



Brief communication: Ad hoc estimation of glacier contributions to sea-level rise from the latest glaciological observations

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Abstract. Comprehensive assessments of global glacier mass changes based on a variety of observations and prevailing methodologies have been published at multi-annual intervals. For the years in between, the glaciological method provides annual observations of specific mass changes but is suspected to not be representative at the regional to global scales due to uneven glacier distribution with respect to the full sample. Here, we present a simple approach to estimate and correct for this bias in the glaciological sample and, hence, to provide an ad hoc estimate of global glacier mass changes and corresponding sea-level equivalents for the latest years, i.e. about -300 ± 250 Gt in 2016/17 and -500 ± 200 Gt in 2017/18.

1 Introduction

Globally, more than 215 000 glaciers – distinct from the Greenland and Antarctic ice sheets – cover an area of about 700 000 km² (RGI, 2017) with a recently re-estimated total volume of about 160 000 km³ (Farinotti et al., 2019). Glaciers react sensitively to changes in climate (Bojinski et al., 2014) and substantially contribute to regional runoff (e.g. Biemans et al., 2019; Huss and Hock, 2018; Kaser et al., 2010; Pritchard, 2019) and global sea-level change (e.g. Hock et al., 2019; Marzeion et al., 2018). In the context of the Intergovernmental Panel on Climate Change (IPCC) assessment reports, the glaciological community has peri-

odically published observational estimates of glacier contributions to sea-level rise based on coordinated efforts making use of all available data at that time: Meier (1984) and Trupin et al. (1992) in IPCC TAR (2001); Kaser et al. (2006) based on Cogley (2005), Dyurgerov and Meier (2005), and Ohmura (2004) in IPCC AR4 (2007); Gardner et al. (2013) mainly based on Cogley (2009) in IPCC AR5 (2013). These approaches were challenged by small observational samples covering no more than a few hundred glaciers, with an uneven spatial and temporal distribution (Zemp et al., 2015) and were complemented for IPCC AR5 by estimates from spaceborne altimetry and gravimetry (Gardner et al., 2013). In view of the IPCC Special Report on the Ocean and Cryosphere in a Changing Climate (IPCC, 2019), Zemp et al. (2019) increased the observational sample to more than 19 000 glaciers by combining the results from glaciological and geodetic, from digital elevation model differencing, methods to assess annual mass changes and corresponding sea-level equivalents from 1961 to 2016. All of these major assessments provided new observational baselines for the comparison with estimates based on other methods such as spaceborne gravimetry or altimetry (e.g. Bolch et al., 2013; Wouters et al., 2019), as well as for modelling studies of future glacier contributions to regional runoff and global sea-level change. In view of the *global stocktake* to assess the collective progress towards achieving the Paris Agreement (cf. UNFCCC, 2016, Article 14), there is an increased demand for regular updates on the state of the climate. How-

ever, the approaches underlying these results are unsuitable for providing annual updates on the basis of new glaciological observations acquired each year due to the extensive analysis efforts required and due to generic lack of updates from multi-annual geodetic surveys (from differencing of digital elevation models). Here, we present a framework to infer ad hoc (i.e. timely but preliminary) estimates of global-scale glacier contributions to sea-level rise from annual updates of glaciological observations. For this purpose, we combine the annual anomaly provided by the glaciological sample (relative to a decadal mean) with the (mean) absolute mass-change rate of a reference dataset (i.e. Zemp et al., 2019) over a common calibration period (from 2006/07 to 2015/16). As a result, we here provide preliminary estimates of regional and global glacier mass changes and related uncertainties for the hydrological years 2016/17 and 2017/18. We also discuss the regional biases of the glaciological sample and conclude with a brief outlook on possible applications and remaining limitations of the glaciological observation network of the World Glacier Monitoring Service (WGMS).

