Continuity of ice sheet mass loss in Greenland and Antarctica from the GRACE and GRACE Follow-On missions.

Isabella Velicogna^{1,2}, Yara Mohajerani¹, Geruo A¹, Felix Landerer², Jeremie Mouginot^{1,3}, Brice Noel⁴, Eric Rignot^{1,2}, Tyler Sutterley⁵, Michiel van den Broeke³⁴, J.M. van Wessem⁴, David Wiese²

> ¹University of California, Earth System Science, Irvine, CA 92617, USA ²Jet Propulsion Laboratory, CA 91109, USA ³University of Grenoble Alpes, CNRS, IRD, Grenoble INP, IGE, Grenoble, France

> > $^4\mathrm{University}$ of Utrecht, 3584 Utrecht, The Netherlands

⁵Polar Science Center, Applied Physics Laboratory, University of Washington, Seattle, WA 98105, USA

• We demonstrate data continuity of the GRACE and GRACE-FO missions over Greenland and Antarctica using independent data.

- GRACE-FO data capture a record-high summer loss (600 gigatonnes) in Greenland in 2019.
- Mass gain in Queen Maud Land mitigate high losses in the Amundsen Sea, Penin sula, and Wilkes Land to pause the acceleration in mass loss.

Corresponding author: Isabella Velicogna, isabella@uci.edu

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Key Points:

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19 Abstract

We examine data continuity between the GRACE and GRACE-FO missions over Greenland and Antarctica using independent data from the mass budget method (MBM) which 21 calculates the difference between ice sheet surface mass balance and ice discharge at the 22 periphery. For both ice sheets, we find consistent GRACE/GRACE-FO time series across 23 the data gap, at the continental and regional scales, and the data gap is confidently filled 24 with MBM data. In Greenland, the GRACE-FO data reveal an exceptional summer loss 25 of 600 Gigatonnes in 2019 following two cold summers. In Antarctica, ongoing high mass 26 losses in the Amundsen Sea Embayment of West Antarctica, the Antarctic Peninsula, 27 and Wilkes Land in East Antarctica cumulate to 2130, 560, and 370 Gigatonnes, respec-28 tively, since 2002. A cumulative mass gain of 980 Gigatonnes in Queen Maud Land since 29 2009, however, led to a pause in the acceleration in mass loss from Antarctica after 2016. 30

31 1 Introduction

The Gravity Recovery and Climate Experiment (GRACE), a pair of co-orbiting 32 twin satellites linked with a microwave ranging instrument, has provided invaluable in-33 sights into changes in ice and water around the globe by monitoring the small tempo-34 ral fluctuations in the Earth's gravity field (Tapley et al., 2019). In particular, GRACE 35 data allowed the scientific community to directly and comprehensively evaluate the mass 36 balance of the Earth's ice sheets, glaciers and ice caps on a monthly basis for the first 37 time (Velicogna & Wahr, 2006; Velicogna et al., 2014; Shepherd et al., 2012, 2018, 2019; 38 Jacob et al., 2012; Gardner et al., 2013). These studies revealed mass loss in Greenland 30 and Antarctica, an acceleration in ice sheet mass loss over the duration of the GRACE 40 mission, and a major revision of the mass loss of glaciers and ice caps traditionally re-41 constructed from incomplete and sparse data. The GRACE mission captured inter-annual 42 changes in mass loss, seasonal changes, and more rapid events. The goal of the GRACE-43 FO mission is to extend the data record in time to separate long term trends from the 44 natural variability of the system, document the ongoing acceleration in mass loss and 45 its impacts on sea level change, and better inform climate and ice sheet models. 46 The GRACE mission lasted for 15 years from its launch on March 17, 2002 until 47

its retirement due to battery problems on October 12, 2017. To continue the time series of measurements, the GRACE Follow-On (FO) mission was launched on May 22,
2018 from Vandenberg Air Force Base (Tapley et al., 2019). In the early stages of the

