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## Supplemental Information

# Into Thick(er) Air? Oxygen Availability

## at Humans' Physiological Frontier on Mount Everest

Tom Matthews, L. Baker Perry, Timothy P. Lane, Aurora C. Elmore, Arbindra Khadka, Deepak Aryal, Dibas Shrestha, Subash Tuladhar, Saraju K. Baidya, Ananta Gajurel, Mariusz Potocki, and Paul A. Mayewski

## **Supplemental Information**

## **Supplemental Figures and Tables**



**Figure. S1: Atmospheric circulation during the 20 events of lowest air pressure on the summit** 

**of Mount Everest**, related to Fig. 3A. Colour ramp shows the wind at the 250 hPa pressure level, and 6 the dotted red lines indicate the position of the wave crests identified by the algorithm described in the 7 Transparent Methods (Atmospheric Circulation During Low Pressure Events).

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13 **Table S1. CMIP5 models used in the analysis,** related to Fig 5 (C and D). Note that for each model 14 we employed ensemble member R1i1p1 of the RCP8.5 experiment.

## 15 **Transparent Methods**

## 16 **Estimation of Mt. Everest Summit Air Pressure**

- 17 We use observations from the South Col (7,945 m) and Balcony (8,430 m) automatic weather stations
- 18 (AWSs) deployed on the main southern (Nepalese) climbing route during the 2019 National Geographic
- 19 and Rolex Perpetual Planet Everest Expedition (Matthews et al., 2020). For the South Col, hourly mean
- 20 air pressure data were employed from 06:00 UTC May 22, 2019 to 06:00 UTC July 1, 2020. At the

21 Balcony, the record used is shorter (01:00 UTC May 23, 2019 to 05:00 UTC January 20, 2020), as that 22 station stopped transmitting during the 2019/2020 winter.

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24 To reconstruct air pressure over the longer-term, we used the ERA5 reanalysis from the European 25 Centre for Medium Range Weather Forecasting (Hersbach et al., 2020). We extracted hourly 26 geopotential height, air temperature and wind speed on pressure surfaces for the full period of data 27 availability at the time of analysis (00:00 UTC on January 1, 1979 to 21:00 UTC on June 20, 2020) and 28 then bi-linerarly interpolated these data to the location of Mt. Everest's summit (27.98 °N, 86.93 °E). Air 29 pressure was also interpolated to the location of the longer-running South Col AWS (7,945 m), where 30 an empirical quantile mapping procedure was used to remove systematic bias (Gudmundsson et al., 31 2012): 32 33  $P_c = f(P_r, x, y)$  $34$  Eq. 1 35 Where  $f$  is a function that interpolates to find the corrected value of the South Col reanalysis air 36 pressure  $(P_0)$ , given the uncorrected reanalysis data  $(P_0)$  and ordered samples *x*, *y*: 37 38  $x = g^{-1}(P_{r-cal}, q)$  $39$  Eq. 2 40 and: 41  $y = g^{-1}(0, q)$  $42$  Eq. 3 43 Where  $P_{r-c}$  is the air pressure subset of reanalysis data that overlaps with the AWS observations 44 (06:00 UTC May 22, 2019 to 21:00 UTC on June 20, 2020);  $\ddot{o}$  is the observed air pressure at the South 45 Col AWS; gis vector of quantiles (0.01 to 0.99 in increments of 0.01); and g is the cumulative distribution 46 function. Note that the interpolation was only applied to values of  $R_r$  within the range of  $P_{r-cal}$ ; values 47 outside were adjusted with:  $P_c = P_r + \{g^{-1}(0, k) - g^{-1}(P_{r-cal}, k)\}\$ , where k adopts values of 0.01 and

48 0.99 when  $R_r$  is below and above the range of  $P_{r-cal}$ , respectively.

