

Supporting Information for

## **Climate Models Underestimate Pre-Industrial Fire Emissions**

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## **Additional Supporting Information (Files uploaded separately)**

Table S9. Data within each ice core record.

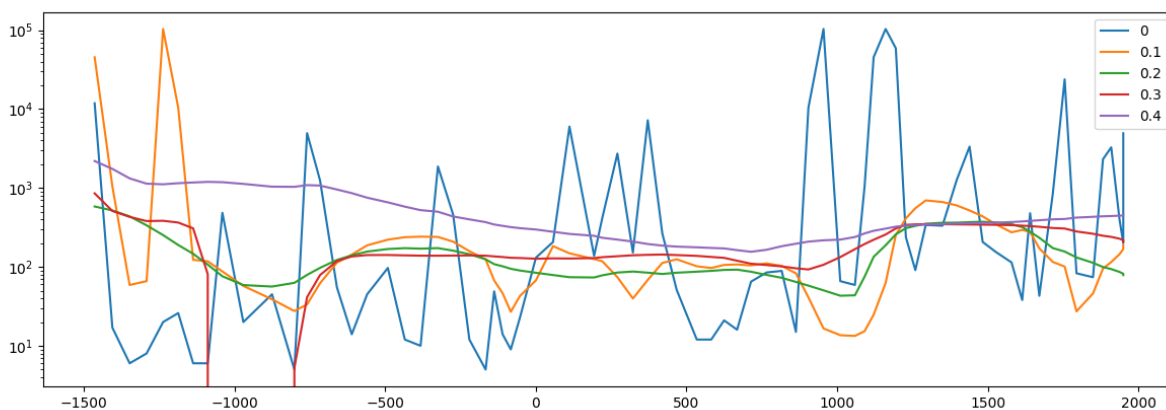
## Introduction

This document provides supporting information for the data analysis performed on modeled and ice core black carbon histories used in this study. Most analysis focused on the ratio of the present day (PD) and pre-industrial (PI) black carbon (BC) concentrations.

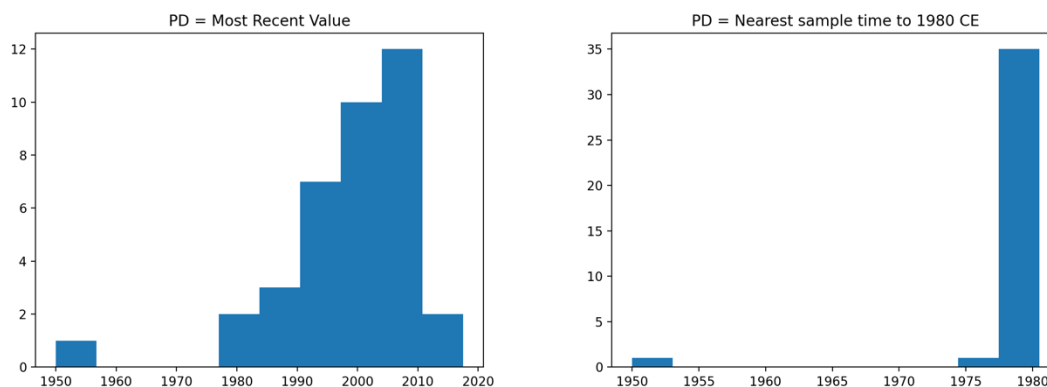
### Text S1. Kilimanjaro Levoglucosan Ice Core Preprocessing

Levoglucosan is known to have very high temporal variability, in part because it reflects a more local burning regime than black carbon. Likewise, levoglucosan data was avoided in this analysis, however, the levoglucosan based Kilimanjaro ice core was included in the analysis because it was the only ice core record of burning on the entire African continent available to the authors.