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GRACE-FO mission, it is essential to verify data quality, calibration, and continuity of 51 the GRACE and GRACE-FO missions. Instruments built 15 years apart with different hardware may not perform in an identical way. Since the two missions did not overlap 53 in time, we use independent observations to detect potential bias in the gravity solutions 54 and discontinuity due to a few particular circumstances. During the late stages of the 55 GRACE mission, efforts were enacted to preserve the battery life of the GRACE satel-56 lites to extend the mission lifetime. The accelerometer onboard GRACE-B was turned 57 off in September 2016 to maintain the operation of the microwave ranging instrument. 58 Processing centers developed independent methods for spatio-temporally transplanting 59 the accelerometer data retrieved from the two GRACE satellites (Bandikova et al., 2019). 60 While both accelerometers on GRACE-FO are operating and collecting observations, shortly 61 after the launch an anomaly onboard one of the two GRACE-FO satellites, GRACE-FO 62 2 or GF2, resulted in degraded performance in the accelerometer measuring non-gravitational 63 accelerations. For this reason, at present, the GRACE-FO 1 or GF1 accelerometer data 64 is used to generate accelerometer transplant data to substitute the GF2 measurements. 65 Unfortunately, these single-accelerometer months for both GRACE and GRACE-FO missions contain more noise. It is important to understand the effect of this noise on the 67 quality of the gravity data and data continuity between the missions. 68 In this work, we examine the data continuity of GRACE and GRACE-FO time-69 variable gravity missions over the Antarctic and Greenland Ice Sheets using independent 70 Mass Budget Method data that combine surface mass balance (SMB) output products 71 from the Regional Atmospheric Climate Model (RACMO2.3) with grounding line dis-72 charge from a continuous monitoring of glacier speed and ice thickness. We also exam-73 ine the differences between data products from various processing centers, the effect of 74 various harmonic corrections, and the components of mass balance of Greenland and Antarc-75 tica. We conclude by noting important features of the mass balance record combining 76 GRACE and GRACE-FO missions in Greenland and Antarctica during the the period 77

⁷⁸ Apr 2002-September 2019, a 17.4 years period.

79 2 Data and Methods

Here, we use Release-6 of the Level-2 spherical harmonic solutions provided by the Center for Space Research (CSR) at the University of Texas at Austin, the Jet Propulsion Laboratory (JPL), and the German Research Centre for Geosciences (GFZ) that

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are provided to degree 60, order 60 harmonics for both GRACE and GRACE-FO mis-83 sions. Changes in geocenter, i.e. relative change between the center of mass and geometric center of the Earth ellipsoid, are not captured by GRACE or GRACE-FO. 85 In order to include the degree-1 geocenter terms, we follow the methodology of Sutterley 86 and Velicogna (2019), a self-consistent geocenter technique that includes self-attraction 87 and loading effects. This allows a consistent processing of spherical harmonic fields (same 88 C20, C30, Glacial Isostatic Adjustment, and love numbers), a higher degree truncation 89 that has greater levels of agreement with our test synthetics, and consistently buffered 90 land-sea mask for geocenter calculation and sea level estimate (Sutterley & Velicogna, 91 2019). The degree-1 coefficients are recalculated consistently for each GRACE/GRACE-92 FO solution. Low-degree zonal harmonics, which carry a significant fraction of the grav-93 ity data, have a disproportionately large effect on Antarctic Ice Sheet mass balance es-04 timates due to its position on the southern pole and its spatial area. The low-degree zonal 95

harmonics derived from GRACE/GRACE-FO data are sensitive to processing strate-

gies during the single-accelerometer months.

