Reconstructing atmospheric H$_2$ over the past century from bi-polar firn air records

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Abstract

Historical atmospheric H$_2$ levels were reconstructed using firn air measurements from two sites in Greenland (NEEM and Summit) and two sites in Antarctica (South Pole and Megadunes). A joint reconstruction based on the two Antarctic sites yields H$_2$ levels monotonically increasing from about 330 ppb in 1900 to 550 ppb in the late 1990s, levelling off thereafter. These results are similar to individual reconstructions published previously (Patterson et al., 2020; 2021). Interpretation of the Greenland firn air measurements is complicated by challenges in modelling pore close-off induced enrichment at these sites. We used observations of neon enrichment at NEEM and Summit to tune the parameterization of pore close-off induced enrichment in our firn air model. The joint reconstruction from the Greenland data shows H$_2$ levels rising 30% between 1950 and the late 1980s, reaching a maximum of 530 ppb. After 1990, reconstructed atmospheric H$_2$ levels over Greenland are roughly constant, with a small decline of 3% over the next 25 years. The reconstruction shows good agreement with the available flask measurements of H$_2$ at high northern latitudes.

1 Introduction

Molecular hydrogen (H$_2$) is the second-most abundant reduced gas in Earth's atmosphere after methane. Atmospheric H$_2$ levels are linked to Earth's radiative budget, air quality, and the atmospheric oxidative capacity (eg. Ehhalt & Rohrer, 2009; Novelli et al., 1999; Paulot et al., 2021). As H$_2$ becomes a more important component of the energy sector, anthropogenic emissions of H$_2$ are expected to rise substantially (Derwent et al., 2020; Prather, 2003; Wang et al., 2013a, 2013b). Projecting the atmospheric response to increased anthropogenic emissions in a changing climate requires a comprehensive understanding of the biogeochemical cycle of H$_2$. Studying past changes in atmospheric H$_2$ can inform

predictions of the effects of future perturbations by providing insight into the relationship between atmospheric H_2, human activities, and climate.

The globally averaged mixing ratio of H_2 in the present-day atmosphere is roughly 530 nmol mol^{-1} (ppb; Pétron et al., 2023). Major sources of atmospheric H_2 include photochemical production from the oxidation of methane and non-methane hydrocarbons (NMHCs) and direct emissions from fossil fuel combustion and biomass burning. Direct emission as a by-product of N_2 fixation is a minor source of atmospheric H_2. The major sink of atmospheric H_2 is consumption by soil microbes, accounting for about 70% of total losses and the remainder of the losses are to oxidation by the OH radical. Based on the atmospheric burden and estimates of the microbial and OH sinks, the lifetime of H_2 is estimated at 2 years (Novelli et al., 1999; Pieterse et al., 2011; 2013; Paulot et al., 2021).

Increasing atmospheric H_2 could influence the climate system in several ways. The reaction of H_2 with OH represents a loss for OH and therefore increases the atmospheric methane lifetime and associated radiative forcing. This reaction leads to the production of HO_2, which can influence tropospheric ozone levels. In the stratosphere, the reaction of H_2 with OH leads to the production of water vapor. Increased stratospheric water vapor cools the stratosphere and warms the troposphere (Solomon et al., 2010). Paulot et al. (2021) estimated the effective radiative forcing of atmospheric H_2 at 0.13 mW m^{-2} ppb^{-1} due to its effects on the methane lifetime and stratospheric water vapor content.

Systematic measurements of atmospheric H_2 levels began in the late 1980s (Khalil & Rasmussen, 1990). The NOAA Global Monitoring Laboratory (NOAA/GML), CSIRO GASLAB (CSIRO), and the Advanced Global Atmospheric Gases Experiment (AGAGE) started to monitor atmospheric H_2 levels at several sites around the world in the early 1990s (Novelli et al., 1999; Novelli, 2006; Prinn et al., 2019; Langenfelds et al., 2002; Pétron et al., 2023). Integration of records produced by the different groups has been complicated by calibration issues. Earlier use of different scales was addressed by implementation of the internationally accepted MPI09 scale established by the Max Planck Institute for Biogeochemistry (MPI; Jordan & Steinberg, 2011). Measurements from CSIRO and AGAGE, have been transferred to the MPI09 scale. Additionally, NOAA/GML measurements from 2009 onward were recently revised to the MPI09 scale (Pétron et al., 2023). Broadly, the instrumental record shows northern hemispheric H_2 levels rising during the late 1980s to a maximum in 1990 and decreasing until 1993. There is no discernible trend in Northern Hemisphere H_2 levels from 1993-2010 (Figure 7). The Southern Hemisphere instrumental record shows H_2 levels rising until 1999, then plateauing for the next 10-15 years.

Longer-term changes in atmospheric H_2 levels during the 20th century have been reconstructed using polar firn air from Antarctica (South Pole, Megadunes) and Greenland (NEEM; Petrenko et al., 2013; Patterson et al., 2020; 2021). Firn is the compacted snow layer that forms the upper 40 – 120 m of ice sheets and its interconnected porosity contains an atmospheric archive (referred to as "firn air") that can extend up to ~100 years back in time. For a comprehensive introduction to firn and firn air we refer the interested reader to Buizert (2013). The Antarctic reconstructions show that H_2 levels increased by 60% over the 20th century, consistent with increasing anthropogenic emissions and photochemical production from methane (Patterson et al., 2020). The Greenland reconstruction shows an increase in atmospheric H_2 levels during the 1960's to a peak in the late 1980s or early 1990s, followed by a small decline from 1990-2009 (Petrenko et al.,

2013). This recent decline is inconsistent with northern hemisphere modern flask measurements that show roughly constant H_2 levels after the mid-1990s (Novelli, 2006; Prinn et al., 2019). Petrenko et al. (2013) noted that the firn air model used for that reconstruction did not include pore close-off fractionation, a process that enriches H_2 in the lock-in zone where vertical diffusion of trace gases effectively goes to zero. Patterson et al. (2021) suggested that the inferred peak could be an artifact of ignoring this process.

In this work, we reassess historical Northern Hemisphere atmospheric H_2 levels over the 20th century using firn air from NEEM and an additional Greenland site with previously unpublished H_2 measurements (Summit). Additionally, we reanalyze the Antarctic firn air data using a different inversion technique, described in Section 3.3. Reliable bipolar records are useful for constraining changes to H_2 cycling because the two hemispheres differ in their sensitivity to changes in the soil sink and anthropogenic emissions. Understanding past variability in the soil sink is particularly important because the response of the soil sink to future changes in climate is the largest source of uncertainty in projecting the radiative consequences of increasing anthropogenic H_2 emissions (Warwick et al., 2022).

2. H_2 measurements in Greenland firn air

2.1 Firn air sampling

The sampling methods used in the Summit and NEEM campaigns were similar to techniques from previous published firn air studies (e.g., Battle et al., 1996; Severinghaus et al., 2001; Severinghaus & Battle, 2006). Briefly, a borehole was drilled into the firn, pausing the drilling at each desired sampling depth. The borehole was sealed above each sampling depth with an inflatable rubber packer to prevent contamination from the modern atmosphere. Synflex 1300 (formerly known as "Decabon") tubing for both waste air and sample air extends from below the packer to the surface. The waste air intake was positioned directly below the rubber packer. The waste air intake was separated from the sample air intake by a stainless-steel plate (baffle) with a diameter slightly less than the borehole. Air was pumped from the waste air intake 2-5x faster than from the sample air intake to ensure that no air that had been in contact with the rubber packer was sampled. Sampled air was dried using $Mg(ClO_4)_2$ and stored in 2.5 L glass flasks. More detailed information regarding the sampling at each site may be found in the references listed in Table 1.

Table 1- Site characteristics and data references for the three Greenland firn air sampling campaigns.

Site	Lat/lon	Date	T (°C)[a,c]	Accum.[b,c]	Reference	Firn air model parameters[d,e]
NEEM	77°N, 51°W	7/2008	-29	21.6	Petrenko et al., 2013	Buizert et al., 2012
Summit	73°N, 38°W	5/2013	-31	23.4	Hmiel et al., 2020	C. Buizert, personal communication

[a]Mean annual surface temperature
[b]Average modern accumulation (cm ice equivalent per year)
[c]Temperature and accumulation for NEEM are from Buizert et al. (2012). Temperature and accumulation for Summit were supplied by Christo Buizert (Personal Communication).
[d]Modeling parameters include density profile, and the lock-in depth (Section 3.1).
[e]Partitioning between closed and open porosity is described in Section 3.2.

2.2 Firn air measurements and calibration

The Summit firn air measurements were made by NOAA/GML using a Helium pulsed discharge detector with a linear response (HePDD; Novelli et al., 2009). The Summit measurements have been formally revised from the NOAA96 to the MPI09 calibration scale using a long term matched flask intercomparison project, which began in 1992 (Pétron et al, 2023). Firn air samples from NEEM were analyzed for H_2 at CSIRO using gas chromatography coupled to a mercuric oxide reductive gas analyzer (HgO-RGA). These measurements were calibrated using standards between 340 and 1000 ppb. The CSIRO measurements have been formally revised from the CSIRO94 to the MPI09 calibration scale (Jordan & Steinberg, 2011). CSIRO estimates the analytical uncertainty to be ±0.2%. However, there are other sources of uncertainty in the true H_2 content in the firn air. For example, tests conducted during the NEEM campaign demonstrated a small procedural blank (4-6 ppb). No such tests were conducted at Summit. To account for the possibility of such blanks, we assign an overall uncertainty of ±2% to the data from NEEM and Summit. The Antarctic firn air measurements have been described previously (Patterson et al., 2020; 2021).