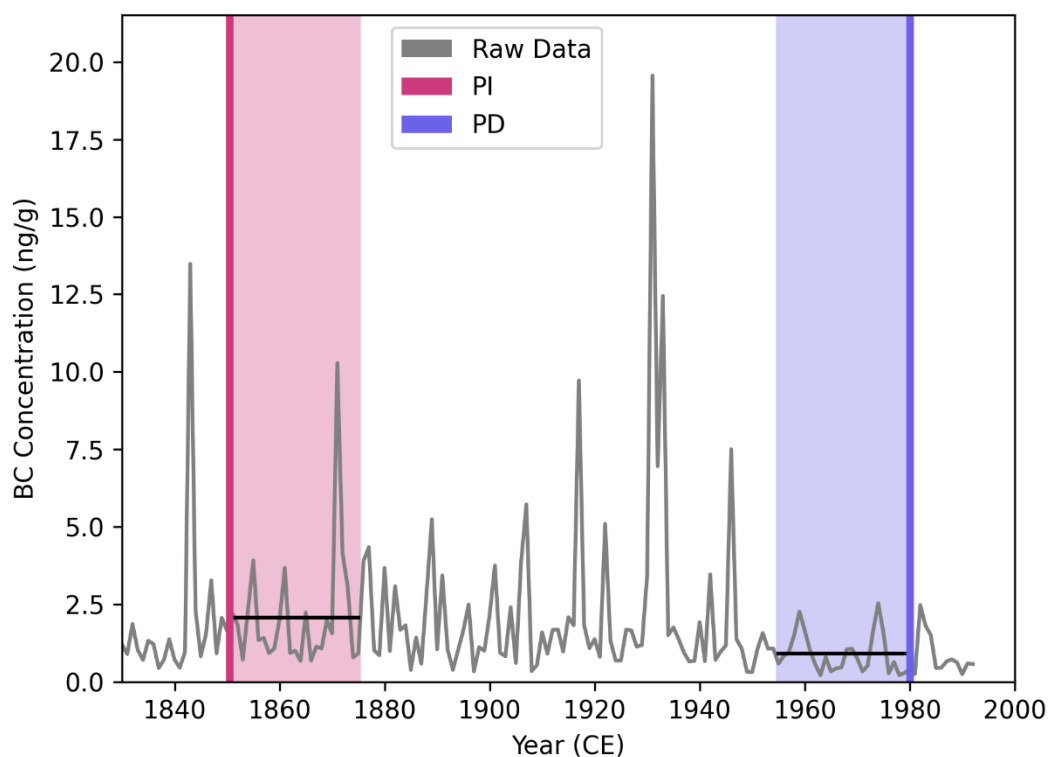
Two levoglucosan values were given for the same timepoint in the ice core data: 4943 and 200 pg/mL levoglucosan at 1950 CE. Before any other preprocessing, these values were averaged into a single data point: 2571.5 pg/mL levoglucosan at 1950 CE. To reduce the temporal variability in the core's levoglucosan time series, lowess smoothing was used. To choose a lowess smoothing parameter, values between 0.25 and 0.5 on an interval of 0.05 were used to generate smoothed time series and the time series with the lowest parameter and without obvious issues was chosen. **Figure Kilimanjaro.1** showed each of these time series and their corresponding smoothing parameters. The only smoothing parameter that shows a clear issue is 0.3, which gives large negative values around -1000 CE. Therefore, the lowest viable smoothing parameter of 0.2 was chosen.



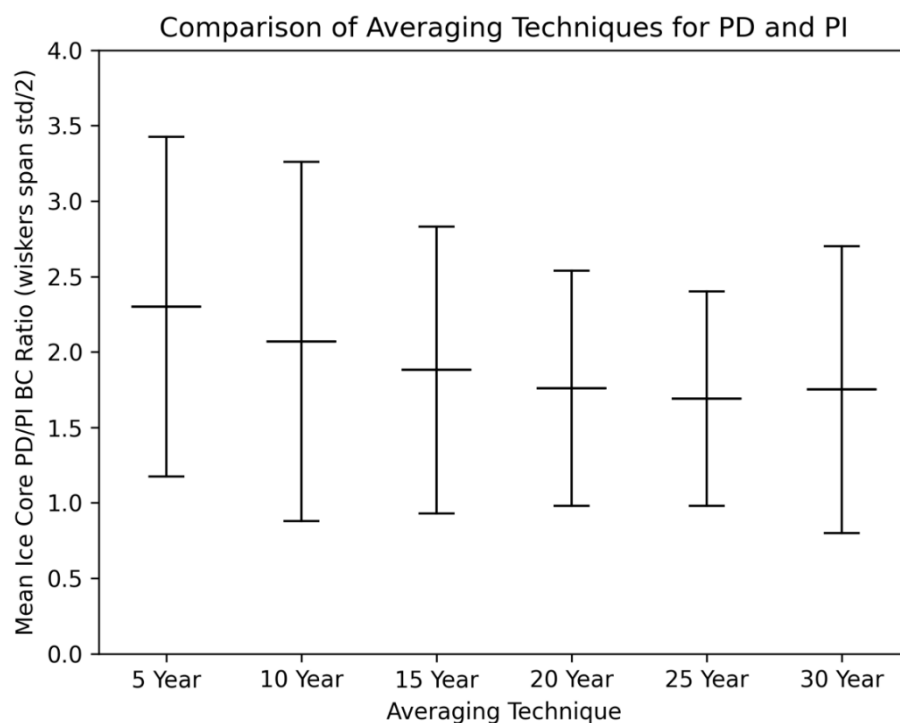
**Figure S1.** Kilimanjaro levoglucosan ice core (Core #9) logscale timeseries smoothed with different lowess smoothing parameters (0.1 to 0.4).