49

50 Air pressures were then estimated at the summit of Mt. Everest according to the hypsometric equation 51 (Stull, 2015):  $P_2 = P_1 \times exp(\frac{z_1 - z_2}{gT})$  $aT_v$ 52  $P_2 = P_1 \times exp(\frac{1}{\pi})$  $53$  Eq. 4 54 where  $P_x$  denotes air pressure at height  $z_x(m)$ , a is constant (29.3 m K<sup>-1</sup>) and  $\overline{T_v}$  is the mean virtual air 55 temperature (K) between heights  $z_1$  and  $z_2$ . 56 57 We rewrite Eq. 4 to get the gradient in (log) air pressure as a function of elevation  $\left(\frac{\ln(p_2)-\ln(p_1)}{a}\right)$ 58  $\left(\frac{ln(p_2)-ln(p_1)}{z_1-z_2}\right) = \Delta ln(P)/\Delta z$ :  $\Delta ln(P)/\Delta z = aT_v^{-1}$ 59  $60$  Eq. 5 61 Enabling air pressure at the summit  $(P_s)$  to be evaluated from (corrected) air pressure at the South Col: 62  $P_s = P_c \times exp(\frac{903}{gT})$  $aT_v$ 63  $P_s = P_c \times exp(\frac{1}{\pi r})$ 64 Eq. 6 65 Where 903 (m) is the vertical separation between the South Col and the 8,850 m summit. 66 67 To enable application of Equation 6, it is necessary to know  $\overline{T_v}$  between the South Col and the summit, 68 which we estimated from: 69  $\overline{T_v} = 0.5 \times (2 \times T_{col} + \Gamma \Delta z)$  $70$  Eq. 7 71 where  $T_{col}$  is the ERA5 air temperature interpolated from pressure levels to the location of the South 72 Col AWS; and  $\Gamma$  is the temperature lapse rate  $(\Delta T/\Delta z)$ , obtained from the air temperature and 73 geopotential height on the 300 and 400 hPa pressure surfaces (a conservative selection intended to 74 bound the maximum pressure at the South Col and minimum pressure at the summit). Any biases in 75 the renalysis  $\overline{T_v}$  will, however, affect our assessment of the vertical (log) pressure gradient (Eq. 7). To 76 correct for this, we used air pressures at the Balcony and South Col AWSs to estimate the hourly vertical

77 gradient in log pressure, and regressed this on concurrent  $a\overline{T_v}^{-1}$  for the overlapping period. Substitution

78 into Eq. 6 enables the summit pressure to be estimated using these empirically determined slope  $(\beta)$ 79 and intercept  $(\alpha)$  regression terms:

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$$

 $P_s = P_c \exp(\frac{903}{\gamma + \beta})$  $\alpha + \beta (aT_v)$ 81  $P_s = P_c \exp(\frac{P_s}{R} + P_s \sqrt{P_s} + P_s \sqrt{P_s} \sqrt{P_s} + P_s \sqrt{P_s \sqrt{P_s + P_s \sqrt$ 

 $82$  Eq. 8

 $P_s$  was reconstructed for the complete calendar years 1979-2019. Day of year quantities presented in the text and Fig. 2 were computed by first computing the statistic for the respective day (1-366), and then smoothing these values via convolution with a Gaussian filter set to have a standard deviation of seven days.

#### 87 **Oxygen Availability and VO2 max**

88 Air pressure was converted to VO<sub>2</sub> max by first calculating the partial pressure of inspired oxygen ( $P_{io}$ ): 89  $P_{io} = 0.2095 \times (P_s - 62.9)$  $90$  Eq. 9 91 where 62.9 (hPa) is the saturation vapour pressure at the human body's core temperature of 37 °C, and

92 0.2095 represents the volume fraction of oxygen in the atmosphere (Wallace and Hobbs, 1977).

93

94 We then rearranged the regression equation of Bailey (2001) (who synthesised the results of Pugh et 95 al., 1964; Sutton et al., 1988; and West et al., 1983b) to obtain the aerobic capacity (VO<sub>2</sub> max, ml kg<sup>-1</sup> 96 min<sup>-1</sup>) of acclimatized individuals as a function of  $P_{io}$  (in hPa):