Efforts have been made to evaluate and improve the quality of the GRACE/GRACE-98 FO solution during the single-accelerometer months, e.g. the $C_{3,0}$ harmonic time-series 99 derived from Satellite Laser Ranging (SLR) provided by the Goddard Space Flight Cen-100 ter (GSFC) as a part of the GRACE TN-14 auxiliary data (Loomis et al., 2019). Here, 101 we use the GSFC $C_{3,0}$ product. We also evaluated the quality of the $C_{4,0}$ and $C_{5,0}$ har-102 monics and found that the GRACE/GRACE-FO harmonics have a satisfactory quality. 103 Replacing $C_{2,0}$ has been a standard procedure for time-variable gravity analyses since 104 early in the GRACE mission due to issues with the GRACE degree-2 zonal harmonic 105 and sensitivity to tidal aliasing (Cheng & Ries, 2017). NASA Goddard Space Flight Cen-106 ter (GSFC) provides a new $C_{2,0}$ harmonic solution as part of the GRACE TN-14 aux-107 iliary dataset that uses a time-variable gravity background model derived from GRACE 108 in the forward modeling of the Satellite Laser Ranging (SLR) solution (Loomis et al., 109 2019). The previous standard oblateness solution provided as part of the GRACE TN-110 07 and TN-11 auxiliary datasets used a fixed background model as described in (Cheng 111 & Ries, 2017). Here, we use the project recommended GSFC $C_{2,0}$ product. 112

All harmonics are smoothed with a 250 km radius Gaussian smoothing function (Velicogna et al., 2014). We correct the GRACE data for the long-term trend of glacial

isostatic adjustment (GIA) from the solid earth. We use the regional IJ05 R2 GIA model 115 (Ivins et al., 2013) over Antarctica and the regional Simpson et al. (2009) GIA model 116 over Greenland. These regional GIA models have been developed to match a variety of 117 geologic, glaciological, and geodetic observations over the ice sheets but do not include 118 realistic GIA signal outside the ice sheets. Outside of Greenland and Antarctica, we there-119 fore use A et al. (2013) with ICE6G ice history (Peltier et al., 2015). Ice mass time se-120 ries are calculated using the least-squares mascon approach following Velicogna et al. (2014). 121 The uncertainty in mass balance estimates combines GRACE/GRACE-FO measurement 122 errors, errors in the GIA correction, mascon-fit error, and leakage errors due to ocean 123 mass including self attraction and loading effects. 124

To compare the performance of GRACE-FO and assess potential biases, we use in-125 dependent data from the Mass Budget Method (MBM) which calculates the difference 126 between surface mass balance (SMB) and mass discharge along the periphery. Ground-127 ing line ice discharge from Rignot et al. (2019) and Mouginot, Rignot, Bjørk, et al. (2019) 128 are updated to August 2019 using the latest velocities and SMB data. The ice veloci-129 ties include new measurements from the European Union's Copernicus Sentinel-1ab SAR 130 satellites, Sentinel-2, and the USGS Landsat-8. Ice thickness is the same as in Rignot 131 et al. (2019) for Antarctica and updated for changes in surface elevation as in Mouginot, 132 Rignot, Bjørk, et al. (2019) for Greenland. The data record is updated at the monthly 133 scale for both ice sheets. SMB is RACMO2.3p2 for West Antarctica and the Antarctic 134 Peninsula (Van Wessem et al., 2014; van Wessem et al., 2018), and RACMO2.3p1 in East 135 Antarctica until 2016 and complemented by a scaled version of RACMO2.3p2 after 2016 136 as in (Rignot et al., 2019). In Greenland, we use RACMO2.3p2 (Noël et al., 2018; Shep-137 herd et al., 2019). We include all peripheral glaciers and ice caps. RACMO2.3p2 is gen-138 erated at 5.5 km resolution and interpolated to 1 km in the Antarctic Peninsula, 11 km 139 resolution downscaled to 1 km in Greenland, and 27 km resolution in continental Antarc-140 tica interpolated to 1 km. We previously reported an excellent agreement between the 141 MBM and GRACE data at the regional scale in Antarctica in key regions ranging from 142 no loss to medium and high loss (Mohajerani et al., 2018, 2019; Velicogna et al., 2014). 143

