
Supplementary information

Abrupt Common Era hydroclimate shifts drive west Greenland ice cap change

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Abrupt Common Era hydroclimate shifts drive west Greenland ice cap change

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Supplementary Material

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29 **1. Geodetic measurements**

30 We generated a digital elevation model for the ice cap using photogrammetric image data from the
31 Worldview-1 satellite, collected 9 September, 2012. The imagery was converted to a Digital
32 Elevation Model (DEM; Fig. 2a) using the Ames Stereo Pipeline software package¹. Spot checks
33 against field-collected GPS data suggest that the DEM is accurate to within 1-2 m over the ice
34 sheet.
35

36 **2. Ice-penetrating radar measurements**

37 We conducted a ground-based ice-penetrating radar (IPR) survey on the south face of the ice cap
38 during April 2014 using a monopulse radar system with 7-MHz loaded-dipole antennas. The
39 survey followed four flowlines and two contour lines spanning an area of around 1x3 km that
40 appeared crevasse-free on satellite imagery. Towards the end of the survey, a connector failed on
41 the radar system, leaving us with data on three out of the four flow lines. Additional data were
42 collected by NASA's Operation Ice Bridge which overflew the ice cap three times between 2014
43 and 2016 and measured ice thickness with the MCCORDS radar system. Radargrams from both
44 systems showed clear bed and surface returns, but no visible internal stratigraphy. On the
45 radargrams from our IPR survey, and on the level-1b IceBridge data products, we digitized the
46 surface and bed returns and calculated the ice thickness based on the difference between the two
47 using a wave velocity of $168 \text{ m } \mu\text{s}^{-1}$. Integrating the porosity from density measurements in the
48 ice core from the SE flank of the ice cap gave an equivalent air column of 11.3 m, which implies
49 a firn-air correction of 5 m for ice-thickness estimates.

50 We converted the ice-thickness measurements into estimates of the bed elevation using our
51 surface digital elevation model (Fig. 2a). The measurements reflect a very smooth domed structure
52 beneath the central part of the ice cap. Because our data distribution was somewhat irregular, and
53 because the structure of the height measurements appeared very smooth, we interpolated bed-
54 elevation between our measurements using a second-degree polynomial fit to the bed elevations:
55 $Z_p = 72.8x + 9.5y - 59.4xy - 20.7x^2 - 33.1y^2$. Here, x and y are offsets (km) relative to
56 70.489°N and 52.263°W (the point we eventually chose as our core location) in the Greenland
57 polar stereographic projection. This polynomial matches our bed-elevation estimates with a root-
58 mean-squared error of 1.5 m which is well within the expected error bounds for the data.
59

60 **3. Ground-penetrating radar measurements**

61 The 2014 radar survey team also carried a GSSI ground-penetrating radar (GPR) operating at 400
62 MHz. We processed the data with a bandpass filter with cutoff frequencies of 150 and 750 MHz.
63 The data showed strongly disturbed from the surface to the lower limit of the measurements, at
64 around 17 m depth. We found one layer that appeared to be marginally continuous on a path from
65 the summit to the east along the ridge, and back along one of the flowlines to the summit. The
66 depth to this layer varied from around 1.6 m at the summit to around 3.7 m at the eastern edge of
67 the survey. Other layers are apparently continuous over shorter distances in other parts of the
68 survey, but they were sufficiently disturbed that we did not feel that picking their depths would
69 add useful information to the data.
70

71 **4. Final ice core site selection**

72 At the time that we needed to pick a core location, we had a high-resolution photogrammetric
73 DEM of the ice cap, the 2014 ice-thickness measurements from IPR, and layering measurements
74 from GPR. At the time, we interpreted the layer in the GPR measurements as an isochrone, which