**Figure S2.** Histograms of each ice core's PD value using two different definitions: most recent value (left) and nearest sample date to 1980 CE (right). The PD year mean, standard deviation, and range were 1998.6, 12.3, and 67.5 for the most recent approach, and 1979.0, 4.92, and 30.5 for the 1980 approach respectively.

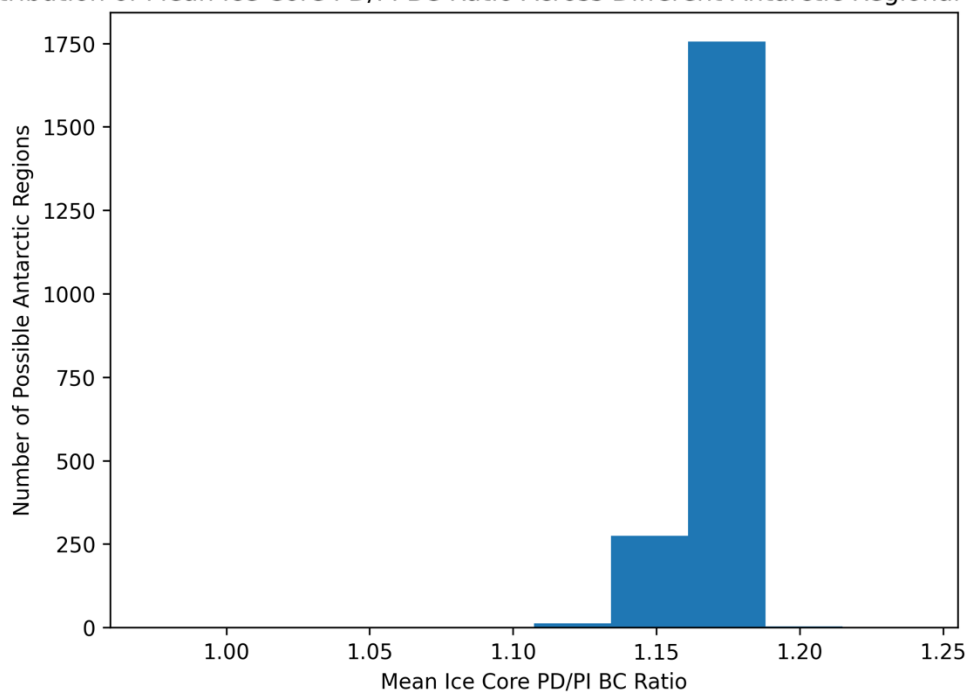


**Figure S3.** Example of methodology applied to each ice core. First the data with the nearest dates to 1850 and 1980 are found (thick pink and blue lines) then the 25 years of data shown in light pink and light blue are averaged to produce the BC values for PI and PD. Finally, these two numbers are divided to get the PD/PI ratio.