As we aim for seamless interpolation between the two GRACE missions, small adjustments in trend, dM/dt (where M is the mass and t is time) are applied to the MBM data to match that from the GRACE data. The time series display the relative ice mass, M(t), which has an arbitrary reference value, here chosen to be the mean over the GRACE time period. We compare the overall trends, dM/dt, between GRACE and MBM during the GRACE period. This offset results from uncertainties in the GIA correction in the GRACE data (constant dM/dt), and uncertainties in absolute ice discharge and absolute SMB in the MBM data (another constant dM/dt). We adjust the MBM time series with this offset and compare the adjusted MBM data with GRACE and GRACE-FO data.

The monthly discharge rates for each glacier basin are spatially distributed through-154 out the basins at each time step. We weight the distribution of mass loss by flux den-155 sity, i.e. the product of ice velocity and ice thickness, to a power exponent of 0.6. We 156 tested how well MBM could match GRACE with different power exponent, 1 drawing 157 too much loss along the coast, 0.1 yielding too much loss in the interior, and 0.6 bring-158 ing the two times series in near balance. An exponent of 0.6 indicates that the impact 159 of coastal changes is felt far inland of the grounding line. The reference velocity is the 160 2017-2018 mosaic (Rignot & Mouginot, 2012; Mouginot, Rignot, & Scheuchl, 2019). Ice 161 thickness is from BedMachine Antarctica (Morlighem et al., 2019) and BedMachine Green-162 land (Morlighem et al., 2017). The monthly mass balance is the difference between SMB and discharge at each grid point. Note that there is no need for a reference time period 164 in the calculation of the total mass loss. The error estimates of the MBM time series are 165 calculated following (Mouginot, Rignot, Bjørk, et al., 2019) and (Rignot et al., 2019). 166 As the difference in spatial resolution and characteristics of the MBM and GRACE data 167 may lead to systematic biases in regional comparisons, we re-grid the 1 km MBM field 168 on a half-degree grid and convert each month to the harmonic domain. Following the 169 resolution of GRACE data, we truncate the MBM harmonics at degree 60 and order 60, 170 perform Gaussian smoothing with a radius of 250 km, and repeat the mascon fitting pro-171 cedure with the resulting harmonics. 172

3 Results

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We compare the GRACE solutions from JPL, CSR and GFZ over Greenland and Antarctica (Fig. 1). The average mass loss values in Greenland over the extended time period (April 2002-September 2019) agree well, with 261±43 Gt/yr for CSR, 261±45 Gt/yr for JPL, and 254±47 Gt/yr for GFZ. For Antarctica, the average mass loss values are 107±55 Gt/yr for CSR, 104±57 Gt/yr for JPL and 89±60 Gt/yr for GFZ. Over that

time period, the acceleration in mass loss in Greenland is not significant. In Antarctica,

the acceleration in mass loss for the entire analyzed period ranges from 6.3 ± 3.3 Gt/yr² for CSR, 9.1 ± 3.4 Gt/yr² for JPL and 8.1 ± 3.3 Gt/yr² for GFZ. We note a higher data noise, especially in the Antarctic time series, at the end of the GRACE mission and the beginning of the GRACE-FO mission, as explained earlier. The GFZ time series have more data noise than the time series from the other centers. In the remainder of the paper, we only use the JPL solutions for GRACE and GRACE-FO.