The firn air H_2 measurements from all sites were corrected for gravitational fractionation (equation 2; Section 3.1), and duplicate measurements at the same depth were averaged to generate the finalized depth profiles (Figure 4b-c; 5b-c; 6 b-c). Lock-in depths for the sites are given in Table 2. The H_2 depth profiles at the Greenland sites display strong gradients above lock-in that reflect the fast free air diffusivity of H_2 and intense seasonality of atmospheric H_2 in the northern hemisphere. The H_2 gradients observed in the upper firn at NEEM is different than the gradient at Summit because NEEM was sampled in July while the other site was sampled in May. The depth profiles from NEEM and Summit both display sharp maxima of 530 and 560 ppb respectively in the lock-in zone. The NEEM measurements also show a sharp decrease to 490 ppb at the bottom of lock-in. At Summit, the decrease towards the bottom of lock-in is less dramatic than at NEEM because only one sample depth is deeper than the observed maximum. The qualitative differences in the depth profiles reflect changes in surface air H_2 levels over the period of the firn air sampling (2008-2013) and the different physical

130   characteristics of the sites. For example, the firn air at the bottom of the lock-in zone at Summit is younger than at NEEM because Summit was sampled several years later and has a thinner lock-in zone (Table 1).

Table 2- Summary of firn air H_2 measurements from NEEM and Summit

Site	Samples	Unique Depths	Lab	Detector	Lock-in depth (m)
NEEM	23	18	CSIRO	HgO-RGA	63
Summit	37	19	NOAA	HePDD	68.5

3. Firn air modelling and inversions

135   **3.1 Firn air model**

     The UCI_2 firn air model is a 1-dimensional finite-difference advective-diffusive model that is used to simulate the evolution of trace gas levels in firn air. The UCI_2 model has been used to successfully analyse H_2 levels in firn air at the two Antarctic sites, including the effects of pore close-off fractionation (see below; Patterson et al., 2020; 2021). The default model parameterizations do not adequately capture the effects of pore close-off fractionation at the Greenland sites, and
140   additional tuning is required as described in section 3.2.

     The UCI_2 model is largely based on Severinghaus et al. (2010). The model domain is divided into an upper "diffusive zone" and lower "lock-in zone." In the diffusive zone, vertical gas transport occurs via wind-driven mixing in the shallowest ~5 m and via molecular diffusion throughout. Diffusive mixing decreases with depth due to the increasing tortuosity of the firn. In the lock-in zone, vertical molecular diffusion ceases due to the presence of impermeable ice layers.
145   Gas transport in the lock-in zone occurs primarily due to advection with a small non-fractionating mixing term. The model uses a forward Euler integration scheme and a time step of 324 s. There are two important differences between the Severinghaus et al. (2010) model and the UCI_2 model: 1) thermal diffusion is neglected, as it is unimportant for H_2, 2) our model parameterizes pore close-off fractionation differently than the Severinghaus model (Section 3.2). The UCI_2 model tracks the air content and composition in both open pores and closed bubbles as a function of time and depth. The model
150   code is written and executed in MATLAB R2022a (Mathworks Inc.).

     The site-specific bulk density profile (ρ_{firn}: kg m^{-3}) is calculated from an empirical fit to density measurements of the firn core. Total porosity (s_{total}; dimensionless) is estimated from the density profile:

$$s_{total} = 1 - \frac{\rho_{firn}}{\rho_{ice}} \tag{1}$$

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Where ρ_{ice} (kg m^{-3}) is the temperature dependent density of ice from Bader (1964). Accumulation rate, temperature, and the depth of the lock-in zone onset are site-specific parameters. Partitioning between closed and open porosity in the model is described in section 3.2.

Model grid spacing is 0.5 m in the diffusive zone. Gas transport is dominated by wind-driven mixing in the upper part of the diffusive zone, and by molecular diffusion in the lower part of the diffusive zone. To simulate non-fractionating wind-driven mixing, a depth-dependent eddy diffusivity term is added to the one-dimensional firn air transport equation (Schwander et al., 1993; Severinghaus et al., 2010; Trudinger et al., 1997). Additionally, we neglect the typical gravitational term, and instead empirically correct the firn air measurements using the $\delta^{15}N$ of N_2 depth profile. The correction is calculated from the $\delta^{15}N$ data for each borehole according to equation 2:

$$Corr_{grav} = \frac{\delta^{15}N}{1000} * \frac{\exp\left(g*z*\frac{\Delta m_g}{RT}\right)-1}{\exp\left(g*z*\frac{\Delta m_{15N}}{RT}\right)-1} \tag{2}$$

Where $Corr_{grav}$ is the depth dependent fractional correction for the gas of interest, $\delta^{15}N$ is the measured isotopic composition of N_2 (‰) each depth, g is the gravitational acceleration constant (9.8 m s^{-2}), z is depth (m), R is the ideal gas constant (8.314 J mol^{-1} K^{-1}), T is the annual average temperature at the site, Δm_g is the difference in molar mass (in kg) between the gas of interest and air, and Δm_{15N} is the difference in molar mass between $^{28}N_2$ and $^{29}N_2$ (.001 kg). This correction neglects the thermal fractionation of $\delta^{15}N$. Thermal fractionation is only important in the upper ~20 m of the firn, and these shallow measurements are excluded from the reconstructions due to seasonality in atmospheric H_2 levels (Severinghaus et al., 2001; Section 3.2).

Equation 3 governs the evolution of the concentration of the gas of interest in the open pores in the diffusive zone (Severinghaus et al., 2010):

$$s_o \frac{\partial C}{\partial t} = \frac{\partial}{\partial z}\left(\frac{\partial C}{\partial z} * \left[s_o D_{mol}(z,T,P) + s_o D_{eddy}(z)\right]\right) - s_o w \frac{\partial C}{\partial z} \tag{3}$$

Where s_o is the open porosity, C is concentration of the gas of interest (mol m^{-3}), D_{mol} is the gas, depth, temperature, and pressure dependent molecular diffusivity constant (m^2 s^{-1}), D_{eddy} is the depth dependent eddy diffusivity (m^2 s^{-1}), and w is the downward velocity of the firn column (m s^{-1}). D_{mol} and D_{eddy} profiles for NEEM and Summit are tuned using a suite of measured gases with well constrained atmospheric histories including CO_2, CH_4, CH_3CCl_3, and SF_6. The diffusivity profiles were validated by forcing the model with the established atmospheric histories for the previously mentioned trace gases and comparing the model output to the measurements (Figure S5). During the tuning process, the ratio between the effective molecular diffusivities of each trace gas at each depth is forced to maintain the ratio of their free air diffusivities (eg. at each depth D_{mol} for CH_4 is 1.4 times that of D_{mol} for CO_2). After tuning D_{mol} is then scaled using the ratio of the free air diffusivity

of CO_2 to the diffusivity of H_2 or other trace gas of interest. Temperature and pressure dependent free air diffusivities are calculated using Fuller et al. (1966) as described by Reid et al. (1987; Ch. 11).

190   Model grid spacing in the lock-in zone is 1 annual layer. There is no molecular diffusivity in the lock-in zone and gas transport occurs via downward advection of annual layers once per year. Small values of non-fractionating "eddy diffusivity" are prescribed to account for dispersive mixing caused by barometric pressure fluctuations (Buizert and Severinghaus, 2016). Model parameterizations for vertical mixing in the lock-in zone are validated by forcing the model with best-estimate Greenland atmospheric histories for various trace gases with well constrained atmospheric histories

195   (Buizert et al., 2012).

3.2 Pore close-off fractionation

        In addition to wind-driven mixing, diffusion, and advection, pore close-off fractionation is parameterized in the firn air model. As closed pores (bubbles) are advected downward in the firn, internal pressure increases, creating a partial

200   pressure gradient which drives a net diffusive flux of highly mobile trace gases out of the bubbles, through the ice lattice, and into the open pores. The open pores are therefore enriched in these gases. This phenomenon affects gases with kinetic diameters (KD) <3.6 Å such as Ne, and He due to their large diffusivity in ice (Severinghaus & Battle, 2006).

        Given its small molecular diameter (KD= 2.89 Å) pore close-off fractionation must affect H_2 in a similar manner to neon (Patterson et al., 2020; Petrenko et al., 2013, Severinghaus & Battle, 2006). Recent laboratory measurements indicate

205   that the permeability of H_2 in ice is sufficiently fast to equalize the partial pressure of H_2 in the open porosity and closed bubbles (Patterson & Saltzman, 2021). Therefore, in the model, it is assumed that the partial pressure of H_2 is in equilibrium between the closed bubbles and open pores in each layer as described by equations 4-6:

$$P_n = (P_{bubble} x_{n(bubble)} s_c + P_{ambient} x_{n(firn)} s_o)/s_{total} \tag{4}$$

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$$x_{n(bubble)\_eq} = P_n/P_{bubble} \tag{5}$$

$$x_{n(firn)\_eq} = P_n/P_{ambient} \tag{6}$$

215   Where P_n (Pa) is partial pressure of gas n (H_2 or Ne), x_n is mole fraction of gas n, P_{bubble} (Pa) is the total bubble pressure, $P_{ambient}$ (Pa) is the ambient pressure in the open pores, and s_c is closed porosity. The subscripts *bubble* and *firn* distinguish between the closed and open porosity. Equation 4 is executed at the end of each time step in each model grid cell. Then the mole fraction of gas n in the bubbles and firn air is updated to its equilibrium value using equations 5 and 6 before proceeding to the next timestep ($x_{n(bubble)\_eq}$, $x_{n(firn)\_eq}$). Note that the equilibrium parameterization of pore close-off

220 fractionation used here is different from the kinetic parameterization used by Severinghaus & Battle (2006) which was developed assuming a much smaller permeation constant for Ne. Pore close-off fractionation is only important in terms of the exchange of H_2 and Ne between closed and open pores. Permeation of these gases through the ice lattice vertically between model layers can be neglected on time scales relevant to firn air modelling (Patterson & Saltzman 2021).

