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Ice sheet mass balance and climate change

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Since the 2007 Intergovernmental Panel on Climate Change Fourth Assessment Report (IPCC AR4), both new observations of ice-sheet mass balance and improved computer simulations of ice-sheet response to ongoing climate change have been published. While Greenland is losing mass at an increasing pace, Antarctic loss is likely to be less than some recently-published estimates. It remains unclear whether East Antarctica has been gaining or losing mass over the last twenty years, and uncertainties in mass change for West Antarctica and the Antarctic Peninsula remain large. We highlight the last six years of progress and examine the key problems that remain.
1.0 Introduction

This review aims to synthesize key advances in monitoring and modelling of ice-sheet mass balance since the IPCC AR4. Mass balance is defined as the net result of mass gains (primarily snow accumulation) and mass losses (primarily melt-water runoff and solid ice dynamical discharge across the grounding line). Surface mass balance (SMB) is the net balance of mass gains and losses at the ice-sheet surface and does not include dynamical mass loss. Efforts to determine ice-sheet mass balance using the three satellite geodetic techniques of altimetry, interferometry, and gravimetry (see Section 2.1) have recently been sharpened by carefully defining common spatial and temporal domains for inter-comparison. Here we review the latest mass balance estimates for the Antarctic (AIS) and Greenland (GrIS) ice sheets. New glacial isostatic adjustment (GIA) models, tested and evaluated against Global Positioning System (GPS) data, have recently led to significant downwards revision in GIA, and hence downwards revisions of gravimetric and altimetric satellite estimates of Antarctic mass loss (Box 1).

Since IPCC AR4, ice-sheet models are no longer constrained to using overly simplified physics, allowing them to more accurately simulate the important coupling between ice sheets, ice streams and ice shelves. This major advance has been accompanied by improved model representation of the complex interactions of the ice-sheet with its bed, the atmosphere and the ocean. For completeness we also discuss briefly the contributions to sea-level rise (SLR) from other sources, namely glaciers and ice caps, thermal expansion of the oceans and terrestrial water storage changes. Despite recent advances, improved observations and predictions of ice-sheet response to climate change are as urgently...
needed to feed into mitigation and adaptation models of ensuing SLR as they were at the
time of the AR4.

2.0 Recent changes in ice sheet mass balance

2.1 Comparison of mass balance estimates

One of the most sought-after but elusive goals in contemporary Earth sciences is to relate
the mass-balance state of the great ice sheets to observed SLR. A measure of this state
provides an unambiguous quantification of the ice-sheet system response to climate
change. Recent mass-change estimates have been derived from three categories of
techniques:

- Volumetric techniques determine changes in the volume of the ice sheet via
  measurements of the height of the ice-sheet surface. These are based on radar altimetry
  or laser altimetry.

- Space gravimetric techniques derive changes in ice-sheet mass via repeated and
  very accurate measurement of the Earth’s gravity field by the Gravity Recovery and Climate
  Experiment (GRACE) satellite system.

- The mass budget technique compares estimates of the net ice accumulation on the
  ice sheets with estimates of discharge across the grounding line (Box 2).

Each estimate relies on observational data that are unique to its own strategy, and
each strategy, therefore, has a unique set of sensitivities to the errors and biases in its data.
For example, mass budget studies use modelled snowfall fields from atmospheric
reanalysis data\textsuperscript{9,10} to estimate the mass input into glacier basins, while radar and laser altimetry studies use the same fields to estimate the effective density of measured volume changes. Thus mass budget estimates have a first-order sensitivity to errors in the modelled mean accumulation rate, while radar and laser altimetry estimates have only limited sensitivity to errors in fluctuations in the accumulation rate.

Similarly, GRACE and radar and laser altimetry studies require the effects of GIA-related vertical bedrock motion (Box 1) to be accurately removed. Such vertical motion could be misinterpreted as ice-mass change by the GRACE satellites or ice-thickness change by radar and laser altimeters, and a GIA correction must therefore be applied. This correction is a small percentage (~5\%) of the total elevation change typically measured by altimeters; however, the GIA correction applied to GRACE data can be of the same order of magnitude as the signal due to contemporary ice-mass change (because of the density contrast between ice and the solid Earth). As a result, ambiguities in the GIA correction dominate GRACE sources of error in Antarctica (this is not as much of a problem for Greenland where the GIA correction is a much smaller fraction of the total mass change)\textsuperscript{6}.

Accurate quantification of the GIA signal is therefore crucial; small differences between models can alter the sign of the ice-mass change deduced from GRACE for individual drainage basins\textsuperscript{11}.

Published estimates of rates of Greenland and Antarctic ice-sheet mass change obtained using the above methods show a large spread of values for the last two decades (Figure 1). Some of this spread is due to technical differences and some is due to different measurement epochs. However, in the last year, estimates have begun to give a more coherent picture for both Antarctica and Greenland. For Greenland, the trend of increasing
mass loss [due to both SMB decrease and ice-to-ocean discharge increase] is clear, while
some of the large mass loss estimates for Antarctica have been discarded. We describe
some of the improvements in techniques and analysis below.