2 Data and methods

2.1 Regional glacier areas and related change rates

The global distribution of glaciers is taken from the Randolph Glacier Inventory (RGI) version 6.0 (RGI, 2017). This dataset lists 215 547 glaciers covering a total area of 705 739 km², mainly for survey years between 2000 and 2010. The glaciers in the RGI are grouped into 19 first-order regions, which seems to be appropriate with respect to the spatial correlation distance of glacier mass-balance variability (i.e. several hundred kilometres; Cogley and Adams, 1998; Letréguilly and Reynaud, 1990). We consider changes in glacier area over time by using annual change rates for all first-order regions from Zemp et al. (2019, and references therein), based on a data collection from the literature. The regional glacier surface area S for a given year t_1 was calculated as

$$S_{t_1} = S_{t_0} + (t_1 - t_0) \cdot \frac{\delta S}{\delta t} = S_{t_0} + n \cdot \frac{\delta S}{\delta t}, \quad (1)$$

where S_{t_0} is the regional glacier area in the (regionally averaged) survey year of the RGI, $\delta S/\delta t$ the annual area-change rate, and n the number of years between t_0 and t_1 .

2.2 Regional glacier mass changes

We use the regional and global glacier mass changes (based on spatial interpolation) from 1961/62 to 2015/16 from Zemp et al. (2019) as a reference dataset, including corrected values for Iceland (cf. Zemp et al., 2020). For each region, this data set combines the temporal variability from the glaciological sample, obtained using a spatio-temporal variance decomposition model, with the glacier-specific change rates of the

geodetic sample. These calibrated annual time series in the metre water equivalent unit (1 m w.e. = 1000 kg m⁻²) were extrapolated from the observational to the full glacier sample within the region and multiplied by regional surface areas, resulting in regional mass changes in the unit gigatonnes (1 Gt = 10¹² kg). Full details are found in Zemp et al. (2019).

2.3 Glaciological observations

The glaciological method provides glacier-wide mass changes by using point measurements from seasonal or annual in situ campaigns, extrapolated to the overall glacier surface (cf. Cogley et al., 2011). We used the latest release of the Fluctuations of Glaciers (FoG) database as available from the WGMS (2019). This dataset is basically consistent with the glaciological data from 1961/62 to 2015/16 as used by Zemp et al. (2019) but includes updated mass balances for 2016/17 and 2017/18, as well as some corrections and addenda for earlier years. In total, this dataset contains 6986 annual mass balances from 459 glaciers. For 2016/17 and 2017/18, it contains annual balances from 154 and 103 glaciers, respectively. The WGMS provides glaciological balances for hydrological years, which begin near the start of the accumulation season and end near the end of the ablation season (cf. Cogley et al., 2011). As a consequence, the results refer to different time periods when comparing regions from the Northern to the Southern Hemisphere, or to the low latitudes.

2.4 Ad hoc estimation of regional mass changes and sea-level equivalents

A change in climatic factors is reflected in a corresponding change of the (regional climatic) equilibrium line altitude (ELA; cf. Cogley et al., 2011), which shifts the vertical mass-balance profile (Fig. S1a–c in the Supplement). The glaciers of a region can react with a large range of specific mass balances to such a change (Fig. S1d; Kuhn et al., 1985). At the same time, these glaciers are expected to feature common mass-balance anomalies (Fig. S1d; Vincent et al., 2017), i.e. positive or negative deviations for a decrease or increase of the ELA, respectively. Building on these basic assumptions, we calculated the annual ad hoc estimate for regional mass changes (Fig. S1e) and corresponding sea-level equivalents for a given ad hoc year of observations Y (e.g. 2017/18) in the following five steps.

1. For each glacier g with observations in a given year Y , we calculated the glaciological mass-balance anomaly β , similar to the “centred mass balance” by Vincent et al. (2017), as the anomaly of the glaciological balance of the ad hoc year $B_{\text{glac},Y,g}$ with respect to the arithmetic mean balance over the calibration period from 2006/07 to 2015/16 $\bar{B}_{\text{glac},2007-2016,g}$:

$$\beta_{Y,g} = B_{\text{glac},Y,g} - \bar{B}_{\text{glac},2007-2016,g}. \quad (2)$$

Note that $\sum_{i=2007}^{2016} \beta_{i,g} = 0$ by definition. Here, the calibration period was set to the last decade of available reference data as these years best reflect the current mass-change conditions and provide largest glaciological sample size.