Ne and H_2 have similar permeability in ice due to their similar molecular diameters (Patterson & Saltzman, 2021;
225 Satoh et al., 1996). Atmospheric Ne is essentially constant, making it a useful tracer for assessing the effects of pore close-off fractionation. There is good model-measurement agreement for Ne enrichment at South Pole and Megadunes using porosity partitioning parameterizations from Severinghaus & Battle (2006) and Severinghaus et al. (2010) respectively (Patterson et al., 2020; 2021, Figure 1). However, the firn air model underestimates pore close-off induced Ne enrichment at the base of the firn at NEEM and Summit using previously published parameterizations for the partitioning between open
230 and closed porosity (eg., Schwander et al, 1989; Goujon et al., 2003; Mitchell et al., 2015; Figure 1). If a firn air model underestimates Ne enrichment, it is highly likely to also underestimate pore close-off enrichment for H_2, resulting in a reconstruction that is biased high. The diffusive exchange between the closed bubbles and open pores affects the modeled H_2 age distributions. As a result, the H_2 measurements cannot be empirically corrected as they are for gravitational fractionation (equation 2; Figure S3), and pore close-off fractionation must be explicitly modeled.

235 δ^{22}Ne/N_2 at the base of the firn was measured as 179‰ at NEEM and 112‰ at Summit where δ^{22}Ne/N_2 of a sample is defined based on the relative mixing ratios of ^{22}Ne and N_2:

$$(\delta^{22}Ne/N_2)_{sample} = [(^{22}Ne/N_2)_{sample}/(^{22}Ne/N_2)_{atmosphere} - 1] * 1000 \qquad (7)$$

240 The model generates enrichments of only 112‰ at NEEM and 96‰ at Summit at the base of the firn using the Goujon et al, (2003; their equation 9) parameterization for porosity partitioning. The modeled enrichments are significantly lower than the measurements (Figure 1). The Goujon et al. (2003) parameterization requires a single site-specific value for total porosity at complete close-off (s_{co}). The values we used for s_{co} are given in Table 3. Model results using the Schwander et al. (1998) and Mitchell et al. (2015) parameterizations are similarly biased.

245 At equilibrium, modeled enrichment of Ne and H_2 is controlled primarily by the ratio of the volume-weighted average pressure in the open and closed pores to the ambient pressure, adjusted for mixing. We define a new parameter (R) to describe this ratio:

$$R = (P_{bubble}s_c/s_{total} + P_{ambient}s_o/s_{total})/P_{ambient} \qquad (8)$$

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When previously published parameterizations of partitioning between open and closed pores are implemented in the model, R begins to increase too deep in the firn to capture the shallower δ^{22}Ne/N_2 measurements (Figure 1 and Figure 2). To improve the simulation of the observed Ne enrichment, we introduce a new model configuration, referred to as

8

"*Mitchell_optimized*". In this configuration, partitioning between closed and open porosity is based on Mitchell et al. (2015, their equation 6). The formulation requires two site-specific parameters: 1) ρ_{co} – the density of the firn at complete close-off and 2) σ_{co} – the uncertainty due to fine scale variability in firn density and variability in close-off density. These two parameters are optimized to minimize the model-measurement bias for neon enrichment at each site (Table 3; Figures 2a, 2c).

The *Mitchell_optimized* parameters are significantly different from the recommendations of Mitchell et al. (2015). Furthermore, the resulting closed porosity profiles are qualitatively different from other measured and modeled closed porosity profiles and are probably not physically realistic (Figure 2). Bubble close-off takes place over a much broader depth range in the *Mitchell_optimized* configuration, and complete close-off (i.e. $s_c > 0.999 s_{total}$) does not occur until depths of 111.0 m (NEEM) and 112.5 m (Summit). Firn air could only be sampled to a depth of 75.9 m (NEEM) and 80.1 m (Summit), suggesting that complete close-off is actually significantly shallower than in the *Mitchell_optimized* configuration.

We also examined one additional model configuration, referred to as the "*Compression*" configuration, in which we force the closed porosity profile to have a more typical complete close-off depth. In this configuration, the closed porosity above some optimized critical depth (z_{crit}) is parameterized as in Goujon et al. (2003; their equation 9) with an optimized s_{co} parameter. Below the critical depth, closed porosity increases linearly with depth, reaching complete close-off at the same depth as in the Goujon et al. (2003) base-case (79.2 m at NEEM and 81.5 m at Summit). A similar two-stage closed porosity parameterization was used in Severinghaus & Battle (2006). The resulting closed porosity profiles are more similar to previously published profiles and probably more realistic (Figure 2). However, even with an optimized z_{crit} and s_{co}, we found that R increases too rapidly with depth to capture the $\delta^{22}Ne/N_2$ at both the top and the bottom of the lock-in zone. Therefore, to generate the necessary R profile while maintaining a realistic closed porosity profile, some other physical process must be modified in the model in addition to the closed porosity profile. Possible candidates include the rate of pressurization of bubbles, the rate of densification, and the rate of bubble close-off. A detailed observation-based investigation of these processes at these sites would require field data that do not currently exist. Here, we use the rate of bubble pressurization as an additional tuning lever to examine the sensitivity of the model results to the specific physical parameterizations in the model.

The bubble pressurization scheme used in the UCI_2 model assumes that closed bubbles compress at the same rate as the total porosity after Severinghaus & Battle (2006). Bubble trapping models that assume such iso-compression have been shown to overestimate total air content in bubbles at the Lock-in and Vostok sites in East Antarctica (Fourteau et al., 2019). In that work, better model-measurement agreement was achieved by reducing the compressibility of closed bubbles by 50%. To reduce the compressibility of closed bubbles in our *Compression* model configuration, we modified the calculation of the incremental new volume of air at ambient pressure ($\Delta V_{b(i)}$) occluded in bubbles between layer (*i-1*) and layer (*i*) per unit volume of firn:

$$\Delta V_{b(i)} = \frac{2\left\{s_{c(i)} - s_{c(i-1)}\left[(1-k_{comp}) + k_{comp}\frac{s_{total(i)}}{s_{total(i-1)}} + \frac{\rho_{firn(i)}}{\rho_{firn(i-1)}} - 1\right]\right\}}{(1-k_{comp}) + k_{comp}\frac{s_{total(i)}}{s_{total(i-1)}} + 1}$$

(9)

where k_{comp} is a dimensionless free parameter that represents the degree of compressibility of the bubbles. In the limit of $k_{comp}=1$, equation 9 reduces to equation A12 of Severinghaus & Battle (2006), and bubbles compress at the same rate as the open pores. In the limit of $k_{comp}=0$, the bubbles are completely incompressible. In the *Compression* configuration, k_{comp} is simultaneously optimized with z_{crit} and s_{co} to achieve agreement between modeled and measured Ne enrichment (Figure 1 and 2; Table 3).

Both alternative model configurations (*Mitchell_optimized* and *Compression*) yield a greatly improved fit between modeled and measured Ne enrichment at NEEM and Summit. The alternative model configurations are considered empirical tuning methods to fit the Ne data and should not be used to draw conclusions about the underlying firn physics. Further investigation of bubble pressurization, firn layering, and bubble close-off using high resolution measurements of density, porosity, and air content, in conjunction with measurements of highly diffusive trace gases like Ne or He would be useful in constraining the underlying physics of pore close-off fractionation for future Greenland firn air work.

The *Mitchell_optimized* and *Compression* configuration yield very similar reconstructions. As long as accurate neon enrichment is achieved, the reconstructions are insensitive to the specific parameterization of closed porosity (Section 4; Figures 3 and 5). This result is important given the uncertainty and *ad hoc* nature of our model tuning. For the sake of simplicity, we use the *Mitchell_optimized* configuration as the default model for NEEM and Summit for the remainder of this work. Comparisons between the *Mitchell_optimized* and *Compression* configurations are shown in Figure 3 and Figure 5. Additionally, we note that the choice of configuration has a negligible effect on the model result for the tuning gases (Figure S5 for CO_2 and CH_4).