2.2 Reduced uncertainties

Recent assessments of mass-balance history\textsuperscript{12,13}, coupled with more robust GPS
observations of the motion of exposed bedrock\textsuperscript{14}, strongly suggest that Antarctic GIA-
related bedrock motion peaks at about 5-6 mm yr\textsuperscript{-1}. The resulting GIA models for
Antarctica\textsuperscript{13,15} deliver less than half the mass corrections implied by previous models. At
the same time, processing of GRACE data has become more consistent between groups as
the time series lengthens. Estimates using the latest models show moderate, if increasing,
decadal mass losses for Antarctica\textsuperscript{13,16,17}.

In the IMBIE (Ice-sheet Mass Balance Inter-comparison Exercise) project,
researchers recently compiled average sets of mass-balance estimates for common time
periods for both the Antarctic and Greenland ice sheets, using the latest data, with multiple
groups deriving estimates with each technique\textsuperscript{2}. An important technical change helped
reduce the difference among techniques: unlike previously published mass budget
estimates that extrapolated mass changes from surveyed to unsurveyed basins, the IMBIE
mass budget estimates use radar altimetry data to demonstrate that unsurveyed areas have
near-zero rates of mass change, giving, on average, less mass loss. Other extrapolation
techniques can give a more positive Antarctic balance for the same data\textsuperscript{18}. Similarly,
including the most recent GIA estimates for Antarctica brought GRACE estimates closer to
the radar and laser altimetry estimates. The IMBIE estimates are simple averages of all measurements, and the discordancy that remains among methods (between radar and laser altimetry, for example) is not fully understood.

Figure 1 shows that the disparity of recent mass balance results among different techniques – primarily from IMBIE – is considerably reduced from that seen before. There tend to be systematic differences between the results from different techniques, with the mass budget method giving the most negative estimate for both ice sheets, laser altimetry the most positive, and GRACE in between. IMBIE radar altimetry estimates cover only the sub-peninsular part of Antarctica, and give rates of mass change consistent with those from GRACE. The techniques agree in sign, and roughly in magnitude, for Greenland, and there is considerable basin scale spatial fidelity revealed in the inter-comparisons. Greenland had small contributions to SLR in the 1990s (-51±65 Gt yr\(^{-1}\)) but was recently (2005-10) losing mass at -263±30 Gt yr\(^{-1}\). (362.5 Gt yr\(^{-1}\) = 1 mm yr\(^{-1}\) sea-level equivalent.) The situation for Antarctica is less clear, with one estimate showing a significant positive mass balance\(^{19}\). An unweighted average of the estimates indicates that Antarctica, which was in a state of weakly negative balance in the 1990s, is now losing mass at a rate between -45 and -120 Gt yr\(^{-1}\), with large dynamic losses in West Antarctica partially offset by SMB gains in East Antarctica.

For Greenland, an independent group of researchers compared laser altimetry, mass budget, and GRACE estimates over the 2003-09 ICESat period: the mass budget estimate gave the maximum loss rates at -260±53 Gt yr\(^{-1}\) and GRACE the minimum, at -238±29 Gt yr\(^{-1}\).\(^{19,20}\) On a basin-by-basin basis, agreement between the mass budget method and other techniques provides validation for the practice of partitioning mass-balance change...
between discharge and SMB components, demonstrating that in the northern part of Greenland, the dominant cause of mass change was atmospheric in origin, while in the southern part it was ice dynamics.

The new, reconciled IMBIE GRACE estimates of whole Antarctic mass balance are now largely in agreement with one another, with 30-50 Gt yr\(^{-1}\) spreads between the largest and smallest 2003-08 rates. Previously published GRACE values show spreads around twice as large for similar time periods. In the Antarctic Peninsula and West Antarctica, the IMBIE estimates from laser altimetry and GRACE are in good agreement, in contrast to East Antarctica\(^2\). For East Antarctica, a mass gain of +101 Gt yr\(^{-1}\) for 2003-2008 has been proposed recently based on laser altimetry\(^1\), which is larger than the IMBIE GRACE estimate of +35 Gt yr\(^{-1}\) and near the upper end of the laser altimetry estimates\(^2\).