97  $V0_2 max = \frac{ln(P_{io} \times 0.750) - 3.25}{0.0308}$ 

98 Eq. 10

99 Equations 9 and 10 therefore enable changes in summit air pressure to be communicated in terms of 100 aerobic impact -- the reduction in  $VO<sub>2</sub>$  max due to declining oxygen availability. Bailey (2001) estimate 101 a minimum of 12.25 ml kg<sup>-1</sup> min<sup>-1</sup> (3.5 metabolic equivalent expenditures: METs) is required to safely 102 ascend Mt. Everest, assuming summertime conditions, and that climbers are operating at around 85 % 103 of their VO<sub>2</sub> max. Inserting this value into Eq. 10 and solving for  $P_s$  (via Eq. 9) yields a threshold air 104 pressure of 302 hPa at the summit for Mt. Everest to be climbable without supplemental oxygen. As 105 discussed in the Limitations (main text), we note that variation in VO<sub>2</sub> max amongst mountaineers is not  accounted for here, and the 302 hPa threshold we identify is representative of fit mountaineers. Some climbers (including elite climbing Sherpa; Brutsaert, 2008; Garrido et al., 1997; Gilbert-Kawai et al., 2014) will have even higher VO2 max than determined by Eq. 10, and may therefore be able to complete an oxygenless summit at air pressures below 302 hPa.

#### **Atmospheric Circulation During Low Pressure Events**

 Low pressure events were defined as the 20 lowest hourly air pressure values, separated from other minima by at least two days. To explore atmospheric circulation during these events, we composited the height of the 300 hPa surface (the pressure level closest to the summit of Mt. Everest), and wind velocity at the 250 hPa surface (where the subtropical jet stream is normally located; Ren et al., 2011). Inspection of the composite (Figure 3B), and of the circulation during the individual events (Supplementary Information, Figure S1), indicated the presence of a well-defined upper-level trough with its axis centred at the longitude of Mt. Everest. For each of the 20 waves we calculated the zonal distance from Mt. Everest's summit to the well-defined ridge crest often found to the east, whose location was identified as the longitude with maximum geopotential height along 28 °N, 30-86.9 °E. 120 Doubling this zonal distance provided an estimate of the wavelength  $(\lambda)$  for each of the waves. The time 121 taken for these waves to transit Mt. Everest was estimated using their phase speed  $(c)$ , calculated assuming barotropic instability, which is a reasonable approximation away from the polar front (Stull, 2015):

 $c = -\frac{2\Omega}{R}cos(\theta) \times \left(\frac{\lambda}{2\pi}\right)$ 125  $c = -\frac{2\Omega}{R}cos(\theta) \times \left(\frac{\lambda}{2\pi}\right)^2 + U_{500}$ 

Eq.11

127 where  $\Omega$  is the Earth's angular velocity (7.29  $\times$ 10<sup>-5</sup> radians s<sup>-1</sup>), R is the Earth's radius (6.371  $\times$ 10<sup>6</sup> m), 128  $\theta$  is the latitude (set to 28 °N here), and  $U_{500}$  is the mean wind velocity (m s<sup>-1</sup>) at the 500 hPa level, averaged over the rectangular region 20-40 °N, 30-150 °E. The time taken for the wave trough to 130 arrive/depart Mt. Everest was then evaluated as  $\frac{\lambda}{2c}$ . It is this time horizon which is marked with vertical red lines in Figure 3A.

## **Air Pressure and Oxygen Availability During Summit Climbs**

 The Himalayan Database (Hawley and Salisbury, 2007) provides a comprehensive history of Mt. Everest mountaineering. We used it here to identify successful climbs without supplemental oxygen over the period 1979-2019, extracting reconstructed summit air pressure for the hour that each climber reached the peak. For 19 of these 208 ascents, the exact time was not recorded, so we estimated the summit pressure at the time of ascent using a Gaussian weighted average (with a standard deviation of 3.5 h) centred at 12:00 Nepal Time (NPT) on the day of the successful climb. These choices reflect the mean and standard deviation of summit times across the 189 records that recorded this information.