Table 3- Parameters used for each model configuration described in Section 3.2 and plotted in Figures 1 and 2

| Site | *Mitchell_optimized* | | *Compression* | | | Goujon et al., (2003) |
	ρ_{co} (kg m^{-3})	σ_{co}[a] (kg m^{-3})	s_{co}	z_{crit} (m)	k_{comp}	s_{co}
NEEM	841	25.2	0.115	63.5	0.78	0.097[b]
Summit	842	22.4	0.110	71.6	0.76	0.102[c]

[a] σ_{co} combines the uncertainty associated with both layering and close-off density in Mitchell et al. (2015), equation 6 as the two parameters cannot be optimized independently
[b] from Buizert et al. (2012)
[c] calculated from site temperature using the formulation of Martinerie et al. (1994)

Figure 1: Measured and modeled depth profiles of ^{22}Ne in the firn air at South Pole (a), Megadunes (b), NEEM (c), and Summit (d). The partitioning between closed and open porosity in the firn air model is from Severinghaus & Battle (2006) and Severinghaus et al., (2010) for South Pole and Megadunes respectively as in Patterson et al., (2020; 2021). For NEEM and Summit, several model configurations with different porosity partitioning parameterizations are plotted: *Mitchell_optimized* (green lines), *Compression* (dashed purple lines), and Goujon et al., (2003; dashed magenta lines). See text for description of each configuration.
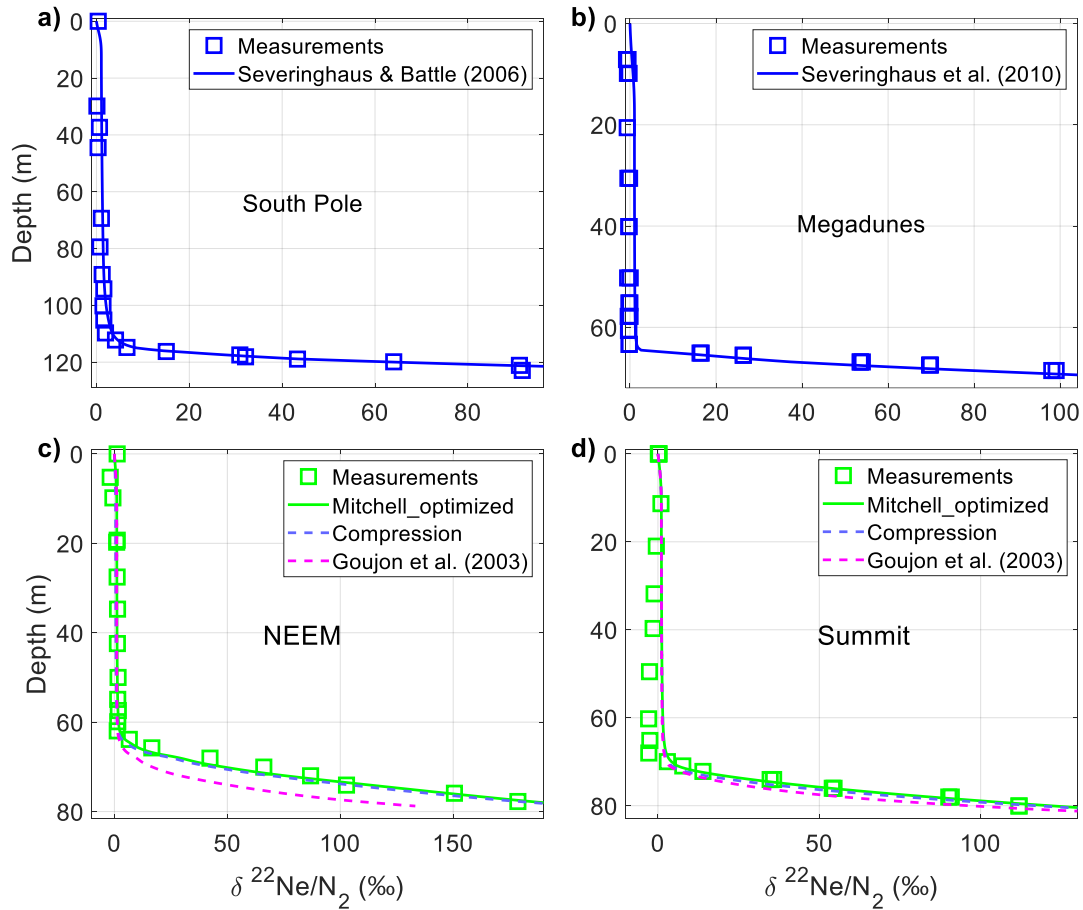
345 **Figure 2: Closed porosity fraction (s_c/s_{total}) and R for NEEM (a and b) and Summit (c and d). Several model configurations with different porosity partitioning parameterizations are plotted: *Mitchell_optimized* (green lines), *Compression* (dashed purple lines), and Goujon et al., (2003; dashed magenta lines). See text for description of each parameterization.**
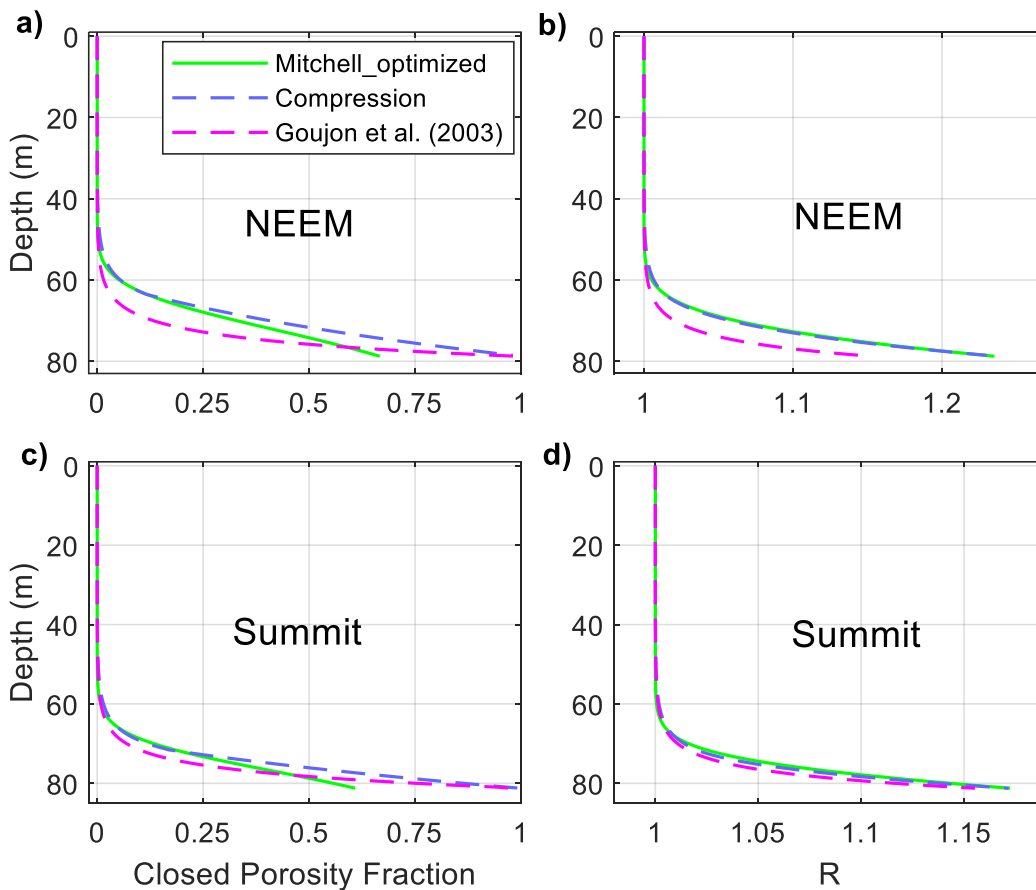
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3.3 Inversion methods

The firn air measurements are inverted to recover an atmospheric history of H_2 from each site. The inversion technique employs depth-dependent age distributions or "Green's functions" (G; Figure 3; Rommelaere et al., 1997). The firn air model is initialized with no H_2 in the firn air column, then forced with a transient 1-year unit pulse of H_2 at the

355 surface. The model is integrated for 300 years, and the evolution of the pulse is tracked as a function of depth and time to produce the Green's functions. The age distributions grow older and broader with depth (Figure S1). For most gases, the Green's functions integrate to 1 at every depth. In the case of H_2 and Ne, the sum of the Green's functions in the lock-in zone is slightly greater than 1 due to pore close-off fractionation. Given an atmospheric history ($H_{2(atm)}$), modeled levels of H_2 in the firn ($H_{2(firn)}$) are calculated according to equation 10:

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$$H_{2(firn)}(z) = \sum_{t=0}^{300} H_{2(atm)}(t) * G(z, t) \tag{10}$$

Using Green's function allows for rapid iteration over many possible atmospheric histories without running the firn air model in forward mode. The inversion problem is under-constrained. Multiple atmospheric histories can provide good

365   agreement with the measured depth profile, and additional constraints are required to yield a unique solution. In previous studies, the additional constraint has been implemented as a smoothing parameter (Patterson et al., 2020, 2021; Petrenko et al., 2013; Rommelaere et al., 1997). In this work, we rely instead on the assumption of autocorrelation and utilize the probabilistic modelling software package, Stan (mcstan.org). Stan has been used previously for firn air reconstructions by Aydin et al. (2020). As in that work, we use Stan to implement a Bayesian hierarchical model in which the atmospheric

370   history is treated as an autocorrelated random variable:

$$\boldsymbol{m}_{atm}[t_i] \sim N(\boldsymbol{m}_{atm}[t_{i-1}], \alpha \boldsymbol{m}_{atm}[t_{i-1}]) \tag{11}$$

Where N is the normal distribution, and $\boldsymbol{m}_{atm}$ is a vector of length i that contains the discrete atmospheric H_2 dry air mole

375   fraction history with a timestep of 1 year. The atmospheric mixing ratio at time t_i is normally distributed around the atmospheric mixing ratio at time t_{i-1} with a standard deviation of $\alpha \boldsymbol{m}_{atm}[t_{i-1}]$. α is a positive scalar and is varied as a free parameter. The atmospheric history is related to the firn air measurements:

$$\boldsymbol{h}_{obs} \sim N(\boldsymbol{G}\boldsymbol{m}_{atm}, \boldsymbol{\sigma}) \tag{12}$$

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Where $\boldsymbol{h}_{obs}$ is a vector of length n, which contains the measured H_2 levels at each depth, $\boldsymbol{G}$ is an n by i matrix where each row corresponds to the Green's function for that unique depth (referred to as the "kernels" by Rommeleaere et al. (1997)), and $\boldsymbol{\sigma}$ is a vector of length n, which contains the analytical uncertainties of the firn air measurements. Stan samples the joint posterior probability distribution for the parameters, $\boldsymbol{m}_{atm}$ and α using a fast Hamiltonian Markov Chain Monte Carlo

385   algorithm (Carpenter et al., 2017). Parameters are sampled from uniform prior distributions unless otherwise specified. Inversions are carried out using the MatlabStan 2.15.1.0 interface to cmdstan 2.27.0. The advantages of this method over other methods include: 1) No arbitrarily specified smoothing criteria is imposed (instead the atmospheric history is assumed to be autocorrelated), and 2) Stan allows us to easily explore sensitivity to assumptions about the data by encoding those assumptions as priors.