### 3.0 Recent advances in ice sheet modelling

#### 3.1 Key improvements and future challenges

Significant improvements in ice-sheet modelling have been made since the IPCC AR4, motivated by the need to understand ongoing changes and by the challenge to make more realistic projections for the next few centuries. The primary improvements concern mechanical approximations made to the ice flow equations. The very first generation of ice-sheet models was based on the shallow ice approximation\(^2\). Such models assume that all resistance to flow is provided by shear-stress gradients in the vertical, which is valid for creeping ice-sheet flow, but not when other ice-dynamical features such as ice streams and
ice sheet/ice shelf coupling come into play in ice-sheet evolution. More recent ice-sheet models now include horizontal stress gradients, and can be classified into three categories of increasing complexity and computational cost. Ice shelf/stream models are based on the shallow-shelf approximation. They include horizontal stress gradients, but neglect the vertical shear stresses (which is valid for rapid ice flow at low basal traction). Hybrid models use some combination of solutions from the shallow-ice approximation (to account for the vertical shearing component of flow within grounded ice) and the shallow-shelf approximation (to account for the horizontal stress coupling taking place in ice shelves or regions of rapid sliding). More elaborate higher-order models treat the vertical dimension more rigorously, with the only approximation being the hydrostatic assumption (pressure at any point in the ice is due only to the weight of the ice above it and not due to ice flow). Finally, a few models solve the equations of motion without neglecting any terms. These models, called “Full Stokes”, have recently demonstrated their ability to perform century-timescale simulations applied to a whole ice sheet.

Spatial resolution of models is the second aspect that has been improved. Hardly any model is now run with a spatial grid size greater than 20 km, but this resolution is still not high enough to resolve ice streams, which are often only a few kilometres wide. Moreover, grounding line migration and calving require sub-kilometre resolution. Unstructured grids (for finite element models) or adaptive mesh refinement are two strategies that have proven efficient at treating this difficulty with acceptable computational cost.

Finally, a third improvement has been enabled through satellite and ground-based observations, such as the quantification of surface velocities and velocity change from satellite interferometry, surface elevation change through satellite and airborne
campaigns (IceBridge), and high-resolution bedrock and ice thickness measurements. Ice-sheet model behaviour is highly dependent on initial and boundary conditions and face the difficulty that drag at the ice-bed interface is poorly known. Inverse methods have now been successfully implemented in ice-sheet models to infer the basal drag map that provides a good agreement between observed and simulated surface velocities. This procedure is becoming standard in the spin-up that is required for establishing an optimum initial state. All the above refinements enable models to reproduce present-day observed ice-sheet flow speeds, which is a major improvement since AR4.

3.2 Grounding lines, sliding and calving

Warming-induced ice-shelf loss has caused major glaciers and ice streams of Antarctica to speed up. Mechanisms behind this speedup are complex. Oceanic and/or atmospheric warming leads to ice-shelf thinning or disintegration, which in turn may lead to loss of buttressing, grounding line retreat and hence glacier speedup (Box 2). Observations from the Antarctic Peninsula and the Amundsen Sea Embayment in West Antarctica, e.g. Pine Island and Thwaites Glaciers, which are currently the main contributors of the AIS to SLR, support these mechanisms.

Major theoretical advances in understanding grounding-line motion and stability show that in the absence of buttressing (see Box 2), grounding lines retreat unstably on an upward-sloping bed (in the direction of ice flow). Analytical solutions are now available to test and verify marine ice-sheet models, so that the numerical error associated with predicting grounding-line motion can be reduced significantly to the level of parameter
models that attempt to account for grounding-line dynamics should incorporate horizontal stress transmission across the grounding line, so that the grounded ice sheet realistically feels the influence of floating ice (Box 2). Furthermore, the grounding line needs to be resolved at a sufficiently high spatial resolution. Such developments have been made recently and applied to Pine Island Glacier, where a small increase in sub-ice shelf melting has been shown to result in either unstable grounding line retreat, or grounding-line stabilization approximately 25 km inland within 100 years.

GIA also influences ice-sheet behaviour. Effects such as Earth deformation in response to ocean loading, and perturbations to the shape of the sea surface in response to the redistribution of both internal and surface masses, including changes to the mass of the ice sheet itself, play a key role in governing the behaviour of a marine-grounded ice sheet, such as West Antarctica. GIA alters the water depth via spatially-varying perturbations to both the ocean floor and the sea surface and this has a first-order effect on grounding line positions. Ignoring such processes can fundamentally alter model predictions relating to the stability of a marine-grounded ice sheet.

Ice flow across the grounding line is equally controlled by inland basal hydrological conditions and processes that govern basal sliding and sediment deformation. A wide range of observations over the Greenland ice sheet suggests that surface meltwater reaches the bed by fracture and drainage through moulins, which is likely to affect basal lubrication. Recent work has shown that it is not simply mean surface melt but an increase in water input variability that drives faster ice flow. This has been confirmed by observations. However, more recent work supports the original contention that increased meltwater leads to increases in basal sliding, but that the effect is much smaller than originally
thought because of buffering by subglacial drainage system evolution. Given the available evidence, the representation of basal sliding in large-scale ice sheet models still depends largely on empirical parameterisations based on observations of seasonal variations in ice flow.

Recent developments in the understanding of calving follow either fundamental process approaches, leading to global calving laws relating thickness at the grounding line/calving front to calving rate, or are based on stochastic modelling and fracture theory. Two-dimensional generalizations of similar calving laws have been proposed in large-scale models. More specific approaches take into consideration environmental factors, relating surface meltwater runoff and sub-shelf melting to the widening of crevasses and subsequent calving. However, model applications based on this approach remain restricted to one-dimensional flowline models, due to the lack of data to resolve the geometry of outlet glacier embayments at sufficiently high spatial resolution. While improvements have been made over recent years, this lack of data hampers a complete process-based evaluation of calving. In the near future, it is likely that models will continue to rely on empirically-based parameterisations of calving.