- For each RGI region r , the mean glaciological mass-balance anomaly $\bar{\beta}$ was calculated as the arithmetic average anomaly of the number of glaciers G with available data in Y :

$$\bar{\beta}_{Y,r} = \frac{\sum_{g=1}^G \beta_{Y,g}}{G}. \quad (3)$$

- For each region r , the ad hoc estimate of the annual specific mass change B_{adhoc} (in m w.e.) was calculated by adding the regional anomaly $\bar{\beta}$ of the ad hoc year (in m w.e.) to the mean specific mass change \bar{B}_{ref} of the corresponding region from the reference data over the calibration period from 2006/07 to 2015/16 (in m w.e. yr⁻¹):

$$B_{\text{adhoc},Y,r} = m \cdot \bar{\beta}_{Y,r} + \bar{B}_{\text{ref},2007-2016,r}. \quad (4)$$

Basically, this corresponds to a linear regression model with slope m and y intercept \bar{B}_{ref} (Fig. S2). We set $m = 1$ in order to make the ad hoc estimation applicable to reference data providing mass-change rates but without annual resolution (cf. Fig. S3) and compare these results with the ones from a regression model with variable slopes (Table S2). Apart from that, we note that for a stable glacier sample (i.e. observations available from the same glaciers from year to year), the present approach corresponds to a simple bias correction of the glaciological sample with respect to the reference data. The corresponding regional bias ε of the glaciological sample can be calculated as

$$\varepsilon_{\text{glac},2007-2016,r} = \bar{B}_{\text{glac},2007-2016,r} - \bar{B}_{\text{ref},2007-2016,r}. \quad (5)$$

- For each region r , we calculated the ad hoc estimate of the regional mass change ΔM by multiplying the regional specific mass change by the regional glacier area for that particular year $S_{Y,r}$, considering the cumulative area changes since the survey year of the RGI (cf. Eq. 1):

$$\Delta M_{\text{adhoc},Y,r} = B_{\text{adhoc},Y,r} \cdot S_{Y,r}. \quad (6)$$

- Finally, we calculated the ad hoc estimate of the corresponding worldwide sea-level equivalent SLE as

$$\text{SLE}_{\text{adhoc},Y} = (-1 \cdot \sum_{r=1}^R \Delta M_{\text{adhoc},Y,r}) / S_{\text{ocean}}, \quad (7)$$

where S_{ocean} is the area of the ocean with $362.5 \times 10^6 \text{ km}^2$ (Cogley, 2012).

For regions with no glaciological observations in the ad hoc year, we used available data from neighbouring regions. In line with Zemp et al. (2019), we selected WGMS *reference glaciers* with long-term data series from neighbouring regions that feature a similar mass-balance variability based on qualitative and quantitative criteria, such as a good correlation between mass-balance series available from earlier years (see Table S1 in the Supplement).

2.5 Uncertainty estimates

The regional mass changes from Zemp et al. (2019) come with error bars considering uncertainties from four independent sources: the temporal variability in the glaciological sample, the long-term geodetic mass changes, the extrapolation to unmeasured glaciers, and the regional glacier area. We combined these overall error bars from Zemp et al. (2019) with an additional uncertainty related to the estimation of the mass-balance anomaly. For the latter, we estimated the uncertainty as 1.96 times the (sample) standard deviation of the mean glaciological mass-balance anomaly for each region over the calibration period from 2006/07 to 2015/16 (cf. Eq. 3), which corresponds to a 95 % confidence interval. In cases with only one glacier in the glaciological sample (resulting in a standard deviation of zero), we set the uncertainty to 100 % of the anomaly. The two errors related to the reference dataset and to the mass-balance anomaly were combined according to the law of random error propagation. For global sums, the overall error was calculated by cumulating the regional errors according to the law of random error propagation for independent terms.