75 implied that the accumulation at the summit was about half that on the SE flank of the ice cap.
 76 Under this interpretation, the accumulation gradient was sharpest in within 100 m of the summit,
 77 and the accumulation rate was relatively constant beyond this. Although we did not have ice-
 78 thickness measurements on the flowline for which we had GPR thickness measurements, the close
 79 agreement between the polynomial fit and the bed-elevation measurements suggested that the bed
 80 elevation should be well constrained at a point around 250 m downhill from the summit. By not
 81 drilling exactly at the summit, we expected to avoid potential disturbances in the layering caused
 82 by small-scale orographic accumulation variations, and to avoid some potential disturbances
 83 caused by divide migration in the past. Our final selected location was 70.489°N, 52.263°W, for
 84 which we estimated the ice thickness, based on our bed and surface models, to be 153 m, with an
 85 uncertainty of 5-10 m based on the bandwidth of the ground based IPR and the rise time of the bed
 86 return in the airborne radar data. The ice-equivalent thickness, equal to the measured thickness
 87 minus the equivalent air column height calculated from the density profile, is 142 m_{ice}.
 88

89 5. Nuussuaq ice cap strain inversion

90 We formed an initial estimate of the age-depth scale for our core based on a thinning function,
 91 $C(t)$, that gives the ratio of the ice-equivalent thickness of a layer deposited in year t to its original
 92 thickness when it was deposited at the surface, and a time-variable layer thickness, $\theta_0(t)$. In this
 93 model, the thickness of any layer found in the core is:

$$94 \theta_c(t) = C(t)\theta_0(t) . \quad (S1)$$

95
 96
 97 The depth for the age-depth scale for time t is found by adding the thicknesses of all layers with
 98 ages less than t . The thinning function $C(t)$ is estimated based on a one-dimensional flow model
 99 for a constant accumulation rate, in which the vertical strain rate, $\dot{\epsilon}(z)$, at any height z above the
 100 ice cap bed $0 \leq z \leq H$ (where H is the surface height) is proportional to the horizontal velocity,
 101 $u(z)$. If the basal velocity is zero, and if the ice temperature does not vary strongly with depth,
 102 then integrating Glen's flow law²⁻⁴ from the bed to height z gives:

$$103 u(z) = u_H \left[1 - \left(1 - \frac{z}{H} \right)^{n+1} \right], \quad (S2)$$

104 where the creep exponent $n = 3$ is prescribed following convention². If $\dot{\epsilon}(z)$ is proportional to
 105 $u(z)$, then

$$106 \dot{\epsilon}(z) = -\dot{\epsilon}_H \frac{u(z)}{u_H} . \quad (S3)$$

107
 108 where $\dot{\epsilon}_H$ and u_H denote the vertical strain rate and horizontal velocity at the ice cap surface,
 109 respectively. The integral of the vertical strain rate from the bed to the surface gives the vertical
 110 velocity, w , at the surface^{2,4}, equal to:

$$111 w_H = -\dot{\epsilon}_H \left(H \frac{n+1}{n+2} \right), \quad (S4)$$

112 or, solving for $\dot{\epsilon}_H$ gives the surface vertical strain rate:
 113
 114
 115
 116
 117
 118

$$\dot{\epsilon}_H = -\frac{w_H}{H} \frac{n+2}{n+1} . \quad (\text{S5})$$

120

121 This expression is similar to that for the mean strain rate (equal to the accumulation rate divided
 122 by the ice thickness) but because the strain rate near the bed is small, the surface strain rate must
 123 be larger than the mean. The final expression for the vertical strain rate as a function of height
 124 above the bed is then:

125

$$\dot{\epsilon}(z) = \dot{\epsilon}_H \left[1 - \left(1 - \frac{z}{H} \right)^{n+1} \right] . \quad (\text{S6})$$

127

128 The vertical velocity at any depth is found by integrating $\dot{\epsilon}(z)$ from the bed to z :

129

$$w(z) = -\dot{\epsilon}_H H \left[1 - \frac{1}{n+2} - \left(\mu - \frac{1}{n+2} \mu^{n+2} \right) \right] . \quad (\text{S7})$$

131

132 Here, $\mu = 1 - \frac{z}{H}$. An idealized steady-state age-depth scale for time t can be found by integrating
 133 the position of a particle as it traverses the vertical-velocity field from the surface at time $-t$ to t
 134 $= 0$ using the vertical-velocity depth profile (S7). The thinning function $C(t)$ is the exponential of
 135 $\dot{\epsilon}_H$, integrated as a function of time along a layer's path from H to its final depth, z :