Figure 1. Comparison of GRACE/GRACE-FO time series from different processing centers (CSR = Center for Space Research at the University of Texas at Austin, USA; JPL = Jet Propulsion Laboratory, Pasadena, CA USA; GFZ = German Research Centre for Geosciences, Germany) in a) Greenland and b) Antarctica with data gap in grey vertical bar and mass numbers in Gigatonnes $(10^9 t = 10^{12} kg)$

In Greenland, the time series of mass balance values from GRACE/GRACE-FO 186 line up well across the data gap from mid 2017 to mid 2018. Data continuity is most dra-187 matically illustrated with the addition of MBM time series across the winter season of 188 2018 (Fig. 2). The adjustments in trend, dM/dt, between GRACE and MBM are small: 189 -14 (NW), 7 (NN), 7 (NE), 2 (SE), -16 (SW) Gt/yr and -17 Gt/yr for the entire ice sheet. 190 If we compare the adjusted MBM and GRACE/GRACE-FO monthly time series over 191 the entire study period, they agree within $\pm 2\%$ of the total signal. We find no signifi-192 cant difference in data noise between GRACE and GRACE-FO data. 193

In the summer of 2019, we note a mass loss of 600 Gt by the end of August 2019, which is comparable to the mass loss in the warm summer of 2012 (650 Gt peak to peak) (Hanna et al., 2014). The high summer loss is reflected in all regions of Greenland, but

particularly in the North and Northeast with a mass loss of 80 Gt versus a reference bal-197 ance SMB for the years 1961-1990 in the range of 22 to 25 Gt (Mouginot, Rignot, Bjørk, et al., 2019). The mass losses in NW, SW and SE were about 100 Gt but the reference 199 SMBs in these regions are higher. Data noise across the gap is strongest in Northeast 200 Greenland. Overall, the mass loss accelerated over the time period 2002-2012, but ex-201 perienced a pause in acceleration after 2012. In 2017-2018, the mass loss decreased the 202 most, in response to higher SMB values caused by cold summers, but ice discharge con-203 tinued to increase the entire time (Mouginot, Rignot, Bjørk, et al., 2019) and the SMB 204 was low again in 2019. 205

Over the entire GRACE/GRACE-FO period (April 2002-September 2019), or 17.4 206 years, the acceleration in mass loss is not significant. The mass loss cumulates to 4,550 207 Gt $(261\pm45 \text{ Gt/yr})$ with approximately 610 Gt from the North, 160 Gt in the North-208 east, 1,540 Gt in the Southeast, 660 Gt in the Southwest, and 1,580 Gt from the North-209 west. As fraction of the reference SMB values for 1961-1990, these quantities represent 210 62% of the reference SMB (422 Gt/yr in Mouginot, Rignot, Bjørk, et al. (2019)) for Green-211 land, 140% in the North (25 Gt/yr reference SMB), 42% in the Northeast (22 Gt/yr ref-212 erence), 68% in the Southeast (131 Gt/yr reference), 64% in the Southwest (59 Gt/yr 213 reference) and 65% in the Northwest (140 Gt/yr reference). The entire ice sheet has been 214 losing mass during that time period. The acceleration in mass loss was most pronounced 215 in NW, SW and SE (Fig. 2). 216

In Antarctica, the comparison of the GRACE/GRACE-FO time series with MBM 217 illustrates that the GRACE and GRACE-FO line up well across the data gap and the 218 MBM offers the possibility to fill the gap between the missions (Fig. 3). The adjustments 219 in trend dM/dt between GRACE and MBM are small: -27 (QML), -9 (APIS), -2 (CpDc), 220 -2 (GH3), -14 (DDpi) and 50 Gt/yr for the ice sheet including uncertainties in GIA cor-221 rection. Over the study period, the adjusted MBM and GRACE/GRACE-FO monthly 222 time series agree within $\pm 12\%$ of the total signal. The agreement is less than in Green-223 land but the temporal variability of the signal is larger and the total signal is lower. Fol-224 lowing a period of relatively low loss in 2002-2006, the mass loss increased rapidly un-225 til 2016 when the ice sheet gained mass overall before returning to a mass loss in 2017. 226 In total, the ice sheet lost 1,810 Gt of ice during the entire period, or 104 ± 57 Gt/yr. 227

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Figure 2. Comparison of GRACE/GRACE-FO time series of mass change using the JPL fields (blue) versus the adjusted Mass Budget Method (MBM) (red) for a) Greenland Ice Sheet, b) North (N) Greenland, d) Northwest (NW) Greenland, f) Northeast (NE) Greenland, g) Southwest (SW) Greenland and j) Southeast Greenland in Gigatonnes $(10^9t = 10^{12}kg)$, along with map of e) average mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year squared.