390   In Greenland, H_2 levels in the upper firn layers are strongly influenced by seasonal variations, and firn air reconstructions cannot accurately reconstruct such high frequency variability. Therefore, measurements from the upper part of the firn were excluded from the reconstructions. A cut-off depth was determined by forcing the firn air model in forward mode with an atmospheric history that consists of constant annually averaged H_2 levels with a realistic seasonal cycle

imposed. Depths where the H_2 concentration varied by more than 1% from the annual average were excluded from the reconstruction. The cut-off depths were 62 m and 66 m for NEEM and Summit. Unlike Greenland, Antarctic H_2 reconstructions are not sensitive to seasonality primarily because seasonal variability in atmospheric H_2 levels over Antarctica is less than half that of seasonal variability over Greenland.

Figure 3: Calculated H_2 age distributions (Green's Functions) for depths of 75.9 m at NEEM (a) and 80.1 m at Summit (b) using two different parameterizations for the partitioning of closed and open porosity with depth. The *Mitchell_optimized* (green lines) and *Compression* (dashed purple lines) configurations produce very similar age distributions.
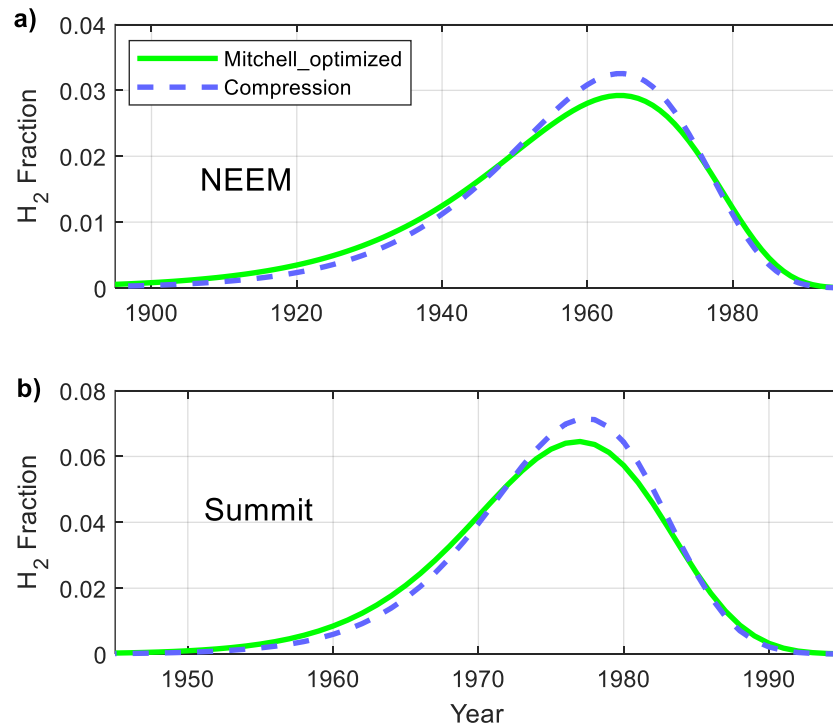
4. Atmospheric reconstructions

Atmospheric H_2 reconstructions were carried out for each Greenland site independently (Figure 4). The NEEM and Summit sites have different physical characteristics (mean annual temperature and accumulation rate) and were sampled at different times yielding different firn air age distributions (Figure 3). The model inversions yield generally good agreement between the modeled and measured depth profiles for NEEM (Figure 4b). Agreement is also good at Summit, except at the bottom of lock-in where the modeled depth profile increases monotonically with depth while the deepest measurement shows a slight decrease. The disagreement in trend at the bottom of the firn is due to a single firn air measurement that insufficiently constrains H_2 levels prior to 1975. A decreasing trend in the modeled depth profile is obtained by halving the uncertainty on the Summit firn measurements (Figure S2). This more tightly constrained reconstruction yields H_2 levels 15-

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20 ppb lower than the base-case Summit reconstruction prior to 1975 (Figure 4a). For the post-1975 time period during which we consider the reconstruction valid, the differences between the two reconstructions are negligible.

415   Firn air measurements from NEEM constrain atmospheric H_2 levels after 1950. The NEEM reconstruction shows atmospheric H_2 increasing from 1950-1990 at an average rate of 3.3 ppb y^{-1} (400-530 ppb). After 1990, atmospheric levels decrease slowly at an average rate of 0.8 ppb y^{-1} reaching 515 ppb in 2008. Summit firn air is younger, yielding an atmospheric history beginning in 1975. The Summit reconstruction shows atmospheric H_2 increasing from 500-528 ppb from 1975 to 1990, an average rate of 1.1 ppb y^{-1}. After 1994 atmospheric H_2 levels are mostly stable until 2003. After 2003,

420   atmospheric H_2 decrease slowly at a rate of 1.3 ppb y^{-1}, reaching 515 ppb in 2013.

A "joint" reconstruction was carried out in which the most probable atmospheric history given the firn air data from both Greenland sites is calculated (Figure 5). Reconstructed atmospheric H_2 levels increase from 390 ppb in 1950 to 530 ppb in 1987 at an average rate of 3.8 ppb y^{-1}. After 1987, atmospheric H_2 levels are stable near 530 ppb until 2002, when they begin to decrease slowly, reaching 515 ppb in 2013. There is good agreement between the modeled and measured depth

425   profiles for the joint reconstruction, and the difference between the *Mitchell_optimized* configuration and *Compression* configuration are negligible (Figure 5).

A joint reconstruction was also carried out for the two Antarctic sites (Figure 6). Because of unique site characteristics, the firn air at Megadunes is old, and the Antarctic H_2 levels may be reconstructed beginning in 1875 (Severinghaus et al., 2010). The reconstruction shows H_2 levels stable near 330 ppb from 1875-1900. After 1900,

430   atmospheric H_2 levels increase at an average rate of 1.6 ppb y^{-1}, reaching 440 ppb in 1970. After 1970, atmospheric H_2 levels increase more rapidly at a rate of 4.11 ppb y^{-1}, reaching 550 ppb in 1997 and stabilizing thereafter. There is good agreement between the modeled and measured depth profiles at the Antarctic sites. The South Pole data suggest some additional fluctuations in the growth rate of atmospheric H_2 during the 20th century, particularly a reduced growth rate from 1940-1955 (Figure 6). These fluctuations are not present in the joint reconstruction due to the smoothing inherent in the inversion

435   method. This is an inherent limitation of firn air reconstructions.

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Figure 4: H₂ atmospheric histories and firn air profiles reconstructed independently from firn air measurements at Greenland sites NEEM and Summit using the *Mitchell_optimized* model configuration. a) NEEM (purple), Summit (orange), with ±1σ uncertainty (shaded regions). Firn air measurements adjusted for pore close-off fractionation, are plotted against mean age (crosses and triangles). Black x's are the Synthetic Summit history from Pétron et al. (2023) and Langenfelds et al. (2002; Section 5). b) and c) measured and modeled depth profiles at NEEM and Summit, respectively. Squares with error bars are measurements used in the reconstruction, and circles are measurements excluded due to seasonality. Coloured lines and shading are the depth profiles modeled from the histories in (a) with the propagated ±1σ uncertainty. The dashed black lines indicate the top of lock-in zone.