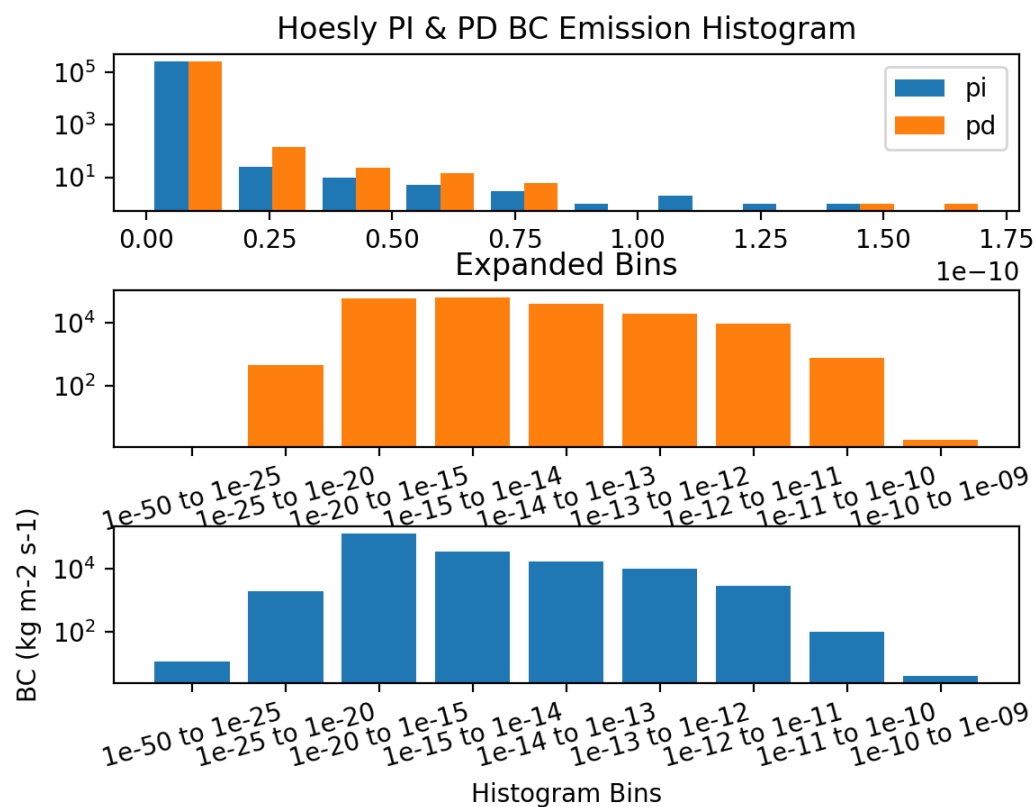


**Figure S4.** Comparison of averaging techniques for the ice cores' PD and PI.

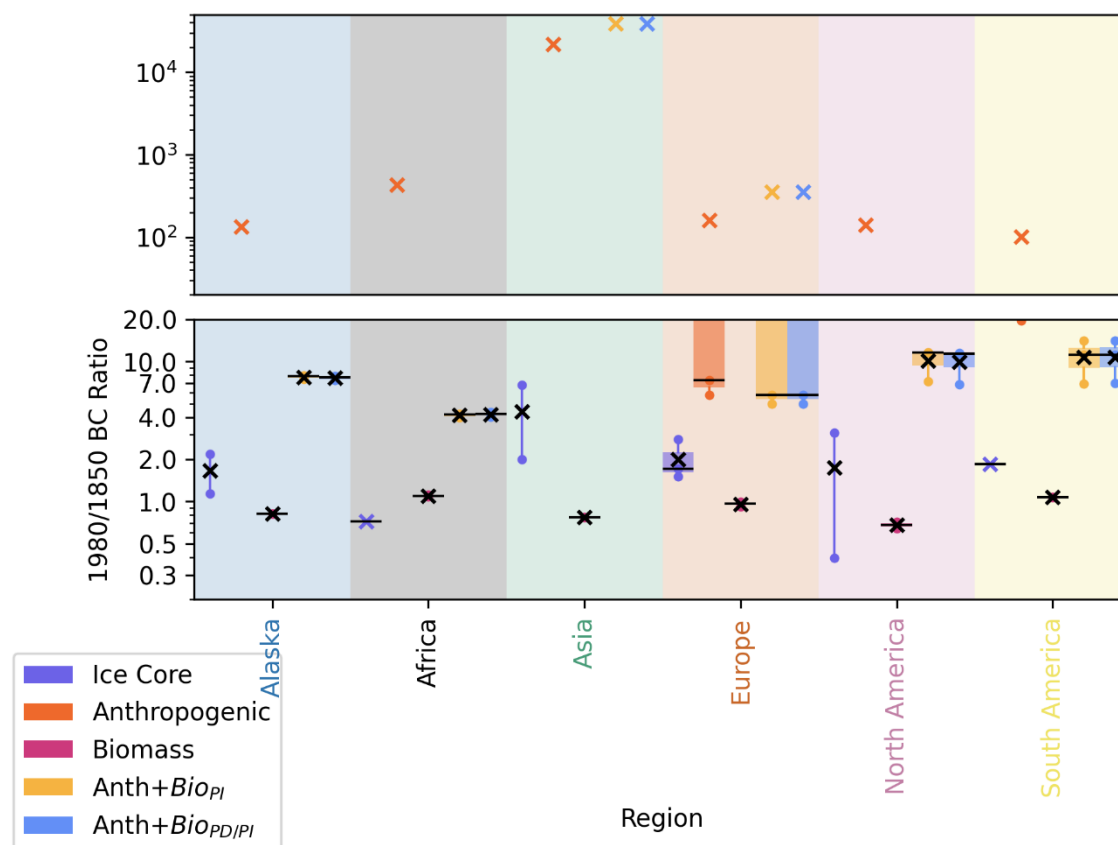
Distribution of Mean Ice Core PD/PI BC Ratio Across Different Antarctic Regional Boundaries