3 Results and discussion

3.1 Ad hoc estimates for 2016/17 and 2017/18

For 2016/17, the glaciological observations from 154 glaciers (from 15 of 19 regions) give a global average specific mass change of $-0.5 \pm 0.4 \text{ m w.e.}$ (Table 1). The above presented ad hoc estimation suggests a global mass change of $-316 \pm 240 \text{ Gt}$ corresponding to $0.9 \pm 0.6 \text{ mm SLE}$. Glaciers suffered most in Central Europe, Alaska, and in the low latitudes with regional specific mass changes being more negative than -1 m w.e. (Table 1, Fig. 1). The largest annual contributions to global sea-level originated from Alaska (-115 Gt), the Antarctic (-64 Gt), and High Mountain Asia (-41 Gt). For New Zealand, the Southern Andes, and Arctic Canada North, investigators reported positive mass balances resulting – after bias correction – in a net mass gain of 4 Gt (essentially from the latter region).

For 2017/18, data reported thus far from 103 glaciers (from 14 out of 19 regions) comprise about two-thirds of the currently observed glaciers (Table S1). This is related to the 1-year retention period that is granted to allow investigators time to properly analyse, document, and publish their

Table 1. Ad hoc estimates of glacier mass changes in 2016/17 and 2017/18. For both years, the table shows glacier areas (S) based on RGI 6.0 (2017) and corrected for annual area change rates from Zemp et al. (2019), specific mass changes calculated as arithmetic mean of the glaciological sample (B_{glac}) and based on the ad hoc estimation (B_{adhoc} , Eq. 4), as well as anomaly-corrected mass change (ΔM , Eq. 6) for all regions and global totals. Global specific mass changes and related biases are calculated as area-weighted regional means. Uncertainties correspond to 95 % confidence intervals. The annual global mass changes in 2016/17 and 2017/18 correspond to 0.9 ± 0.6 and 1.4 ± 0.5 mm SLE, respectively. Glaciological input data are from WGMS (2019).

Region	Area (km ²)		Specific mass change (m w.e.)				Mass change (Gt)	
	S 2017	S 2018	B_{glac} 2017	B_{adhoc} 2017	B_{glac} 2018	B_{adhoc} 2018	ΔM 2017	ΔM 2018
01 Alaska	83 395	82 978	-1.18	-1.37 ± 0.63	-1.85	-2.29 ± 0.56	-115 ± 53	-190 ± 47
02 Western Canada & USA	13 661	13 583	-0.54	-0.68 ± 1.05	-0.65	-0.85 ± 0.74	-9 ± 14	-12 ± 10
03 Arctic Canada North	103 860	103 787	0.03	0.07 ± 0.99	-0.82	-0.90 ± 0.87	8 ± 103	-93 ± 91
04 Arctic Canada South	40 332	40 299	-0.22	-0.22 ± 1.18	-0.82	-0.90 ± 0.78	-9 ± 48	-36 ± 31
05 Greenland	77 946	77 210	-0.41	-0.27 ± 0.65	-0.33	-0.44 ± 0.60	-21 ± 50	-34 ± 46
06 Iceland	10 383	10 343	-0.29	-0.11 ± 0.76	-0.05	0.14 ± 0.99	-1 ± 8	1 ± 10
07 Svalbard & Jan Mayen	32 546	32 458	-0.59	-0.57 ± 0.64	-0.62	-0.69 ± 0.46	-18 ± 21	-23 ± 15
08 Scandinavia	2830	2822	-0.03	-0.09 ± 1.35	-1.44	-1.48 ± 0.86	0 ± 4	-4 ± 2
09 Russian Arctic	51 138	51 097	-0.72	-0.69 ± 0.45	-0.82	-0.80 ± 0.45	-35 ± 23	-41 ± 23
10 North Asia	2348	2337	-0.90	-0.67 ± 0.76	-0.39	-0.17 ± 0.64	-2 ± 2	0 ± 2
11 Central Europe	1820	1800	-1.64	-1.60 ± 0.81	-1.44	-1.43 ± 1.06	-3 ± 2	-3 ± 2
12 Caucasus & Middle East	1196	1189	-0.84	-0.89 ± 0.90	-0.22	-0.28 ± 1.67	-1 ± 1	0 ± 2
13 Central Asia	48 061	47 972	-0.77	-0.39 ± 0.76	-0.51	-0.11 ± 0.59	-19 ± 37	-5 ± 29
14 South Asia West	31 876	31 755	-0.90	-0.34 ± 0.69	-0.39	0.17 ± 0.55	-11 ± 22	5 ± 18
15 South Asia East	13 765	13 695	-1.07	-0.77 ± 1.02	-1.37	-1.10 ± 0.44	-11 ± 14	-15 ± 6
16 Low latitudes	1867	1840	-1.06	-1.13 ± 1.53	-0.37	-0.29 ± 1.78	-2 ± 3	-1 ± 3
17 Southern Andes	28 528	28 476	0.37	-0.13 ± 4.43	-0.64	-1.11 ± 2.11	-4 ± 126	-32 ± 60
18 New Zealand	849	841	0.41	0.13 ± 1.78	-2.34	-2.62 ± 1.77	0 ± 2	-2 ± 2
19 Antarctic & Subantarctic	122 822	122 464	-0.28	-0.52 ± 1.16	-0.13	-0.16 ± 1.14	-64 ± 143	-20 ± 140
Global total, excluding 05 & 19	468 455	467 272	-0.53	-0.49 ± 0.40	-0.91	-0.96 ± 0.28	-231 ± 186	-449 ± 131
Global total	669 223	666 946	-0.47	-0.47 ± 0.36	-0.70	-0.75 ± 0.29	-316 ± 240	-502 ± 197