4.0 Future ice sheet changes

For significantly warmer climates, both the Greenland and Antarctic ice sheets are projected to lose mass. General circulation models (GCMs) generally project a small increase of snowfall over both ice sheets (Figure 2(d,e)). However, the mass loss from increasing surface melt will be dominant over the GrIS. For Antarctica, while the SMB is
projected to increase, there remain major uncertainties concerning the response of the
marine ice sheets and ice shelves to ocean forcing.

Surface melt already occurs over a large part of the GrIS during summer and reached a
new record in 2012\(^54\). Therefore, rising temperatures will mainly impact mass loss through
increased surface melt in summer, and several positive feedbacks may accelerate this
surface mass loss:

- Polar amplification of global warming resulting from, among other processes, the sea-
  ice extent decrease over the Arctic Ocean and its associated positive albedo feedback.
  This process, already observed in recent years\(^55\) and simulated by the Coupled Model
  Inter-comparison Project Phase 5 (CMIP5) GCMs (see Figure 2c compared with Figure
  2a), doubles the estimated uncertainties in projected near-surface temperature
  anomalies for Greenland compared with those at the global scale\(^56\).

- Positive snow albedo feedback over the ice sheet itself associated with the expansion
  of the bare ice zone. This effect explains why the meltwater runoff increases
  quadratically with rising summer temperatures: the albedo of bare ice (0.3-0.5) is
  much less than that of melting snow (~0.7), and surface meltwater becomes more
  likely to run off rather than percolating into deeper parts of the snowpack\(^57\).

- Positive elevation feedbacks associated with the thinning of the ice sheet resulting
  from the increasing surface melt and ice discharge. Significant thinning (up to 100 m)
  of the ice sheet is projected along the ice-sheet margin\(^58\), which should cause an
  additional melt increase over this area (as ice moves to lower elevations, where it is
  warmer).
Dynamical changes of the GrIS due to enhanced lubrication, calving and ocean warming still remain difficult to predict. Higher-order ice flow modelling of observed retreat of GrIS glaciers over the last decade and subsequent upscaling leads to a minimum additional SLR of 6±2 mm by 2100, with an upper bound of 45 mm when recurring forcing is applied\(^59\), while similar upscaling of realistic atmospheric and oceanic forcing of four GrIS glaciers with a calving model leads to a maximum dynamic contribution of 40-85 mm by 2100\(^60\). This is still lower than previous estimates, but higher than when this retreat chronology is implemented in a 3D higher-order model, leading to a dynamic contribution of 7-15 mm\(^61\). The reason for such low numbers is that due to the retreat of the ice sheet margin, calving seems to decrease in relative importance\(^53,61\). According to a model inter-comparison\(^62\) increased ice shelf melt rates of 2 m yr\(^{-1}\) lead to 27 mm SLR by 2100 (and 135 mm from a high melt rate of 20 m yr\(^{-1}\)). In response to SMB changes, ice-sheet model results are quite consistent and most studies conclude that the largest uncertainty comes from the spread among global climate models, which is amplified by some of the above-mentioned feedbacks over Greenland\(^56,58\).

For Antarctica, the amplification of the global climate modelling uncertainties is smaller and the contribution of Antarctica to SLR is predicted to increase logarithmically with rising global temperatures (as positive feedbacks become increasingly apparent later) but with little change, and even perhaps a negative contribution, in the next 100-200 years\(^53\). Firstly, polar amplification resulting from reduced sea-ice coverage seems to be smaller than for the Arctic (see Figure 2b). However, a changing Antarctic Circumpolar Current could potentially allow warmer water to penetrate into the coastal shelf regions of
Antarctica – as is observed. Secondly, little surface melt currently occurs and rising temperatures are not expected to significantly enhance surface melt in the next 100 years. Thirdly, an increase in snowfall is expected to be more significant due to atmospheric temperature rise, hence leading to an increase in SMB. Here, the elevation feedback resulting from SMB changes is negative because the ice sheet is initially projected to thicken, which is expected to affect its dynamics, especially on longer than centennial time scales.

The response of ice-sheet dynamics is twofold, due to increased accumulation and to higher ocean temperatures (in particular below the ice shelves). Two models produce ice-sheet thickening over East Antarctica and increased ice flux at the grounding line due to higher snowfall. However, both studies fail to account for processes at the ice-sheet – ice shelf – ocean interface, such as grounding-line retreat or loss of buttressing. To date, a continental-scale Antarctic ice-sheet model assessment taking into account those fundamental processes is lacking, although one assessment – based on a wide variety of model complexities – does report large inter-model variability in response to ocean forcing. Process-based modelling of parts of the WAIS, such as Pine Island Glacier, results in a SLR contribution of 27 mm by 2100 for a modest grounding-line retreat of 25 km, while significant (100 km) grounding line retreat was reported elsewhere. An alternative method based on probabilistic extrapolation of sustained glacier retreat from such numerical model output leads to a SLR contribution of 130 mm by 2100.