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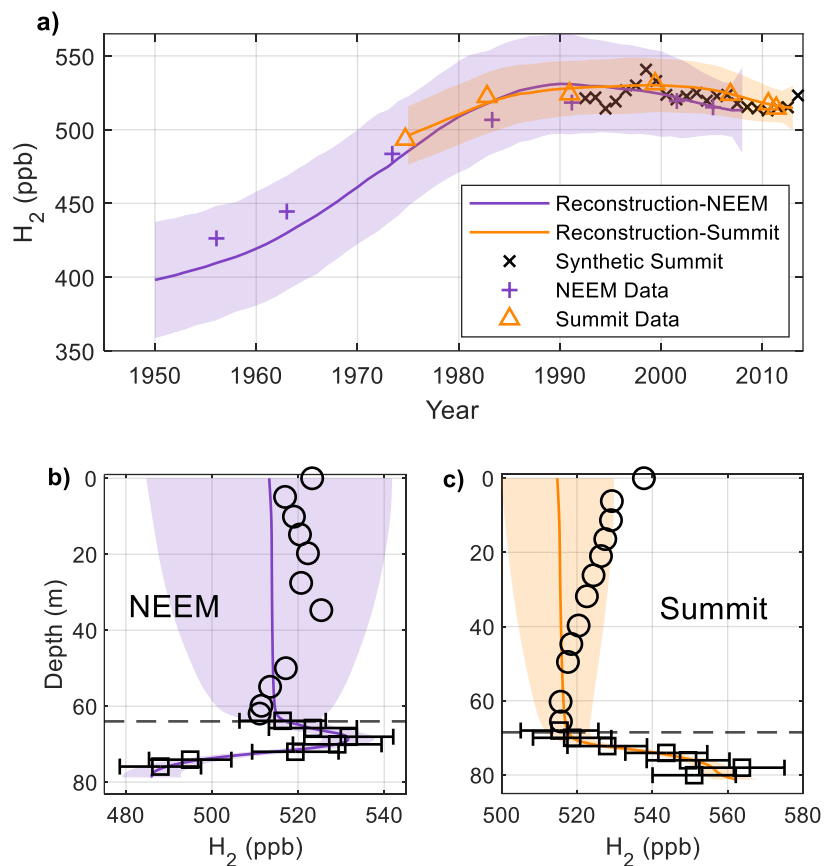
Figure 5: Joint reconstructions using firn air profiles at Greenland sites NEEM and Summit. a) joint reconstruction (green line and ±1σ uncertainty shading) using the *Mitchell_optimized* model configuration; dashed purple line-reconstruction result using the *Compression* configuration; other markers are as in Figure 4a; b) and c) modeled depth profiles at NEEM and Summit with symbols as in Figure 4.

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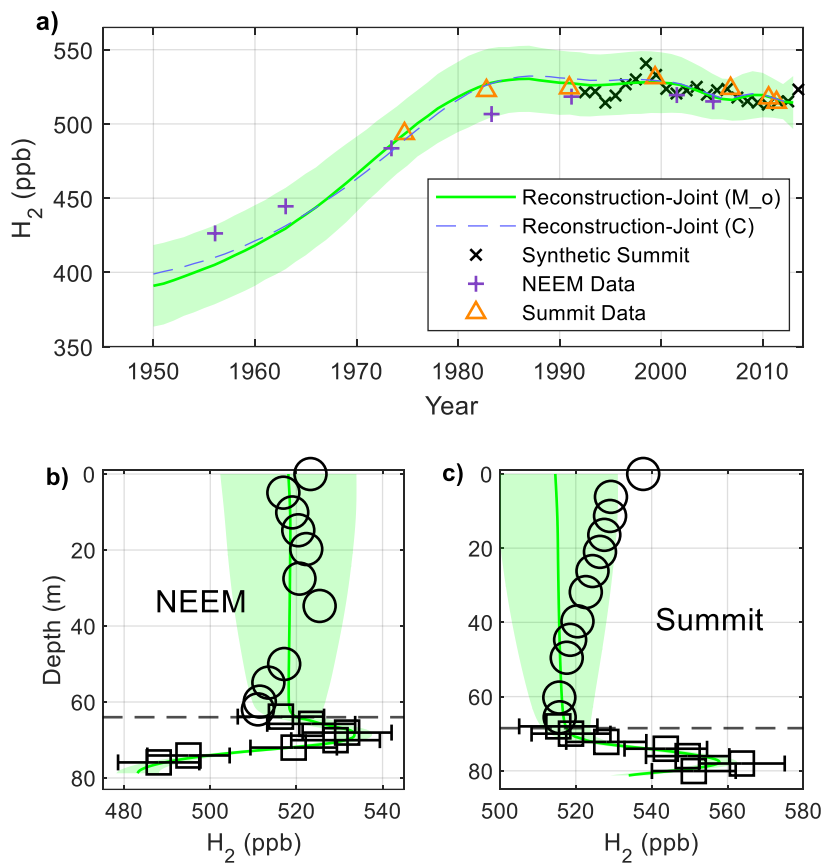
Figure 6: Joint reconstruction using firn air profiles at the two Antarctic sites. a) blue line and shading-reconstruction result and associated ±1σ uncertainty; black x's- H₂ annual means from measurements made by NOAA/GML at Palmer, Syowa, South Pole, and Halley Stations, Antarctica and Cape Grim Observatory, Tasmania (Novelli et al., 1999; Novelli, 2006); black circles- H₂ annual means from measurements made by CSIRO at Casey, South Pole, and Mawson Stations, Antarctica and Cape Grim and Macquarie Island, Tasmania (Langenfelds et al., 2002); H₂ annual means from measurements made by Khalil & Rasmussen (1990) at Palmer Station, Antarctica, and Cape Grim, Tasmania, red diamonds and yellow stars- deepest 10 firn air measurements plotted against modeled mean age for South Pole and Megadunes respectively, the data have been adjusted for pore close-off fractionation; b) black markers- measured H₂ depth profile at South Pole ; blue line and shading- modeled depth profile using the atmospheric history plotted in blue in (a) with the propagated ±1σ uncertainty; the dashed black line indicates the top of lock-in zone; c) as in b) for Megadunes
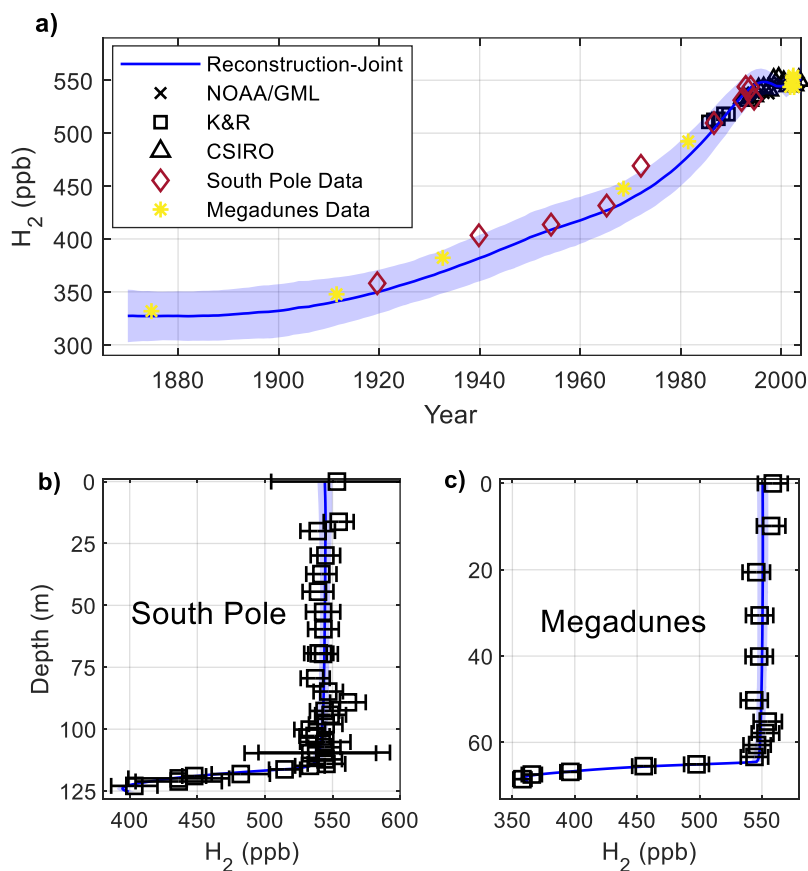
5. Comparison of firn air reconstructions with atmospheric flask measurements and previously published reconstructions

Petrenko et al. (2013) produced two atmospheric H_2 reconstructions from the NEEM firn air data. The reconstructions were generated using two different models: LGGE-GISPA and INSTAAR. Neither of those models include pore close-off fractionation, and Patterson et al. (2021) suggested that the maximum in atmospheric H_2 inferred from the NEEM firn air could be an artifact of ignoring pore close-off fractionation. Petrenko et al (2013) used the matrix inversion method of Rommelaere et al. (1997), which requires a prescribed smoothing parameter to fully constrain the inversion. Those results were corrected for a calibration revision (see Supplement) and are compared to our joint reconstruction (Figure 8a). The LGGE-GISPA reconstruction shows a rapid rise in H_2 levels from 1960-1990, and a rapid decrease from 1990-2008. The INSTAAR reconstruction shows H_2 levels rising more gradually from 1960-1985 and decreasing gradually thereafter. The rate of increase of H_2 levels between 1960 and 1980 in our joint reconstruction is very similar to the rates of increase in the LGGE-GISPA reconstruction. However, in our joint reconstruction, the rate of increase slows after 1980, and H_2 levels plateau by 1990. Here, we compare our reconstruction to available atmospheric H_2 flask measurements from the high northern latitudes in order to assess the validity of our reconstructed plateau during the 1990s (Figure 7).

Direct comparisons between the firn reconstructions and atmospheric measurements at other sites are complicated by spatial variability in H_2 levels in the high northern latitudes. The best temporal coverage for flask air H_2 measurements is from the Barrow, Alaska and Alert, Nunavut sampling sites. Both sites sample the boundary layer and are influenced by their proximity to seasonally active soils. H_2 levels over Greenland are more representative of the free troposphere due to higher elevation and remoteness from active soils. To make this comparison, we utilize NOAA/GML measurements at Alert, Nunavut and Summit, Greenland from 2010-present (revised to the MPI09 calibration scale; Pétron et al., 2023) and CSIRO measurements from Alert from 1992 onwards (also on the MPI09 scale).