data before submission to the WGMS. Based on this preliminary data, the global average specific mass change was -0.8 ± 0.3 m w.e. (Table 1). The ad hoc estimation results in a global mass change of -502 ± 197 Gt, corresponding to 1.4 ± 0.5 mm SLE. Reported mass balances were negative in all regions. Ad hoc estimates indicate that specific mass balances were more negative than -1 m w.e. in six regions, with New Zealand and Alaska even exceeding -2 m w.e. (Table 1, Fig. 1). With respect to sea-level rise, Alaska (-190 Gt) and the Canadian Arctic (North and South combined: -129 Gt) were the largest contributors in this year.

The ad hoc estimates for 2016/17 and 2017/18 indicate both an annual global glacier contribution of about 1 mm SLE – a benchmark that was only exceeded three times during the period from 1961/62 to 2015/16, when compared to the reference data (Fig. 2). In fact, 2017/18 featured the largest mass loss of the entire data series. The latest glaciological observations, hence, provide evidence of continued increasing global glacier mass losses since the 1980s.

3.2 Comparison to global reference datasets

We calculated annual ad hoc estimates for all years back to 1961/62 using the period from 2006/07 to 2015/16 for anomaly calculation and bias correction (Fig. 2a). These can be compared to the global reference data over the 45 years before 2006/07. We note that this is not a validation against

independent data but an approach to test the ability of the glaciological sample of a given year to estimate the global glacier contribution to sea-level rise. Overall, the ad hoc estimates are in good agreement with the reference data but feature a slightly larger variability. The latter can be partially explained by the smaller sample size available for the ad hoc estimates. The best agreement is found over the more recent period back to 1990, followed by a strong variability and corresponding over and underestimations during the 1980s, and relative good agreement again in the 1970s and 1960s. The strongest deviations occur in 1963/64, 1964/65, and between 1977/78 and 1987/88 and seem to be correlated with years in which many regions had positive glaciological balances. At the same time, the variance decomposition model as used by Zemp et al. (2019) tends to reduce the variance for statistically small samples since it only extracts the common year-to-year variability found in all glaciological time series of a region. The variability (at each glacier) that is not found at other locations is assigned to the residual (i.e. the unexplained variance). Therefore, our ad hoc estimate is generally well suited to assess the global value of the more representative reference data. However, in years with small data samples and strong anomalies it remains arguable which of the two approaches better represents the correct global glacier mass changes. The uncertainty range of the ad hoc estimates is larger than that of the reference data in the most recent

