antarctica) as investigated by snow accumulation and ice velocity measurements. *Glob. Planet. Change* **60**, 576–588 (2008).
53. Philippe, M. et al. Ice core evidence for a 20th century increase in surface mass balance in coastal Dronning Maud Land, East Antarctica. *Cryosphere* **10**, 2501–2516 (2016).
54. Kausch, T. et al. Impact of coastal East Antarctic ice rises on surface mass balance: insights from observations and modeling. *Cryosphere* **14**, 3367–3380 (2020).
55. Neubauer, C. et al. Stable isotope analysis of intact oxyanions using electrospray quadrupole-orbitrap mass spectrometry. *Anal. Chem.* **92**, 3077–3085 (2020).
56. Meusinger, C., Berhanu, T. A., Erbland, J., Savarino, J. & Johnson, M. S. Laboratory study of nitrate photolysis in Antarctic snow. I. Observed quantum yield, domain of photolysis, and secondary chemistry. *J. Chem. Phys.* **140**, 244305 (2014).
57. Chu, L. & Anastasio, C. Quantum yields of hydroxyl radical and nitrogen dioxide from the photolysis of nitrate on ice. *J. Phys. Chem. A* **107**, 9594–9602 (2003).
58. Benedict, K. B., McFall, A. S. & Anastasio, C. Quantum yield of nitrite from the photolysis of aqueous nitrate above 300 nm. *Environ. Sci. Technol.* **51**, 4387–4395 (2017).
59. Kaiser, J., Hastings, M. G., Houlton, B. Z., Röckmann, T. & Sigman, D. M. Triple oxygen isotope analysis of nitrate Using the denitrifier method and thermal decomposition of N₂O. *Anal. Chem.* **79**, 599–607 (2007).
60. Morin, S. et al. Comprehensive isotopic composition of atmospheric nitrate in the Atlantic Ocean boundary layer from 65 degrees S to 79 degrees N. *J. Geophys. Res. Atmospheres* **114**, D05303 (2009).
61. Sigman, D. M. et al. A bacterial method for the nitrogen isotopic analysis of nitrate in seawater and freshwater. *Anal. Chem.* **73**, 4145–4153 (2001).
62. Casciotti, K. L., Sigman, D. M., Hastings, M. G., Böhlke, J. K. & Hilkert, A. Measurement of the oxygen isotopic composition of nitrate in seawater and freshwater using the denitrifier method. *Anal. Chem.* **74**, 4905–4912 (2002).
63. Baertschi, P. Absolute ¹⁸O content of standard mean ocean water. *Earth Planet. Sci. Lett.* **31**, 341–344 (1976).
64. Mariotti, A. Atmospheric nitrogen is a reliable standard for natural ¹⁵N abundance measurements. *Nature* **303**, 685–687 (1983).
65. Pourchet, M. et al. Distribution and fall-out of ¹³⁷Cs and other radionuclides over Antarctica. *J. Glaciol.* **43**, 435–445 (1997).
66. Ding, M. et al. Spatial variability of surface mass balance along a traverse route from Zhongshan station to Dome A, Antarctica. *J. Glaciol.* **57**, 658–666 (2011).
67. Verfaillie, D. et al. Snow accumulation variability derived from radar and firn core data along a 600 km transect in Adelie Land, East Antarctic plateau. *Cryosphere* **6**, 1345–1358 (2012).
68. Hoshina, Y., Fujita, K., Iizuka, Y. & Motoyama, H. Inconsistent relationships between major ions and water stable isotopes in Antarctic snow under different accumulation environments. *Polar Sci.* **10**, 1–10 (2016).
69. Ding, M. et al. Re-assessment of recent (2008–2013) surface mass balance over Dome Argus, Antarctica. *Polar Res.* **35**, 26133 (2016).
70. Ekaykin, A. A. et al. Underestimation of snow accumulation rate in Central Antarctica (Vostok Station) derived from stake measurements. *Russian Meteorol. Hydrol.* **45**, 132–140 (2020).
71. Sommer, S., Wagenbach, D., Mulvaney, R. & Fischer, H. Glacio-chemical study spanning the past 2 kyr on three ice cores from Dronning Maud Land, Antarctica: 2. Seasonally resolved chemical records. *J. Geophys. Res. Atmos.* **105**, 29423–29433 (2000).
72. Richter, A. et al. Surface mass balance models vs. stake observations: a comparison in the Lake Vostok region, central East Antarctica. *Front. Earth Sci.* **9**, 388 (2021).
73. Akers, P. D. et al. Spatial variability in sub-photic zone nitrate $\delta^{15}\text{N}$ and surface mass balance across East Antarctica. *Pangaea*, <https://doi.org/10.1594/PANGAEA.941480> (2022).
74. Akers, P. D. et al. Nitrate $\delta^{15}\text{N}$ values and ice density-based surface mass balance from the ABN1314-103 ice core, Aurora Basin North, Antarctica. *Pangaea*, <https://doi.org/10.1594/PANGAEA.941491> (2022).
75. Akers, P. D. *pete-d-akers/scadi-d15N-SMB: SCADI nitrate and surface mass balance analysis v1.1*. *Zenodo*. <https://doi.org/10.5281/zenodo.6806404> (2022).
76. Hui, F. et al. Mapping blue-ice areas in Antarctica using ETM+ and MODIS data. *Ann. Glaciol.* **55**, 129–137 (2014).