136

$$C(t) = \exp \left[\int_{-t}^0 \dot{\epsilon}(z(t)) dt \right] . \quad (\text{S8})$$

138

139 Age-depth scales calculated using this scheme depend on the initial layer thickness (i.e.,
 140 accumulation rate) and the total ice thickness. If the accumulation rate varies in time, then during
 141 the time between a layer's deposition at the surface and its recovery in an ice core, the ice cap
 142 thickness will change, and the thinning rate will in general be different from that given by S8 for
 143 constant w_H . However, as long as the thickness variation over the lifetime of a layer is small, we
 144 expect that layer thicknesses calculated with S8 will not differ substantially from those of a steady-
 145 state model with w_H equal to the temporal mean of the accumulation rate, \dot{b}_0 . Under this
 146 assumption, we calculate an age-depth scale from S1 using $C(t)$ from S8 and $w_H = -\dot{b}_0$ in S5.
 147 Under this assumption, we expressed the age-depth scale, $\delta(t)$, as a linear function of $\dot{b}(z(t))$ and
 148 a non-linear function of \dot{b}_0 and the ice cap "reference" thickness, H_0 :

149

$$\delta(t) = \dot{b}_0 \sum_{i=0}^t s_i C(t_i) . \quad (\text{S9})$$

151

152 Here s_i is a set of scaling values quantifying the ratio between the original annual layer thickness,
 153 \dot{b}_i , and \dot{b}_0 for each year i of the model. Age constraint depths specify a few of the estimated 1935
 154 annual layers in the core, but to calculate $\delta(t)$ we need to find estimates of s_i for the remaining
 155 layers. Alone, (S9) does not allow a unique solution for these quantities for all \dot{b}_0 and H , so we
 156 look for a set of solutions that give the least-complex accumulation histories that match the
 157 measured layer dates to within their estimated age-constrained depth uncertainties (σ_k). These
 158 solutions minimize the cost function:

159

$$J = \sum_{k=1}^n \left(\frac{\delta(t_k, \dot{b}_0, H_0) - \delta_{0,k}}{\sigma_k} \right)^2 + \lambda \sum_{i=0}^t (s_i - 1)^2 . \quad (\text{S10})$$

161
 162 The scalar λ is a weight value that specifies the relative importance of the layer thicknesses and
 163 the data misfits in determining J . Minimizing the first term improves the match between δ_t at the
 164 n age-constrained depths ($\delta_{0,k}$), minimizing the second term yields a simpler solution; minimizing
 165 both at the same time gives solutions that balance between the two, the particulars of the solution
 166 depending on the choice of λ .

167
 168 The n age-constrained depths only provides information about the thickness of groups of layers,
 169 not on individual layers, so to further simplify the problem, we assume that s is constant between
 170 pairs of depth picks, thus specifying a mean accumulation rate for the interval t_k to t_{k+1} . With
 171 this simplification, (S10) becomes:

$$173 \quad J = \sum_{k=1}^n \left(\frac{\delta(t_k, \dot{b}_0, H_0) - \delta_{0,k}}{\sigma_k} \right)^2 + \lambda \sum_{i=0}^k (t_{k+1} - t_k) (s_k - 1)^2. \quad (\text{S11})$$

174
 175 Here s_k is the constant scaling value applied to all of the layer thicknesses between two measured
 176 layer ages. To express this equation as a set of matrix multiplications, we use the notation:

$$178 \quad J = (\mathbf{G}\mathbf{s} - \delta_0)^T \boldsymbol{\Sigma}^{-1} (\mathbf{G}\mathbf{s} - \delta_0) + \lambda (\mathbf{s} - 1)^T \mathbf{W} (\mathbf{s} - 1), \quad (\text{S12})$$

179
 180 with bolded-capitol denoting a matrix, bolded-lowercase a vector and unbolded-lowercase a scalar.
 181 Here,

$$182 \quad \mathbf{G} = \begin{bmatrix} g_{11} & 0 & \dots & 0 & \dots & 0 \\ g_{21} & g_{22} & \dots & 0 & \dots & 0 \\ \vdots & \vdots & \ddots & \vdots & \ddots & \vdots \\ g_{k1} & g_{k2} & \dots & g_{kk} & \dots & 0 \\ \vdots & \vdots & \ddots & \vdots & \ddots & \vdots \\ g_{n1} & g_{n2} & \dots & g_{nk} & \dots & g_{nn} \end{bmatrix}, \quad (\text{S13})$$