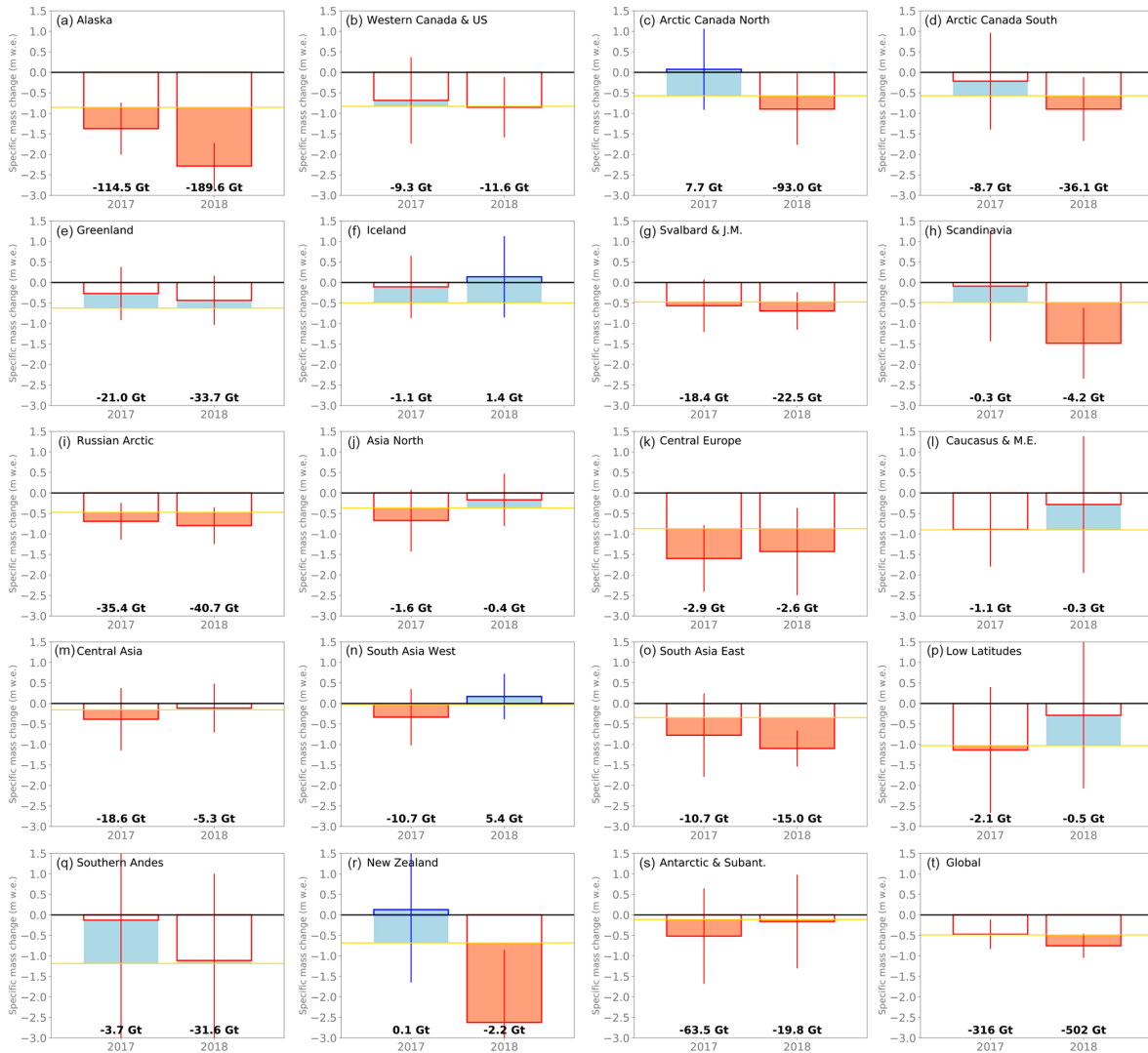


Figure 1. Ad hoc estimates of regional mass changes in 2016/17 and 2017/18. The regional (a–s) and global (t) bar plots show the annual specific mass changes (in m w.e.) with related error bars (indicating 95 % confidence intervals), with positive and negative values in blue and red, respectively. The golden line indicates the annual mass-change rate of the reference data (in m w.e. yr⁻¹; Zemp et al., 2019) over the calibration period (2006/07–2015/16). Positive and negative annual mass-change anomalies (with respect to reference data and calibration period) are indicated in pale blue and pale red, respectively. The black values (bottom) indicate annual mass changes in gigatonnes. Plots are ordered from top left to bottom right according to the region numbers in RGI 6.0 (see Table 1).