In the Antarctic Peninsula, the total loss for the entire period was 560 Gt. We note an increase in mass in 2016-2017 of 100 Gt, or 34% of the reference SMB for the years 1979-2008 (293 Gt/yr reference in Rignot et al. (2019)). After 2016, the mass loss in the Antarctic Peninsula resumed to what it was in prior years, i.e. about 10% out of balance. We detect a strong mass gain in Queen Maud Land. A large increase in snowfall reported in 2009 brought 200 Gt of extra mass on the ice sheet (Lenaerts et al., 2013; Van Wessem et al., 2014). The GRACE/GRACE-FO data record reveals that SMB stayed

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above equilibrium conditions after 2009, with a total mass gain of 980 ± 60 Gt in the last 17.4 years, or $26\pm2\%$ of the reference SMB (216 Gt/yr) for that region (sum of basin A-A' and A'B in Rignot et al. (2019)).

We find no trend in the combined mass balance of Victoria Land and George VI 238 Land in East Antarctica (basin D'-E and D-D' in Rignot et al. (2019)), which have been 239 reported to experience low losses with the MBM method. Conversely, the mass loss in 240 the Amundsen Sea Embayment sector of West Antarctica, which hosts the Pine Island, 241 Thwaites, Haynes, Pope, Smith and Kohler glaciers, kept increasing the entire period to 242 a cumulative 2,130 Gt loss versus a reference SMB of 200 Gt/yr (basin GH in Rignot 243 et al. (2019), or 61% out of balance. The other area of mass loss is the Wilkes Land sec-244 tor, in East Antarctica which includes the Frost, Totten, and Denman glaciers (reference 245 SMB of 247 Gt/yr for basin C'-D) with a cumulative loss of 370 Gt since 2002, or 9% 246 out of balance. Overall, we note a pause in the acceleration in mass loss of Antarctica 247 after 2016 due to the mass gain in QML and a large snowfall in the Antarctica Penin-248 sula in 2016-2017 (van Wessem et al., 2016). The map of acceleration in mass loss (Fig. 249 3) shows enhanced losses in the Amundsen Sea sector, Wilkes Land (CpDc) and mass 250 gain in Queen Maud Land (QML). 251

252 4 Discussion

- The agreement between the GRACE and GRACE-FO time series is a testimony 253 of the data quality and satisfactory calibration of both missions. It is a special challenge 254 for continuity missions to have no overlap period to compare the results. Data continu-255 ity is verified within uncertainties at the ice sheet scale, at the basin scale for Antarc-256 tica, and for the smaller regions for Greenland, i.e. the analysis reveals no significant bias 257 in the GRACE and GRACE-FO time series from the continental to the regional levels 258 at both poles. The agreement between solutions from the three different centers is in-259 dicative of a high maturity and quality of the data processing algorithms (Tapley et al., 260 2019). The results also show that within small adjustments in trend, the data gap can 261 be filled with MBM data. 262
- In Greenland, the ice sheet experienced back to back cold summers in 2017 and 2018, but 2019 saw a return of warm conditions, with a high summer loss and one of the lowest SMB on record. The 600 Gt loss is 142% higher than that needed to maintain the