5.0 Other contributions to SLR
The global average rate of SLR over the last few decades was about 2-3 mm yr^{-1} \cite{67}. Estimates of the global contribution from glaciers and ice caps (GICs) to SLR in the IPCC AR4, 0.50±0.18 mm yr^{-1} (1961-2003) and 0.77±0.22 mm yr^{-1} (1993-2003), were based on extrapolation of sparse mass balance measurements made by the glaciological method\footnote{1} (Box 3). These values were later considered underestimates\cite{68}, due to the poor representation in the glacier inventories of the GICs peripheral to Greenland and Antarctica (PGICs): thus the 1961-2003 value was raised, based on a combined modelling and observations approach\cite{68}, to 0.79±0.34 mm yr^{-1} (no value provided for 1993-2003). A later extrapolation-based global estimate\cite{69}, with the novelty of allowing explicitly for glacier shrinkage, resulted in a lower estimate of 0.63 mm yr^{-1} for 1961-2006 (no uncertainty given). The extrapolation-based global estimates have been improved by the addition of geodetic mass balances (Box 3) to the inventories of mass balance by the glaciological method, which has resulted in consistently larger contributions to SLR, especially for the most recent periods \cite{67,70,69} (e.g. 0.99±0.04 and 1.46±0.34 mm yr^{-1} for 1993-2008 and 2000-2005, respectively), compared with 0.97 and 0.95 mm yr^{-1} for 1993-2006 and 2002-2006 respectively\footnote{69}.

Satellite gravimetry, a method traditionally restricted to the large ice sheets, has recently been used to estimate the global contribution of GICs to SLR\footnote{71}. GRACE data alone do not have the resolution to separate the Greenland and Antarctic ice sheets from their PGICs, but using an upscaling approach similar to that of ref. 68 has allowed one group to estimate a global contribution from GICs to SLR of 0.63±0.23 mm yr^{-1} during 2003-2010\footnote{71}, which is 30% and 47% lower than the two previous estimates that most closely match this
period (2002-2006\textsuperscript{69} and 2005-2010\textsuperscript{72}, respectively). GRACE results for GICs, however, are sensitive to the models used for calculating GIA, post-Little Ice Age isostatic rebound, and surface- and ground-water mass transfer corrections.

The large uncertainties associated with the conventional extrapolation-based methods mostly arise from the uneven representation of the glacierized regions in the mass balance measurements and the incomplete knowledge of the PGICs, both in terms of poorly known mass balances and inaccurate estimates of their area. The latter has greatly improved with the recent release of the Randolph Glacier Inventory\textsuperscript{73}. A consensus estimate combining GRACE, laser altimetry and the extrapolation-based method, using a common inventory of glaciers and a common spatial and temporal reference\textsuperscript{74}, has very recently enabled reconciliation of the disparate global estimates of wastage from GICs so far available from the different techniques. The consensus value is $0.71\pm0.08$ mm yr$^{-1}$ during 2003-2009, which is far lower than the extrapolation-based approach\textsuperscript{72} and somewhat higher than the GRACE-based estimate\textsuperscript{71}.

Ocean thermal expansion (OTE) is a major component of the SLR observed during the late 20\textsuperscript{th} century\textsuperscript{67}, and is projected to continue through the 21\textsuperscript{st} century and beyond\textsuperscript{75}. The IPCC AR4 found that OTE contributed $\sim25\%$ of the observed SLR for 1961-2003 and $\sim50\%$ for 1993-2003\textsuperscript{1}. Time-varying biases in the ocean temperature data, however, were recently detected\textsuperscript{76} and reduced. It is now understood that the percentages of SLR explained by OTE during the above periods are almost identical\textsuperscript{77}, and so are higher for 1961-2003 and lower for 1993-2003 than estimated in the IPCC AR4. A recent sea level budget\textsuperscript{67} indicates that OTE contributed $\sim40\%$ of the observed SLR since 1970 and $\sim30\%$ since 1993. Warming in the upper 700 m of the ocean explains about 70-80\% of the OTE
rates. Multi-decadal rates\textsuperscript{77} for OTE in the upper 700 m are \(0.71 \pm 0.10\) mm yr\(^{-1}\) for 1970-2011 and \(0.85 \pm 0.20\) mm yr\(^{-1}\) for 1993-2011, based on linear regression and time-variable uncertainties. Multi-decadal rates for the deep/abyssal ocean are very uncertain\textsuperscript{67}, as these are the most poorly sampled regions of the ocean. Since 2005, about 3,000 autonomous Argo profiling floats have been monitoring the upper 2,000 m of the ocean. The Argo-based OTE rate\textsuperscript{78} for 2005-2011 is \(0.60 \pm 0.20\) mm yr\(^{-1}\), in close agreement with the change inferred from satellite altimetry and GRACE\textsuperscript{79}. Although consistent with the rates estimated for the multi-decadal periods, the OTE rate for 2005-2011 is unlikely to represent long-term changes. Over such a short period, long-term changes can be easily obscured by more energetic ocean variability, such as fluctuations in the phase of the El Niño Southern Oscillation\textsuperscript{80}.