During the 12 years of NOAA/GML measurements at Summit and Alert, the offset between Summit and Alert varies from a minimum of 18.9 ppb to a maximum of 29.4 ppb with a mean offset of 25.4 ppb ± 3.0 ppb (1σ) with Summit levels higher than Alert. We added this offset to the longer CSIRO Alert time series to generate a longer "synthetic Summit" flask history, assuming that the offset remains constant through time (Figures 4-5,7-8). The most conspicuous feature of the synthetic Summit history is a sharp peak in H_2 levels during 1998 which can be attributed to increased biomass burning emissions during the strong 1997-1998 ENSO event (Langenfelds et al., 2002; van der Werf et al., 2004). Firn air cannot resolve such high frequency variability due to diffusive smoothing, so that feature is absent from our reconstructions. Excepting the 1998 peak, synthetic Summit H_2 levels are largely constant between 525 and 515 from 1992-2013, in good agreement with our reconstructed 1990s plateau.
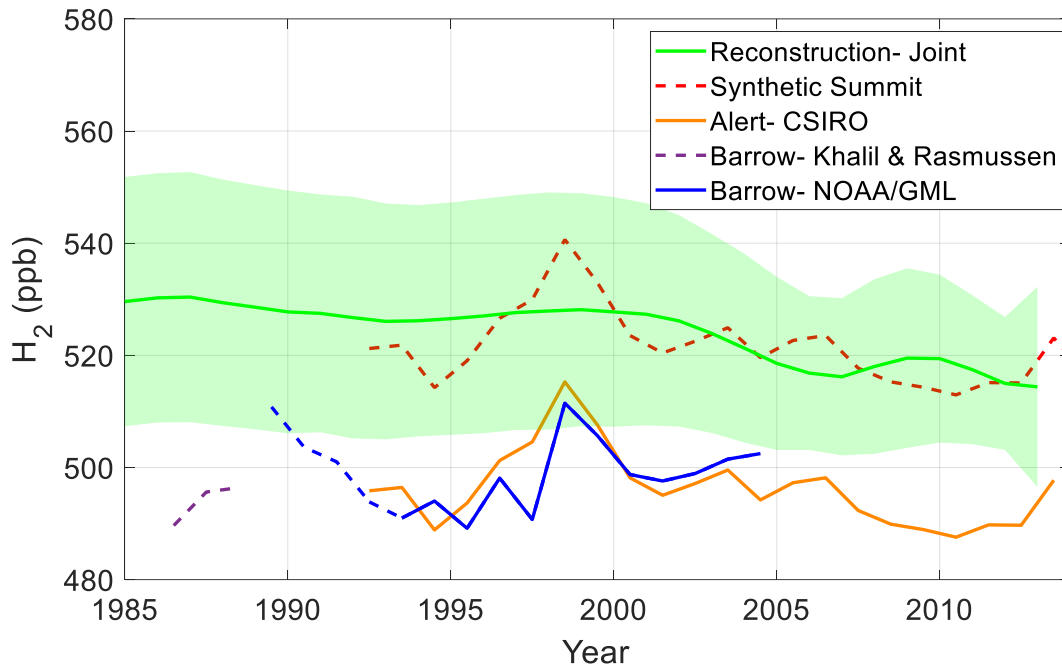
We also examined the atmospheric data for evidence of the H_2 maximum around 1990 indicated by the firn air reconstructions of Petrenko et al. (2013). If this peak had occurred in the atmosphere, we would expect similar trends at all

of the high latitude flask sites despite the differences in absolute H_2 levels. Here we examine flask measurements from Barrow, Alaska (Khalil & Rasmussen, 1990; NOAA/GML) and Alert, Canada (CSIRO; Figure 7). The measurements from NOAA/GML from 1992-2005 were corrected to the MPI09 calibration scale using the matched flask intercomparison project mentioned previously (Section 2.2). The Khalil & Rasmussen (1990) data are reported on an independent calibration scale which has not been intercompared to the MPI09 calibration scale. The Barrow data from Khalil & Rasmussen (1990) shows an increase in atmospheric H_2 of 2.1 ppb y^{-1} from 1985-1988 and the subsequent NOAA/GML data show a decrease in atmospheric H_2 from 1989-1993, at a rate of 5.0 ppb y^{-1}. The reason for the rapid decrease in observed H_2 levels in the NOAA/GML data is not clear. At that time, anthropogenic emissions of H_2 were likely decreasing but not rapidly enough to account for the observed decrease (Hoesly et al., 2018; Paulot et al., 2021). It is possible that the observed decrease is linked to NOAA's drifting calibration scale as discussed in Section 2.2. Together, the trends in these two data sets imply a maximum in atmospheric H_2 in 1989. However, the strength of this conclusion is questionable, because the flask intercomparison project did not include data prior to 1992. Furthermore, the NOAA/GML Barrow data are subject to additional uncertainty due to the single point calibration of those measurements and the non-linearity of the HgO-RGA detector used by NOAA/GML at the time. Further paleo-studies are warranted to investigate the brief but dramatic decrease in the Barrow data from 1989-1993. From 1993-2010, there is no discernible trend in atmospheric H_2 at either Barrow or Alert. Generally, the H_2 plateau from our joint reconstruction is more consistent with 1990s flask data than the sustained and dramatic decrease in the Petrenko et al. (2013) reconstructions.

Firn diffusion imposes smoothing on atmospheric histories and prevents the reconstruction of high frequency atmospheric variability. To test whether a brief, sharp decline in atmospheric H_2 prior to a plateau, as suggested by the flask measurements, is compatible with the firn air measurements, we forced the firn air model with a synthetic atmospheric history. The synthetic history was identical to the joint reconstruction before 1980. After 1980, H_2 levels in the synthetic history increase linearly to 546 ppb in 1989. There is a 5 ppb y^{-1} decrease from 1989- 1993 (as observed in the Barrow flask measurements) and subsequently H_2 levels are the same in the synthetic history as in the joint reconstruction. The depth profiles generated by the model when forced with the synthetic history show reasonable agreement with the measured firn H_2 (Figure S4). Therefore, a short, rapid decline in atmospheric H_2 levels around 1990 cannot be excluded as a possibility.

The results of the joint Antarctic reconstruction are compared to previously published reconstructions from those individual sites from (Patterson et al., 2020; 2021; Figure 8b). The differences between the joint reconstructions and the previously published reconstructions are relatively minor. The joint reconstruction shows a slower increase in H_2 levels prior to 1970 and a more rapid increase from 1970-1997 while the reconstructions of Patterson et al. (2020; 2021) show a more uniform rate of increase during the 20th century. This is likely due to the use of an arbitrary smoothing parameter in the earlier studies, while an autocorrelation function was used in the joint reconstruction. Additionally, there are small differences in the tuning of the firn air model compared to the earlier publications. The joint Antarctic reconstruction is in good agreement with available flask measurements from high Southern latitudes, which show H_2 levels rising throughout the 1990s and plateauing thereafter (Figure 8b).

Figure 7: Comparison of the joint Greenland firn air reconstruction with high northern latitude flask measurements. green line and shading- joint reconstruction as in Figure 5a; dashed red line- annual mean synthetic Summit H_2 history (Section 5; Pétron et al., 2023, Langenfelds et al., 2002); yellow line- annually-averaged flask measurements from Alert, Nunavut made by CSIRO (Langenfelds et al., 2002); dashed purple line- annually-averaged flask measurements from Barrow, Alaska made by Khalil & Rasmussen (1990); blue line- annually-averaged flask measurement from Barrow, Alaska made by NOAA/GML (Novelli et al., 1999; Novelli, 2006); Measurements from NOAA/GML were empirically corrected to the MPI09 calibration scale using a matched flask inter-comparison project between CSIRO and NOAA/GML. Note: measurements from Khalil & Rasmussen (1990) and NOAA/GML before 1993 are subject to additional calibration uncertainty as discussed in the text.
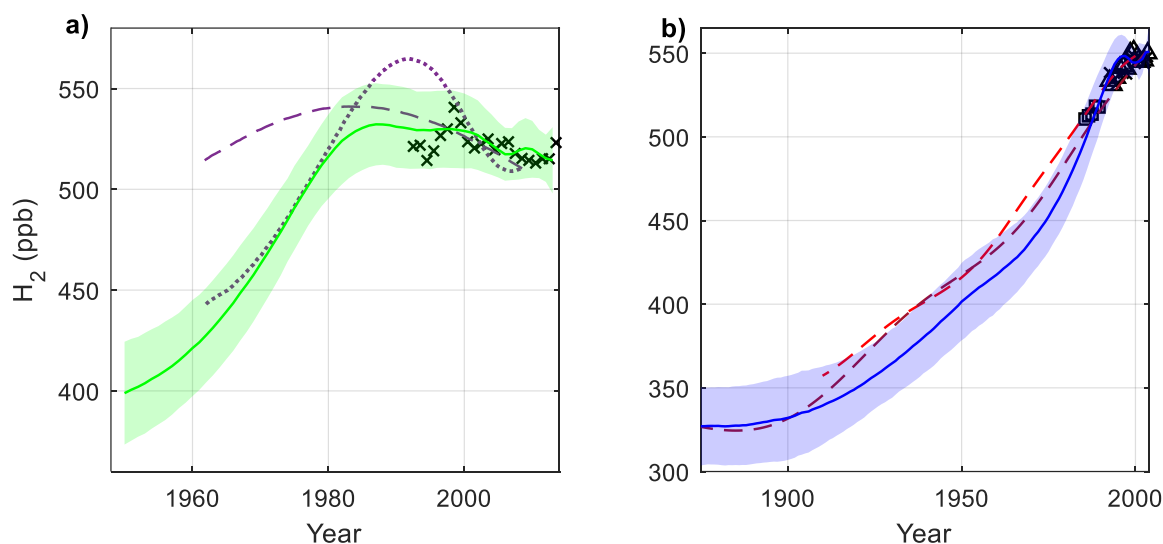
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6. *In situ* production