184 wherein,

$$186 \quad g_k = \dot{b}_0 \int_{t_{k-1}}^{t_k} C(t, \dot{b}_0, H_0) dt, \quad (\text{S14})$$

188
 189 That is, \mathbf{G} is a lower-triangular $n \times n$ matrix comprised of idealized ice equivalent thicknesses
 190 (predicted ice equivalent thicknesses under some combination of prescribed steady-state \dot{b}_0 and
 191 H_0) between the surface and n age-constrained depths. The $n \times 1$ vector \mathbf{s} consists of the n mean
 192 accumulation rate scale values for intervals t_k to t_{k+1} . $\boldsymbol{\Sigma}$ is a diagonal matrix consisting of the n
 193 squared depth uncertainty values (σ^2). In the second term, \mathbf{W} is a diagonal matrix consisting of δ_t
 194 $= [(t_1 - 0) \dots (t_k - t_{k-1}) \dots (t_n - t_{n-1})]$.

195
 196 For a given value of λ , J is minimized by \mathbf{s} for which $\frac{dJ}{ds} = 0$; that is, the least squares solution to
 197 (S14). We assume that if the error estimates for our layer picks are well prescribed and the errors
 198 Gaussian normal, the first term of (S12) for the true age-depth relationship will have a χ^2 -
 199 distribution with $n - 1$ degrees of freedom. We solved (S12) for \mathbf{s} for different values of λ , which

200 gave us a range of χ^2 values. We identified the \mathbf{s} that corresponds to $\chi^2 = n - 1$ to be the locally
201 optimum model: the simplest model that matches the data to within the specified error tolerances
202 under prescribed \dot{b}_0 and H_0 .

203

204 We summarize the mapping between data and model in Eq. 1 of the main text as $T(\mathbf{m}, \dot{b}_0, H_0)$,
205 which is equivalent to $\mathbf{G}\mathbf{s}$ for \mathbf{G} evaluated for \dot{b}_0 and H_0 . Likewise, \mathbf{m} is equivalent to $\mathbf{s}\dot{b}_0$.

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Table S1: Age-constraint depths identified for the NU core, with attribution to the event horizon, and parameters used to identify it.