Figure 3. Comparison of GRACE/GRACE-FO time series of mass change using the JPL fields (blue) versus the adjusted Mass Budget Method (MBM) (red) for a) Antarctic Ice Sheet, b) Queen Maud Land (basin A-A' and A'-B), d) Antarctic Peninsula (basin I-I"), f) Wilkes Land, East Antarctica (basin C'D), g) Amundsen Sea Embayment, West Antarctica (basin GH), and j) Victoria and GeorgeVI Land (basin D'-E and D-D') in Gigatonnes $(10^9 t = 10^{12} kg)$, along with map of e) average mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in centimeter of water per year and h) acceleration in mass loss in the per year and h) acceleration in mass loss in the per year and h) acceleration in mass loss in the per year and h) acceleration in mass loss in the per year and h) acceleration in mass los

ice sheet in a state of mass balance, i.e. zero mass loss. The effect was felt most strongly
in the north (NN and NE). Overall, however, ice discharge kept rising during the entire
study period (Mouginot, Rignot, Bjørk, et al., 2019). The fluctuations in mass loss are
dominated by the interannual variability in SMB, but the long term signal remains a widespread,
steady mass loss from all corners of the ice sheet, cumulative to 4,550 Gt for the 17.4
years, or 261±45 Gt/yr on average. Key factors for the exceptional loss of 2019 were the
persistence of anticyclonic conditions over the summer, promoting high snow and ice melt,

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combined with low precipitation of snow in the previous winter. A low cloud cover in the north induced high loss even though the air temperature was only 1 to 2° C warmer than the average for 1981-2010 (Tedesco & Fettweis, 2019).

In Antarctica, the snowfall event in 2009 over Queen Maud Land, East Antarctica 276 was unique in the GRACE record (Velicogna et al., 2014) but similar episodes of high 277 snowfall have been detected in the past (Lenaerts et al., 2013; Van Wessem et al., 2014). 278 Since 2009, enhanced snowfall persisted in QML, which may be indicative of a new trend 279 in SMB over the Atlantic sector. Recent results suggested that snowfall in this sector 280 has been 25% higher than during the pre-industrial period (Medley et al., 2017). Sim-281 ilarly, SMB peaked in the Antarctic Peninsula in 2016, but the increase did not persist 282 after 2016. 283

The lower mass loss in the Antarctic Peninsula since 2016 and the steady increase 284 in mass in QML partially compensate the rapid mass loss in the Amundsen Sea Embay-285 ment (ASE) of West Antarctica and the lower but steady mass loss in the Wilkes Land 286 sector of East Antarctica. The mass loss in the ASE is caused by the steady speed up 287 of the glaciers in response to the enhanced intrusion of warm water of Circumpolar Deep 288 Water (CDW) origin toward the glaciers and to the retreat of the glacier grounding line 289 into thicker ice. In East Antarctica, significant losses were noted for the Frost, Totten 290 and Denman glaciers, principally caused by an acceleration in ice flow above that which 291 would maintain the glaciers in a state of mass balance, also due to an enhanced intru-292 sion of warm, modified CDW (Rintoul et al., 2016). 293

Overall, in Antarctica, we note a strong inter-annual to decadal variability in mass balance over the 2002-2019 GRACE/GRACE-FO record. A similar variability was noted in the longer historical record 1979-2018 where it was shown to reflect decadal fluctuations in SMB (Rignot et al., 2019).

²⁹⁸ 5 Conclusions

We demonstrate data continuity for the GRACE and GRACE-FO missions over the Greenland and Antarctic Ice Sheets at both the continental and regional scales using independent data from the Mass Budget Method. The GRACE and GRACE-FO data line up across the data gap and the excellent agreement between GRACE and the MBM data helps fill the data gap at the continental and regional scales. Noteworthy features

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include the large summer loss of 2019, one of the largest on record, captured by GRACEFO, the persistent snowfall in Queen Maud Land since 2009, and a pause in the acceleration in mass loss in Greenland and Antarctica for the joint GRACE/GRACE-FO period compared to the GRACE period alone. We note, however, that the longer record
from MBM still indicates increasing mass loss from both ice sheets and increasing contributions to sea level rise.

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