Previous research has found evidence for *in situ* production of CO in the Arctic snowpack. It is important to consider the possibility of in situ H_2 production at the Greenland sites because H_2 and CO are co-produced by the photooxidation of carbonyl-containing precursors. CO has been shown to be produced photochemically from CH_2O in surface snow (Hahn et al., 2001). At Devon Island, Canada CO levels in the firn increased steadily with depth in both the diffusive and lock-in zones, exhibiting clear evidence of in situ production (Clark et al. 2007). By contrast, NEEM and Summit firn air both exhibit CO maxima in the firn air column associated with a late 20th century atmospheric maximum, with CO levels decreasing with increasing depth (Petrenko et al., 2013). Petrenko et al. (2013) concluded in situ production at those sites was not sufficient to bias the atmospheric reconstruction. Those researchers used three lines of evidence to support their conclusion. First, the ice age at the depth of the observed lock-in zone CO peak is different at the two sites, so the peak cannot be attributed to a widely deposited layer of organic impurities. Second, the CO/CH_4 ratio at a given depth is in reasonable agreement at NEEM and Summit. CO and CH_4 have similar gas-phase diffusivities, so the mean age of the two

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gases at a given depth is comparable. CH_4 is known to be well preserved in Greenland firn air. If *in situ* production differentially affected CO levels at the two sites, it would be expected that CO/CH_4 ratios would diverge. Third, forcing a firn air model with an atmospheric flask derived CO history yields good agreement with the measured depth profile down to the top of lock-in zone where the firn air is too old to be constrained by flask measurements.

Greenland ice cores do exhibit evidence of *in situ* CO production. Early discrete measurements on Eurocore ice showed low, steady preindustrial CO levels (Hahn and Raynaud, 1998; Hahn et al., 1996). By contrast, Fain et al. (2022) reported higher and more variable CO levels from several Greenland sites (including NEEM) using continuous flow and discrete methods. The elevated CO levels were apparently associated with localized organic impurities in the ice. The high variability in CO detected by the continuous flow method is not compatible with continuous production in the firn, where such signals should be smoothed by diffusion. It is therefore likely that the high frequency variability observed by Fain et al. (2022) originated below the lock-in zone. However, the ice core data do not preclude the possibility of some in situ production having occurred in the overlying firn.

The production of CO in Greenland firn air and ice is not well understood, and no physical mechanism has been proposed that can explain all of the observations. If the production is photochemical, one would expect it to be much faster in the firn than in ice, due to the much larger actinic flux at the surface. Until the mechanism is established, it is difficult to assess whether and to what extent *in situ* production might influence firn air H_2. Depending on the depth and mechanism, production of H_2 in the firn column would cause a high bias during some or all of our atmospheric reconstructions. Further research on this issue is needed.

7. Summary and conclusions

In this study we use all available firn air measurements of H_2 at Greenland and Antarctic sites to reconstruct atmospheric H_2 levels over the past century. The joint Antarctic reconstruction covers the 1875-2003 period and is based on firn air measurements from South Pole and Megadunes (Patterson et al., 2020; 2021). That reconstruction shows good agreement with the atmospheric flask network since the late 1980s. The good fit between measured and simulated Ne enrichment obtained using the our firn air model gives us high confidence in the modelling of pore close-off fractionation at the Antarctic sites.

Reconstructing H_2 levels over Greenland is more challenging because of because of the additional tuning required to simulate the pore close-off induced enrichment of neon in the firn. To fit the neon firn data, we used one model configuration with an optimized but unrealistic closed porosity profile (*Mitchell_optimized*) and one model configuration that uses a more realistic, optimized closed porosity profile in conjunction with an optimized rate of bubble pressurization (*Compression*). To our knowledge, the rate of bubble pressurization in Greenland firn has not been studied in detail. Both model configurations yield improved agreement between modeled and measured neon at the Greenland firn sites with negligible effects on the model results for less permeable trace gases like CO_2 and CH_4 (Figure 2; Figure S5). The results of our reconstructions are insensitive to the choice of model configuration.

The *Mitchell_optimized* and *Compression* model configurations are empirical tuning methods and do not address uncertainty around the physics underlying the observed pore close-off induced enrichment in Greenland firn air. A path to increasing confidence in firn air reconstructions for H_2 is to obtain new observations of firn air chemistry with high resolution measurements of firn density, porosity, and bubble total air content. Absent additional measurements, we believe that the results presented in Figure 9 are the best estimate for the evolution (and uncertainty) of atmospheric H_2 during the 20th century over Antarctica and Greenland. Ice core records at high accumulation sites should also be collected in order to constrain H_2 levels over the late pre-industrial and industrial eras. Such records will be important to better understand the global H_2 cycle, the impact of human activities on H_2 in the past, and the atmospheric response to increasing anthropogenic H_2 emissions in a warming climate.

One surprising result is that our reconstructions show higher H_2 levels over Greenland than over Antarctica prior to 1990. This implies a reversal in the sign of the interhemispheric difference during the late 20th century. It is believed that Northern hemispheric H_2 levels are lower than Southern hemisphere levels today due to strong uptake of atmospheric H_2 by Northern hemisphere soils. The N/S interhemispheric difference in atmospheric H_2 occurs in spite of the fact that direct anthropogenic emissions of H_2 occur predominantly in the northern hemisphere. The dominance of northern hemispheric soil sink is largely a function of the asymmetry in land area between the two hemispheres. While the soil sink may vary over time due to changes in ecosystems, land use, or climate, a dramatic change would be required in order to have caused a reversal of the interhemispheric difference. In this respect, the firn air reconstructions present a challenge to our understanding of the global atmospheric H_2 budget. The reversal in the sign of the reconstructed interhemispheric is sensitive to our assumption the *in situ* production does not affect H_2 in the NEEM and Summit firn, and the careful examination of this assumption is warranted.
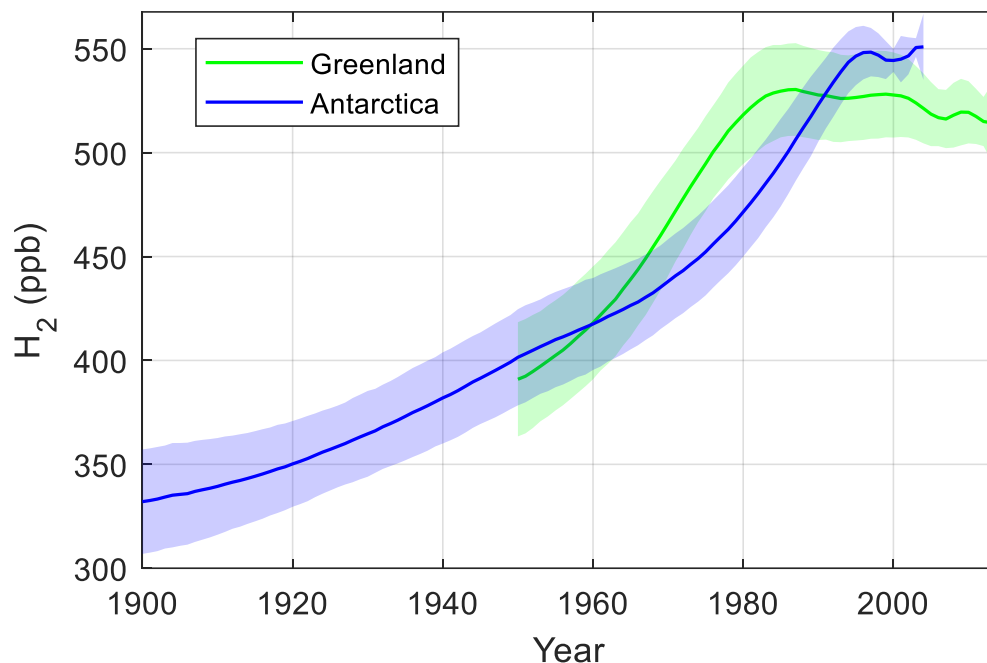
Figure 9: Best estimates for the atmospheric history of H₂ in Greenland and Antarctica over the past century. Green line- joint Greenland firn air reconstruction as in Figure 5a; Blue line- joint Antarctic firn air reconstruction as in Figure 6a;Shaded areas are ±1σ uncertainties.

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Data and code availability

The firn air model code and H_2 firn air depth profiles used in this research are available at the Dryad data repository (doi:10.5061/dryad.zkh1893gm).

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Author contributions

J.D.P. carried out the model simulations and data analysis; M.A. contributed to data analysis; A.M.C., G.P., R.L.L, and P.B.K. made calibration corrections and contributed atmospheric flask measurements; J.P.S. collected the field samples, measured $\delta^{22}Ne/N_2$, and assisted with firn air modeling; V.V.P collected field samples and contributed to firn air

715 measurements, E.S.S. contributed to modeling, data analysis, and editing the manuscript; and J.D.P. wrote the manuscript.

Competing interests

The authors declare that they have no conflict of interest.

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