Recent estimates for total terrestrial water storage changes during 1993-2008, which include dam retention, groundwater depletion and natural terrestrial storage changes, give values ranging from \(-0.08 \pm 0.19\)\textsuperscript{67} to \(0.10 \pm 0.20\) mm yr\(^{-1}\). A much larger (positive) contribution dominated by groundwater depletion has recently been suggested\textsuperscript{82}, although this result is still controversial\textsuperscript{83}.

Table 1 summarizes the recent and current contributions to SLR calculated with the methods discussed in this paper and compares their sum with the observed SLR from tide gauges and satellite altimetry\textsuperscript{67}. OTE appears as the main current contributor to SLR, closely followed by the large ice sheets, whose contribution is increasing, and the GICs. The contribution from land-ice masses (ice sheets and GICs) could be slightly overestimated, because only some of the methods in the consensus estimate for ice sheets\textsuperscript{2} explicitly exclude the PGICs (and thus the contribution from PGICs may have been double-counted).
Also, the apparent decrease in the contribution from the GICs between the two periods (Table 1) is mostly a result of the different methods used, rather than a result of a lower SMB observed during 2005-2010\textsuperscript{72} (to illustrate this, we note that the GICs SLR contribution given in ref. 72 for 2000-2010 is $1.38 \pm 0.21 \text{ mm yr}^{-1}$). Note that, for the most recent period, there is a gap between the sum of contributions and the SLR observed from tide gauges and satellite altimetry.

6.0 Conclusions and outlook

During the last 20 years, the AIS as a whole (East, West, and Antarctic Peninsula) has been losing mass, and this is certainly true of the GrIS\textsuperscript{2}. There are still disagreements between the numbers that come from the mass-balance retrieval techniques, particularly for East Antarctica, demonstrating a need to better understand the errors of each method. For radar altimetry, further assessment is needed of surface-density corrections and of short-term corrections to ENVISat radar altimetry data\textsuperscript{84}, as more moderate estimates of rates of mass change are possible using such corrections. For the mass budget method, NASA’s Icebridge project will provide airborne-radar-based improvements to SMB estimates, and radar-sounding measurements of ice thickness at grounding lines will provide improved discharge estimates. Gravimetry and laser altimetry will have, respectively, GRACE and ICESat-2 follow-on missions (scheduled 2017 and 2016 launches) that will ideally provide a decadal record of whole ice-sheet mass balance. However, it is unlikely that these refinements will change the consensus picture emerging: while Antarctica as a whole is losing mass slowly (assessed to be contributing $0.2 \text{ mm yr}^{-1}$ sea-level equivalent by
IMBIE\textsuperscript{2}), Greenland, the Antarctic Peninsula, and parts of West Antarctica are together losing mass at a moderate (\(\sim 1 \text{ mm yr}^{-1}\) sea-level equivalent) rate today (\(\sim 70\%\) of this mass loss is from Greenland) and rates for each are becoming increasingly negative. For the last decade, the collective sea-level contribution from the ice sheets is similar to those from each of GICs and oceanic thermal expansion.

While the WAIS is most likely going to continue to contribute to SLR (although the amount is poorly constrained), the sign of the contribution of the EAIS over the next century is uncertain. From the standpoint of projecting global sea level through this century and beyond, it is of fundamental importance to focus on improving ice-sheet models, including representation of key processes and non-linear transitions. The concern of policymakers rightly focuses on the possibility of extreme outcomes with their large impact potential and adaptation need\textsuperscript{85}. This is particularly true for the cryosphere, which non-linearly responds to rising temperatures because of several potential positive feedbacks that may accelerate deglaciation. Improved knowledge of key ice-sheet thresholds would support climate policy decisions. Continued observations of ice-sheet processes and their implementation in ice-sheet models are crucial to ensure more accurate sea-level projections.

Other key challenges include a need for up-scaling parameterisations to allow low-resolution models, which run fast but with coarse meshes, to better represent crucial processes. To date, parameterisations for grounding line migration have been proposed\textsuperscript{38, 22} and tested against more complete models\textsuperscript{39}. While advances have been made on the theoretical level, process-based calving implemented in numerical flow models has, to date, relied on parameterisations. Progress has been achieved in the spinup of ice-sheet models
so that initial states are closer to observations through the use of inversion techniques. Nevertheless, the non-linearity of basal drag and its dependency on basal hydrology remains a concern. Time-dependent evolution of basal drag is not yet fully implemented in operational models, partly because subglacial hydrology models have not yet been fully implemented and partly because the required data to calibrate spatially-dependent basal friction laws are lacking. The recent release of velocity maps for various time periods gives hope that this problem will soon be tackled. A further vital step will be to couple improved ice-sheet models with atmosphere/ocean models and GIA models to account for all the feedbacks between the various physical systems at sufficiently high resolution. This will need to be supported by targeted observations at an appropriate spatial and temporal coverage.