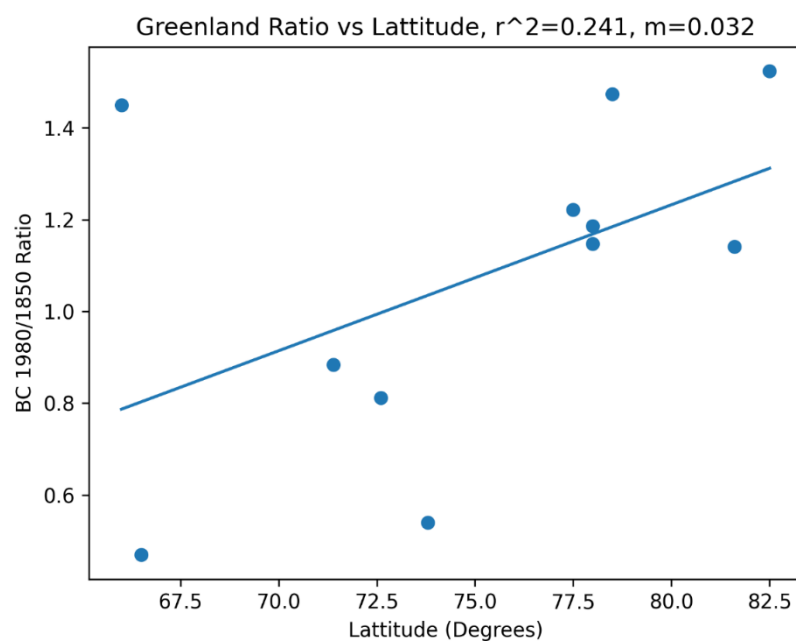
**Figure S5.** Histogram of every possible regional division of the Antarctic ice cores. All ice cores fall within a 0.1 PD/PI BC Ratio range.



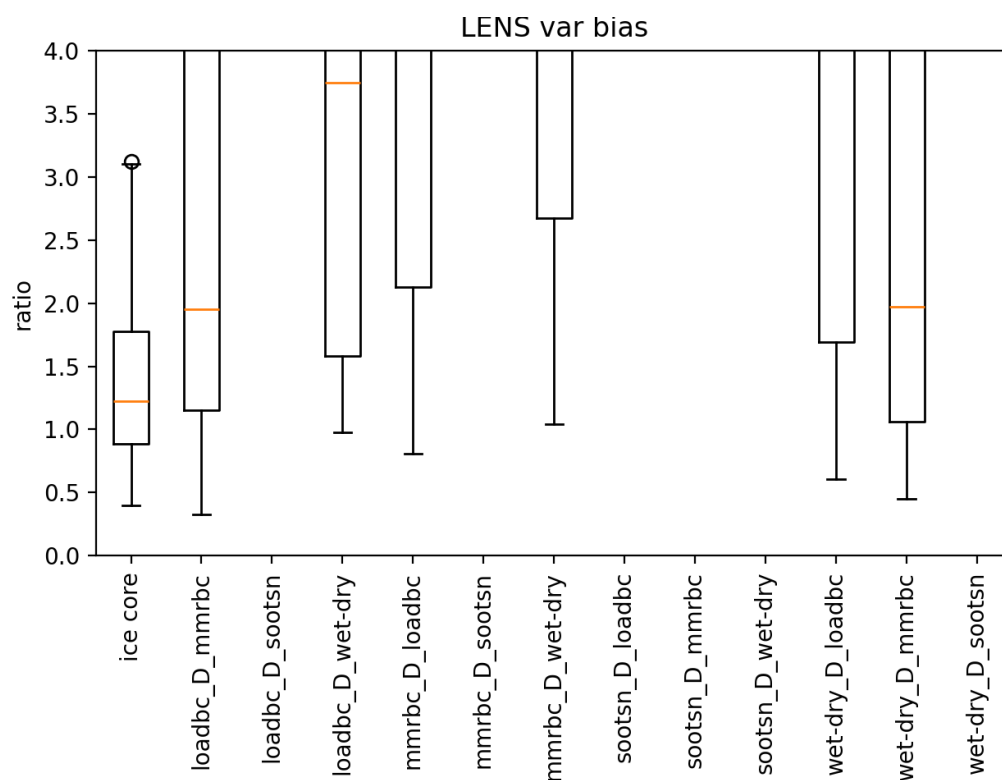
**Figure S6.** Histogram of global Hoesly anthropogenic BC emission sources in the PI and PD, highlighting low values less than  $10^{-25}$  in the PI that skew PD/PI ratios high.