Acknowledgements

We express thanks to the following individuals for project assistance and data support: Sarah Albertin, Selin Bagci, Albane Barbero, Mathieu Casado, Armelle Crouzet, Vincent Favier, Elsa Gautier, Gaspard Jannot, Alexis Lamothe, Anaïs Orsi, Fred Parrenin, Holly Winton, and the overwintering crews at Concordia Station. We acknowledge the logistical support of IPEV for the French missions in Antarctica, the IPEV and PNRA colleagues and overwintering crews at Concordia Station, and the JARE54 traverse team for field-work assistance and access to the S80 site data. We thank the co-investigators for the ABN drilling project (Jérôme Chappellaz, Dorthe Dahl-Jensen, David Etheridge, Joe McConnell, Andrew Moy, Steven Phipps, Andrew Smith, Tessa Vance, Meredith Nation) and the French National Center for Coring and Drilling (C2FN, funded by INSU) for critical drilling, logistic, and analytical support at ABN and other sites. Finally, we acknowledge the Glacioclim-SAMBA, ITASE, and IPICS 2kyr Array programs for SMB data, the Air-O-Sol facility at IGE for microbial culturing, and additional support from the MITACS Globalink program and JSPS-CNRS joint research program. This project has received funding from the European Union's Horizon 2020 research and innovation programme under the Marie Skłodowska-Curie grant agreement 889508-SCADI (P.D.A., J.S.). Funding also provided by the Agence Nationale de la Recherche (ANR): ANR-10-LABX56, ANR-11-EQPX-009-CLIMCOR, ANR-16-CE01-0011-01 (J.S.), BNP-Paribas Climate Initiative programs: 1115 (CHICTABA), 1117 (CAPOXI 35-75) (JS), and 1169 (EAIIST) (J.S.), and the Japan Society for the Promotion of Science: MEXT/JSPS KAKENHI 20H0496.

Author contributions

P.D.A., J.S., N.C., and M.C. conceptualized the project, formal analysis was performed by P.D.A., A.P.M.S., and E.L.M., visuals were created by P.D.A. and E.L.M., funding was acquired by P.D.A., J.S., and M.C., and initial writing was done by P.D.A., A.P.M.S., and P.C. P.D.A., J.S., N.C., A.P.M.S., E.L.M., O.M., J.M., C.A., P.C., K.K., S.H., M.C., T.V.O., L.J., and J.L.R. contributed to the project investigation and to manuscript review and editing.

Competing interests

The authors declare no competing interests.

Additional information

Supplementary information The online version contains supplementary material available at <https://doi.org/10.1038/s41467-022-31855-7>.

Correspondence and requests for materials should be addressed to Pete D. Akers or Joël Savarino.

Peer review information *Nature Communications* thanks Marie Cavitte and the other, anonymous, reviewer(s) for their contribution to the peer review of this work. Peer reviewer reports are available.

Reprints and permission information is available at <http://www.nature.com/reprints>

Publisher's note Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2022