#### **Estimates of Work Rate and Climbing Speed**

141 Estimates of maximum work rate  $(W)$  were informed by the empirical relationship outlined by West et 142 al. (1983b). We digitized the regression line plotted in their Fig. 2, extracting the slope ( $\beta$ ) and intercept 143  $(\alpha)$  coefficients to enable conversion between quantities.:

- 
- 145  $W = \beta \times VQ_2max + \alpha$

Eq. 12

147 The value of  $\beta$  and  $\alpha$  were, respectively, determined to be 41.54 kg<sup>2</sup> m ml<sup>-1</sup>, and -255.96 kg m min<sup>-1</sup>. 148 Before applying Eq. 12, we reduced each VO<sub>2</sub> max by 15 % to acknowledge that mountaineers likely 149 climb at 85 % of their VO<sub>2</sub> max (Bailey, 2001). Wis in units of kg m min<sup>-1</sup>, and the speed of vertical ascent 150 (m min<sup>-1</sup>) can be isolated if the mass (kg) of the mountaineer is prescribed. Following West et al. (1983b), we set the mass of the hypothetical climber (including equipment) to 100 kg. Note that because 152 *Wis a function of VO<sub>2</sub>, work rates and climbing speeds should be interpreted as representative of fit* mountaineers, but not necessarily elite climbing Sherpa (see Limitations in main text).

#### **The Impact of Climate Change on Summit Pressure**

 To summarise changes in summit pressure over the period of ERA5 reconstruction (1979-2019), we computed the monthly minimum, mean, and maximum summit pressures. Rates of change were then summarised for these quantities using the Theil-Sen slope estimation method (Sen, 1960; Theil, 1950). The respective trends were termed *significant* if zero lay outside the 95 % confidence interval of the slope estimate.

 We used daily mean pressure level CMIP5 output from 21 models forced by the RCP8.5 experiment (Taylor et al., 2011) to determine the sensitivity of Mt. Everest summit air pressure to global mean warming. For each model (listed in Table S1) the same interpolation method applied to the ERA5 reanalysis data to estimate summit pressure was employed. We also extracted the respective near-165 surface global mean air temperature  $(T_a)$  simulated by the corresponding model.

167 The sensitivity of Mt. Everest summit pressure to changes in  $T_a$  was then evaluated using the change factor approach (Osborn et al., 2016). Briefly, this comprised (i) estimating the modelled sensitivity of summit pressures to changes in global mean temperature; (ii) multiplying this sensitivity by a prescribed temperature perturbation; and (iii) adding this result to air pressures in the baseline climate. We 171 achieved (i) by first smoothing CMIP5  $P_s$  and  $T_g$  with a running 30-year mean filter, and then regressing  $P_s$  upon  $T_a$ . Regressions were performed on a seasonal basis, assessing the sensitivity of the (30-year mean) monthly minimum, maximum, and mean summit pressures to climate warming. The results from this analysis were a 21-member ensemble of regression slope coefficients indicating the sensitivity 175 ( $\beta_{month}^{stat}$ , hPa °C<sup>-1</sup>) to statistic *stat* (minimum, maximum or mean) in the respective <sub>month</sub>. The monthly stratification of the regression coefficients was warranted because for mean and minimum summit pressure, a single factor ANOVA indicated significant differences across months (*p* < 0.01). Evidence for different sensitivities of maximum summit pressure across months was weaker (*p* = 0.13), but we kept the monthly stratification to be consistent across statistics.

181 For each model, steps (ii) and (iii) were achieved by transforming the sensitivities ( $\beta_{month}^{stat}$ ) to absolute 182 values of air pressure  $(P_{s_{month}}^{\overline{stat}})$  given prescribed changes ( $\Delta$ ) to  $T_g$ through:

**183**  $P_{s_{month}}^{Stat} = \beta_{month}^{stat} \Delta T_g + P_{s_{month}}^{stat}$ 

Eq. 13

185 where  $P_{s_{month}}^{stat}$  is the 1981-2010 statistic for the respective month in the ERA5 reconstructed summit air 186 pressure series. The median, 5<sup>th</sup>, and 95<sup>th</sup> percentiles of  $\beta_{month}^{stat}$  across the model simulations were used to indicate, respectively, the central estimate and uncertainty in application of Eq. 13. Annual means, minima and maxima were then evaluated for the respective climates by calculating the relevant statistic from these transformed series. We characterized departures from the 1981-2010 global mean air

- 190 temperature using the HadCRUT4 dataset (Morice et al., 2012). Note that according to these data, this
- 191 period was 0.60 °C warmer than preindustrial, defined here as 1850-1879.

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