**Figure S7.** Using the emissions regions defined in section 2.3, results from Figure 3 were plotted against ice core values in Figure 4. These biomass PD/PI BC ratio means in each emission region (denoted with X's in Figure 3B) are relatively close to 1 (0.68 to 1.10), but are not within 40% of their corresponding ice core values in any region. Although 5/6 emission regions (Alaska, Asia, Europe, North America, and South America) showed mean Biomass ratios values below the ice cores', the Biomass BC dataset remains an overestimate because the combination Anthropogenic+Biomass PD/PI dataset, which best represents the total BC emissions that are captured by ice core records (as well as biomass, Anthropogenic+Biomass PI), all show regional ratio means above 400% of their corresponding ice core values, and frequently reach above 100, where the maximum ice core value in this dataset is 6.78.



**Figure S8.** Correlation between Greenland ice cores' BC PD/PI ratio and latitude.



**Figure S9.** Comparison between various LENS variable biases (where  $\text{var1} \div \text{var2}$  is labeled as  $\text{var1\_D\_var2}$ ) and the ice core. Bias labels with no data shown have an first quartile bound above 4.

**Table S1.** Overview of the existing BC ice core model evaluation literature and this work's contribution to the literature.

|                                    | <b>This Study</b>                                           | <b>Hamilton et al., 2018</b> | <b>Liu et al., 2021</b>        | <b>Moseid et al., 2022</b> | <b>Zhang et al., 2024</b> |
|------------------------------------|-------------------------------------------------------------|------------------------------|--------------------------------|----------------------------|---------------------------|
| Northern Hemisphere Ice Cores Used | 24                                                          | 4                            | 0                              | 15                         | 16                        |
| Southern Hemisphere Ice Cores Used | 13                                                          | 0                            | 14                             | 1                          | 15                        |
| Model BC Variables Used            | Column Burden, Surface Conc., Deposition Flux, In Snow Conc | Surface Conc.                | Surface Conc., Deposition Flux | Deposition Flux            | Deposition Flux           |

**Table S2.** Comparison between different PI and PD averaging methods.

|                                                  | <b>5-year PD and PI</b> | <b>10-year PD and PI</b> | <b>15-year PD and PI</b> | <b>20-year PD and PI</b> | <b>25-year PD and PI</b> | <b>30-year PD and PI</b> | <b>5-year PD and 25-year PI</b> |
|--------------------------------------------------|-------------------------|--------------------------|--------------------------|--------------------------|--------------------------|--------------------------|---------------------------------|
| Mean ice core PD/PI BC ratio                     | 2.30                    | 2.07                     | 1.88                     | 1.76                     | 1.69                     | 1.75                     | 2.10                            |
| Standard deviation in ice cores' PD/PI BC ratios | 2.25                    | 2.38                     | 1.90                     | 1.56                     | 1.42                     | 1.90                     | 2.19                            |
| Minimum ice core PD/PI BC ratio                  | 0.31                    | 0.41                     | 0.38                     | 0.40                     | 0.40                     | 0.38                     | 0.30                            |
| Maximum ice core PD/PI BC ratio                  | 11.44                   | 11.43                    | 11.02                    | 8.45                     | 7.58                     | 11.79                    | 9.78                            |

**Table S3.** Ice core data sources, latitude (degrees North) and longitude (degrees East), and common site abbreviations used.