Year (CE)	Depth (m w. eq.)	Uncertainty (1σ yrs)	Tie attribution	Parameter(s) used	Citation
169.5	114.63	50	Volcanic eruption - ?	ECM, Cond.	⁵
269.5	113.83	15	Volcanic eruption - ?	ECM, S, Cond.	^{5,6}
281.5	113.62	10	Volcanic eruption - ?	ECM, Cond.	⁵
424.5	112	5	Volcanic eruption - ?	ECM, S, Cond.	^{5,6}
536.5	110.8	5	Volcanic eruption - El Chichon, Mexico	ECM, Cond., S, Pb	^{5,6}
574.5	110.37	5	Volcanic eruption - El Salvador	Cond., S, Pb	⁵
626.5	109.77	5	Volcanic eruption - ?	ECM, Cond., S, Pb	⁵
682.5	108.97	5	Volcanic eruption - Jombolok, Central Asia	ECM, Cond., S, Pb	⁵
750.5	107.59	2	Volcanic eruption - ?	S, Cond., Part.	⁵
777.5	106.91	3	Pb - step function	Pb	⁶
853.5	105.45	1	Volcanic eruption - ?	Pb	⁵
879.5	104.93	2	Volcanic eruption - ?	S	⁵
903.5	104.41	1	Volcanic eruption - ?	S	⁵
940.5	103.51	1	Volcanic eruption - Eldgjá, Iceland	S, Pb, Cond.	⁵
977.5	102.51	2	Volcanic eruption(s) - ?	S, Pb	^{5,6}
1020.5	101.41	2	Volcanic eruption - ?	S, Pb, Cond.	⁵
1028.5	101.23	1	Volcanic eruption - ?	Part., S, Pb, Cond.	⁵
1110.5	98.81	5	Volcanic eruption - Mt. Asama, Japan	S	^{5,6}
1145.5	97.815	3	Pb - step function	Pb	⁶
1159.5	97.27	3	Pb - step function	Pb	⁶
1172.5	96.69	3	Volcanic eruption - ?	S	⁵
1182.5	96.33	3	Volcanic eruption - ?	S, Pb, Cond.	⁵
1192.5	96.01	3	Volcanic eruption - ?	S, (Pb), Cond.	⁵
1201.5	95.75	2	Volcanic eruption - ?	S, Pb, Cond.	⁵
1222.5	94.81	2	Pb-depositional horizon	Pb	⁶
1231.5	94.53	3	Volcanic eruption - Lipari, Italy	S, Pb	^{5,6}
1259.5	93.353	3	Volcanic eruption - Samalas, Indonesia	S	⁵
1288.5	92.15	5	Volcanic eruption - ?	S, Pb	^{5,6}
1330.5	89.938	2	Volcanic eruption - Mt. Etna, Italy	S, Pb, Cond.	⁵
1345.5	89.09	2	Volcanic eruption - Popocatepetl, Mexico	S, Pb, Cond.	⁵
1358.5	88.51	3	Volcanic eruption - ?	Pb, S	^{5,6}
1391.5	86.71	3	Volcanic eruption - Hekla, Iceland	Pb, S	^{5,6}
1442.5	84.19	3	Volcanic eruption - ?	S	⁶
1477.5	82.15	2	Volcanic eruption - Sangeang Api, Indonesia	Pb, S, Cond.	⁵
1502.5	80.85	3	Volcanic eruption - ?	S, Cond.	⁵
1512.5	80.05	3	Volcanic eruption - ?	S, Pb, Cond.	⁵
1537.5	78.43	3	Volcanic eruption - ?	S, Cond.	⁵
1554.5	76.85	3	Volcanic eruption - ?	S, Pb, Cond.	⁵

1569.5	75.73	3	Volcanic eruption - Tambora, Indonesia(?)	Pb, S	5,6
1585.5	74.31	3	Volcanic eruption - (?)	S, Pb, Cond.	5
1601.5	72.838	1	Volcanic eruption - Huaynaputina, Peru	S, Pb, Part., Cond.	5
1642.5	69.21	1	Volcanic eruption - Parker, Phillipines	S, Pb, Part., Cond.	5
1667.5	67.01	1	Volcanic eruption - Mt Tarumae, Japan	S, Pb, Part., Cond.	5
1696.5	64.35	1.5	Volcanic eruption - Sabancaya, Peru	S, Pb, Part., Cond.	5
1739.5	59.95	1	Volcanic eruption - Mt. Tarumae, Japan	S, Pb, Part., Cond.	5
1766.5	56.65	1	Volcanic eruption - Hekla, Iceland	S, Pb, Part., Cond.	5
1783.5	54.43	0.5	Volcanic eruption - Laki, Iceland	S, Pb, Ti, Part., Cond.	5,7
1816.5	48.634	1	Volcanic eruption - Tambora, Indonesia	S, Pb, Ti, Part., Cond.	5,7
1836.5	45.47	1	Volcanic eruption - Cosigüina, Nicaragua	S, Pb, Ti, Part., Cond.	5,7
1863.5	41.19	1	Volcanic eruption - Makian, Indonesia	S, Pb, Ti, Part., Cond.	5,7
1873.5	39.27	0.5	Volcanic eruption - Grímsvötn, Iceland	S, Pb, Ti, Part., Cond.	5,7
1884.5	37.01	1	Volcanic eruption - Krakatoa, Indonesia	S, Pb, Ti, Part., Cond.	5,7
1912.5	30.67	1	Volcanic eruption - Novarupta, AK	S, Pb, Ti, Part., Cond.	5,7
1955.5	19.95	1	Radiogenic (bomb horizon)	²³⁹ Pu	8
1962.5	17.81	1	Radiogenic (bomb horizon)	²³⁹ Pu	8
2015.42	0	0	Core top	N/a	~

213 **References**

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