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**Author contributions**
EH coordinated the study, EH, FN & FP led the writing, and all authors contributed to the writing and discussion of ideas.

References


Gives an overall view of remote sensing of ice-sheet mass balance and arrives at a nearly-reconciled estimate of the contribution of the ice-sheets to sea-level rise.


15. Whitehouse, P.L., Bentley, M.J., Milne, G.A., King, M.A. & Thomas, I.D. A new glacial isostatic adjustment model for Antarctica: calibrated and tested using observations of

**Demonstrates that new GIA models for Antarctica, which have been key to reconciling mass balance estimates, greatly improve the fit between modelled and observed (GPS) uplift rates.**


*Represents the first complete implementation of Full Stokes in dynamical ice-sheet models.*


*A complete and correct implementation of 3D grounding line dynamics applied to Pine Island Glacier for a loss of ice shelf buttressing, uniquely showing large grounding-line retreat.*


A community inter-comparison exercise that shows the capabilities of current ice-sheet models for robustly simulating grounding-line migration, which is key for predicting marine ice-sheet behaviour.


Shows the important role of the ice sheet-ice shelf transition zone in controlling marine ice-sheet dynamics (in particular, stability/instability).


Key paper documenting this large-scale Greenland melt event that was unprecedented in the modern satellite record.


Provides strong observational and model evidence of symptoms and causes of the recent amplified Arctic warming.


A good and recent (though the numbers are already outdated in many cases!) review of all contributions to SLR.


Presents a consensus estimate of the contributions of glaciers and ice caps to sea-level rise that reconciles the disparate estimates previously available from the different techniques.


Table 1. Estimated recent and current contributions to SLR and observed SLR from tide gauges and satellite altimetry. For Terrestrial Water Storage and Observed only the value for the longer time span is given; the terrestrial water storage number is used for the sum of contributions for both periods. For GICs we have taken, for 1993-2011, an update of that in ref. 72, while for 2003-2009 we have used the value given in ref. 74. The value given for Ocean Thermal Expansion combines a long-term abyssal value with updates, for the periods shown in the table, from an average of refs. 77 and 88, for the uppermost 700 m, and from ref. 88, for 0-2000 m. The value given for terrestrial water storage is an average of those in the references shown. The uncertainties given are the published errors from the individual studies (usually standard deviations). When data from several sources are combined, and for the sum of contributions, the quoted error is the square root of the sum of the individual variances.

<table>
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<tr>
<td><strong>GrIS + AIS</strong></td>
<td>0.59 ± 0.20</td>
<td>0.82 ± 0.16</td>
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<tr>
<td><strong>GICs</strong></td>
<td>1.40 ± 0.16</td>
<td>0.71 ± 0.08</td>
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<tr>
<td><strong>Ocean thermal</strong></td>
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<td>1.11 ± 0.80</td>
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<tr>
<td><strong>Terrestrial water</strong></td>
<td>0.02 ± 0.26</td>
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<tr>
<td><strong>Sum of contributions</strong></td>
<td><strong>3.11 ± 0.56</strong></td>
<td><strong>2.66 ± 0.86</strong></td>
</tr>
<tr>
<td><strong>Observed (1993-2008)</strong></td>
<td>3.22 ± 0.41</td>
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Figure captions

Figure 1. Summary of Antarctic and Greenland mass-rate estimates. In the studies published before 2012\(^2\) (left) and in 2012 (right) each estimate of a temporally-averaged rate of mass change is represented by a box whose width indicates the time period studied,
and whose height indicates the error estimate. Single-epoch (snapshot) estimates of mass balance are represented by vertical error bars when error estimates are available, and are otherwise represented by asterisks. 2012 studies comprise IMBIE combined estimates\(^2\) (solid lines), and estimates by Sasgen and others\(^{16,20}\) and King and others\(^{11}\) (dashed lines), Zwally and others\(^{19}\) (dot-dashed lines), Harig and Simons\(^{89}\) and Ewert and others\(^{90}\) (dotted lines).

Figure 2. Comparison of projected global, Antarctic and Greenland surface air temperature and snowfall anomalies to 2100. a) Anomaly of global mean 2m air temperature (T2m) simulated by 30 GCMs from the CMIP5 data base. Values are with respect to 1970-1999 for the RCP 4.5 (blue) and RCP 8.5 (red) scenarios. We refer to ref. 91 for more details about the Representative Concentration Pathways (RCP) scenarios. The evolving ensemble means are plotted as thick lines, with vertical bars representing ±1 standard deviation for each decade. A 10-year running mean was used to smooth the curves. b) Same as a) but for Antarctica. The land sea mask from each GCM is used to delimit Antarctica. c) Same as a) but for T2m over GrIS. The T2m anomaly is taken over the area covering Greenland (60-85°N and 20-70°W) and where surface elevation is higher than 1000 m a.s.l. d) Same as b) but for precipitation. Anomalies are given in % with respect to the mean precipitation for 1970-1999. e) Same as c) but for precipitation.