| Publication             | Data Source                                                                                                                                     | Latitude   | Longitude  | Site Abbreviation     |
|-------------------------|-------------------------------------------------------------------------------------------------------------------------------------------------|------------|------------|-----------------------|
| Chellman et al. (2017)  | <a href="https://doi.org/10.1021%2Facs.est.6b06574">https://doi.org/10.1021%2Facs.est.6b06574</a>                                               | 43.1       | -109.6     | Upper Fremont Glacier |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 66.5       | -46.3      | ACT11d                |
| Zdanowicz et al. (2018) | <a href="https://www.polardata.ca/pdcsearch/PDCSearchDOI.jsp?doi_id=12952">https://www.polardata.ca/pdcsearch/PDCSearchDOI.jsp?doi_id=12952</a> | 75.32      | -81.64     | Devon Ice Cap         |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 73.8       | -49.5      | NasaU                 |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 66         | -45.2      | ACT2                  |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 72.6       | -38.3      | Summit2010            |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 69.3       | -143.8     | McCall Glacier        |
| McConnell et al. (2007) | <a href="https://doi.org/10.25921/bphv-jy23">https://doi.org/10.25921/bphv-jy23</a>                                                             | 71.4       | -44        | D4                    |
| Thompson et al. (2002)  | <a href="https://doi.org/10.1126/science.1073198">https://doi.org/10.1126/science.1073198</a>                                                   | -3.076667  | 37.353333  | NIF2                  |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 78.5       | -56.8      | Humboldt              |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 77.5       | -51.1      | NEEM_2011_S1          |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 78         | -33.8      | Tunu2013              |
| Liu et al. (2021)       | <a href="https://doi.org/10.6084/m9.figshare.14251022">https://doi.org/10.6084/m9.figshare.14251022</a>                                         | -66.769444 | 111.580833 | W10                   |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                             | 82.5       | -37.5      | Hans Tausen           |
| Liu et al. (2021)       | <a href="https://doi.org/10.6084/m9.figshare.14251022">https://doi.org/10.6084/m9.figshare.14251022</a>                                         | -78.6      | 35.6       | NORUS_7_5             |
| Arienzo et al. (2017)   | <a href="https://doi.org/10.15784/601034">https://doi.org/10.15784/601034</a>                                                                   | -75        | 0.1        | B40                   |
| Taylor et al. (2011)    | <a href="https://doi.org/10.15784/600142">https://doi.org/10.15784/600142</a>                                                                   | -79.4676   | -112.0865  | WAIS DIVIDE           |
| McConnell et al. (2022) | <a href="https://doi.org/10.18739/A2W37KX21">https://doi.org/10.18739/A2W37KX21</a>                                                             | 81.6       | -15.7      | Flade Isblink         |
| McConnell et al. (2021) | <a href="https://doi.org/10.15784/601464">https://doi.org/10.15784/601464</a>                                                                   | -76.8      | 31.9       | B53                   |
| Sigl et al. (2018)      | <a href="https://doi.org/10.1594/PANGAEA.894788">https://doi.org/10.1594/PANGAEA.894788</a>                                                     | 45.932     | 7.876      | CG15                  |

|                         |                                                                                                                                                                                               |           |           |                         |
|-------------------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|-----------|-----------|-------------------------|
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                                                                           | 78        | -36.4     | NGT_B19                 |
| Liu et al. (2021)       | <a href="https://doi.org/10.6084/m9.figshare.14251022">https://doi.org/10.6084/m9.figshare.14251022</a>                                                                                       | -73.5833  | -70.3667  | Gomez                   |
| McConnell et al. (2021) | <a href="https://doi.org/10.15784/601464">https://doi.org/10.15784/601464</a>                                                                                                                 | -82.1     | 54.9      | NORUS_7_7               |
| McConnell et al. (2021) | <a href="https://doi.org/10.15784/601464">https://doi.org/10.15784/601464</a>                                                                                                                 | -74.1     | 1.6       | NUS08_7                 |
| Ruppel et al. (2014)    | <a href="https://doi.org/10.23728/fmi-b2share.858bbae80cde4b26bda0a37a56d7db99">https://doi.org/10.23728/fmi-b2share.858bbae80cde4b26bda0a37a56d7db99</a>                                     | 79.1375   | 13.272222 | Holtedahl-fonna Glacier |
| Osmont et al. (2019)    | <a href="https://doi.org/10.25921/3ygy-q259">https://doi.org/10.25921/3ygy-q259</a>                                                                                                           | -16.65    | -67.7833  | Illimani Glacier        |
| Legrand et al. (2024)   | <a href="https://www.ncei.noaa.gov/access/paleo-search/study/38580">https://www.ncei.noaa.gov/access/paleo-search/study/38580</a>                                                             | 43.3483   | 42.4267   | Mount Elbrus            |
| Osmont et al. (2018)    | <a href="https://doi.org/10.25921/gqct-0c60">https://doi.org/10.25921/gqct-0c60</a>                                                                                                           | 78.8234   | 17.4331   | LF-09                   |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                                                                           | 60.5      | -139.5    | Eclipse                 |
| Matthew et al. (2016)   | <a href="https://doi.org/10.1016/j.accre.2016.07.002">https://doi.org/10.1016/j.accre.2016.07.002</a>                                                                                         | 33.576667 | 91.179333 | Guoqu Glacier           |
| McConnell et al. (2021) | <a href="https://doi.org/10.15784/601464">https://doi.org/10.15784/601464</a>                                                                                                                 | -64.2     | -57.7     | JRI_2008                |
| Liu et al. (2021)       | <a href="https://doi.org/10.6084/m9.figshare.14251022">https://doi.org/10.6084/m9.figshare.14251022</a>                                                                                       | -71.167   | 111.367   | Aurora Basin            |
| Zhang et al. (2024)     | <a href="https://doi.org/10.18739/A2KH0F13W">https://doi.org/10.18739/A2KH0F13W</a>                                                                                                           | 80.5      | 94.8      | Akademii Nauk           |
| Liu et al. (2021)       | <a href="https://doi.org/10.6084/m9.figshare.14251022">https://doi.org/10.6084/m9.figshare.14251022</a>                                                                                       | -76.1     | 22.5      | NORUS_7_2               |
| Kaspari et al. (2020)   | <a href="https://doi.org/10.1029/2019JD031126">https://doi.org/10.1029/2019JD031126</a>                                                                                                       | 48.3564   | -121.0574 | SCG                     |
| Eichler et al. (2023)   | <a href="https://www.ncei.noaa.gov/metadata/geoportal/rest/metadata/item/noaa-icecore-37972/html">https://www.ncei.noaa.gov/metadata/geoportal/rest/metadata/item/noaa-icecore-37972/html</a> | 46.551    | 8.067     | FH                      |
| Barker et al. (2021)    | <a href="https://doi.org/10.25921/vxax-w749">https://doi.org/10.25921/vxax-w749</a>                                                                                                           | 28.3833   | 85.7167   | Dasuopu Glacier         |