Figure 3. Illustration of a marine ice sheet and its interaction with the ocean. Warm modified Circumpolar Deep Water (mCDW) leads to melting at the grounding line, leading to ice shelf thinning and grounding line retreat. Marine ice-sheet instability occurs when, in
the lack of buttressing, the grounding line retreats on an upward-sloping (in the direction
of the flow) bedrock: ice flux increases with thickness at the grounding line, leading to an
increased outflux to the ocean that may be compensated by further grounding-line retreat,
until a new downward-sloping bed (pinning point) is reached. Thinning of ice sheet and
shelf can also be caused by surface melt and increased calving.

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**BOX 1: GIA models - recent developments**

Glacial isostatic adjustment (GIA) is the response of the solid Earth, including associated
differences in planetary gravity and rotation, to past ice and ocean mass redistribution\(^{92,93}\). The clearest observable effect of GIA is regional vertical rebound of the Earth’s surface.

Models of GIA are necessary for correcting measurements of present-day ice-mass change\(^{94}\).
and for long-term modelling. The assimilation of glacial geological constraints on former ice extent and geodetic constraints on rebound into GIA models is helping to reduce the uncertainty associated with GIA, and hence estimates of ice-mass change. However, several key challenges remain. First, ice extent and thickness changes during the last millennium are poorly known, and typically not included in GIA models, despite the fact that they can dominate the present-day rebound signal, especially in regions of low mantle viscosity. Second, lateral variations in Earth structure, as detected beneath Antarctica, also influence the GIA signal, but are not included in most models to date. Finally, the limitations of the data used to tune GIA models mean that probabilistic approaches are now being adopted to seek the most likely range of solutions.

**BOX 2: Marine ice sheets, grounding lines and buttressing**

Marine ice sheets, such as the West Antarctic ice sheet, rest on bedrock that lies below sea level. These grounded ice sheets are fringed by floating ice shelves. The grounding line is the contact of the ice sheet with the ocean where the ice mass starts to float by buoyancy.
Ice from the grounded ice sheet is discharged across the grounding line into ice shelves, from where icebergs break off, through a process called calving (Figure 3).

The migration of the grounding line is a result of the local balance between the masses of ice and displaced ocean water. The grounding line advances if previously floating ice becomes thick enough to ground, or retreats if previously grounded ice becomes thin enough to float. Theory has demonstrated that in order to simulate grounding line migration, it is necessary to include (horizontal) stress gradients across the grounding zone and in order to resolve this numerically, a high spatial resolution is needed, either by using a moving grid (following the grounding line directly) or by sub-sampling the grid around the grounding line to hundreds of metres. This high resolution is necessary to resolve horizontal stress gradients across a narrow boundary layer.

Ice discharge generally increases with increasing ice thickness at the grounding line. For a bed sloping down toward the interior this may lead to unstable grounding line retreat, as increased flux (e.g., due to reduced buttressing) leads to thinning and eventually floatation, which moves the grounding line into deeper water where the ice is thicker. Thicker ice results in increased ice flux, which further thins (and eventually floats) the ice, which results in further retreat into deeper water (and thicker ice), etc. (Figure 3). This unstable retreat is referred to as the marine ice-sheet instability. However, the grounding line is partially stabilized by the presence of ice shelves, which are either confined laterally through embayments or otherwise stabilised by locally grounded features which they enclose (e.g. pinning points). Both geometries transmit a back-force, or “buttressing”, etc.
toward the grounded ice sheet, which may help to stabilise the grounding line against unstable retreat down inland-sloping bedrock$^{100}$.

Thinning of ice shelves reduces drag at the margins and over pinning points, leading to increased ice flow across the grounding line, causing grounding-line retreat until a new stable point (e.g. upward sloping bedrock) is reached. The mechanisms described above rely heavily on a precise knowledge of the geometry of the ice/ocean contact, which explains why neighbouring outlet glaciers, in contact with the ocean, and subject to the same atmospheric and oceanic forcing, may exhibit contrasting behaviours$^{30}$.

**BOX 3: Glaciological versus geodetic method**

GIC mass balance estimates by the *glaciological method* are based on extrapolation over the whole glacier surface of measurements of accumulation and ablation made in-situ at single points. These measurements include readings of surface elevation changes at stakes, sampling
of density and accumulation in pits and shallow cores, and depth probing of the snow and firn, and shallow coring.

Estimates by the *geodetic method* are based on repeated mapping of glacier surface elevations to estimate the volume changes, from which the mass changes are calculated using information about the density of the material and its time variations. The elevation changes can be measured using different techniques, either from the glacier surface or, more commonly, from airborne or satellite-borne sensors.
Figure 1
Figure 3