**Table S4.** Region definitions and number of ice cores in each region.

| Large Region | Region          | Definition                                                                | Number of Ice Cores |
|--------------|-----------------|---------------------------------------------------------------------------|---------------------|
| North Pole   | Arctic          | All areas above 66.6 degrees North in latitude except Greenland           | 5                   |
|              | North Greenland | Greenland's land area above 71.5 degrees North in latitude                | 8                   |
|              | South Greenland | Greenland's land area below 71.5 degrees North in latitude                | 3                   |
| South Pole   | Antarctic       | Continental Antarctica                                                    | 11                  |
| Alpine       | Africa          | Continental Africa                                                        | 1                   |
|              | Asia            | Continental Asia                                                          | 2                   |
|              | Europe          | Continental Europe, Eastern Europe and the Middle East                    | 3                   |
|              | North America   | All areas in continental North America below 67 degrees North in latitude | 3                   |
|              | South America   | Continental South America                                                 | 1                   |

**Table S5.** The ensemble, subset, and comparisons of each model used in this analysis.

| Ensemble | Ensemble Subset | Model    | Deposition Comparison | 3 Variable Comparison |
|----------|-----------------|----------|-----------------------|-----------------------|
| LENS1    | Members 18-35   | CESM1    | X                     |                       |
| CMIP6    | CESM2           | CESM2    | X                     | X                     |
|          |                 | CanESM5  | X                     |                       |
|          |                 | CESM2_re | X                     |                       |
|          |                 | MIROC    | X                     |                       |
|          |                 | EC-Earth | X                     |                       |
|          |                 | MRI      | X                     |                       |
|          |                 | CNRM     | X                     |                       |
|          |                 | IPSL     | X                     |                       |

**Table S6.** The max, min, and mean absolute and standard deviation differences between different grid box averaging methods for LENS data. S4 and S8 represent averaging the 4 and 8 nearest grid boxes to an ice core's latitude and longitude, respectively, and S1 represents using the raw data from the nearest grid box without any grid box averaging.

|                   | Max  | Min   | Mean  |
|-------------------|------|-------|-------|
| S4 - S1           | 2.43 | -1.78 | -0.1  |
| S8 - S1           | 3.15 | -2.61 | -0.16 |
| std(S4) - std(S1) | 0.97 | -5.61 | -0.56 |
| std(S8) - std(S1) | 2.22 | -7.75 | -0.67 |

**Table S7.** The absolute and standard deviation differences between different vertical level averaging methods for LENS data. LV30 and LV28 represent the nearest and the third nearest model levels to the Earth's surface, respectively.

|                       | Max                   | Min                   | Mean                  |
|-----------------------|-----------------------|-----------------------|-----------------------|
| LV30 - LV28           | $8.60 \times 10^{-3}$ | $7.04 \times 10^{-8}$ | $2.59 \times 10^{-4}$ |
| std(LV30) - std(LV28) | $2.15 \times 10^{-3}$ | $5.33 \times 10^{-7}$ | $2.67 \times 10^{-4}$ |

**Table S8.** Regional PD/PI BC medians for each CESM2 model variable explored in Figure 6.

| Regions    | Ice Core | BC in air column | BC deposition to snow | BC in surface air | BC in snow |
|------------|----------|------------------|-----------------------|-------------------|------------|
| North Pole | 1.17     | 3.02             | 3.86                  | 2.64              | 1.98       |
| South Pole | 1.05     | 3.14             | 3.26                  | 2.59              | 1.91       |
| Alpine     | 1.93     | 3.69             | 2.75                  | 2.67              | 3.90       |