validation period, since it combines the error bars of the reference data with those from the bias estimates. For the earlier validation periods, the uncertainty range of the reference data becomes larger, whereas the one from the ad hoc estimates is still based on reference data from the calibration period. This is arguably an artefact from the optimization of our approach to the estimation of mass changes for the most recent years 2016/17 and 2017/18.

The use of Zemp et al. (2019) as the reference dataset has the advantage of analysing the performance of the ad hoc estimation at annual time resolution back to the 1960s, and it allows for adjusting the reference period. We show that the ad hoc estimate can be sensitive to the choice of the refer-

ence period (i.e. 2006/07–2016/17 in Fig. 1 and 2003/04–2008/09 in Fig. S3a–e), especially when it results in major changes in the glaciological sample such as the use of glaciers from neighbouring regions. As an example, the annual ad hoc estimates for Arctic Canada North change from +8 and –93 Gt (Fig. 1c) to +6 and –69 Gt (Fig. S3a) for 2016/17 and 2017/18, respectively. However, our approach can be applied to other reference datasets that provide regional mass changes for a multi-year period but without annual resolution. In Fig. S3, we demonstrate this with ad hoc estimations for selected regions (with large glacierization but limited data coverage in Zemp et al., 2019) and different reference datasets (Bolch et al., 2013; Gardner et al., 2013;

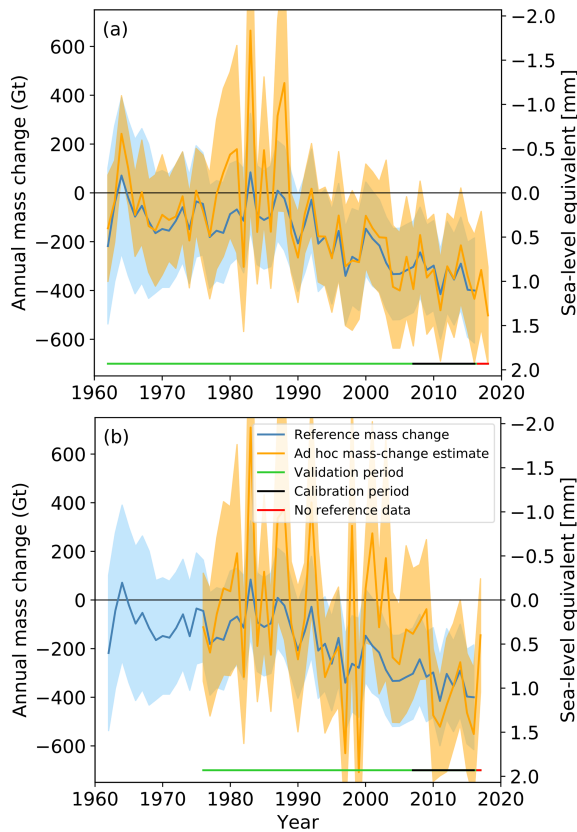


Figure 2. Global glacier contributions to sea-level rise from 1961/62 to 2017/18. **(a)** Full glaciological sample: annual mass changes (left y axis) and global sea-level equivalents (right y axis) are shown with related error bars (indicated by shadings) corresponding to 95 % confidence intervals. The ad hoc estimates (orange), based on the full glaciological samples of corresponding years, are shown with annual values of the reference dataset (blue) by Zemp et al. (2019), which was used for calibration. The bottom line indicates the time periods used for calibration (black), validation (green), and without reference data (red). **(b)** Reference glacier sample: same plot but for ad hoc estimates (orange) solely based on glaciological data from the 41 WGMS reference glaciers (with more than 30 years of ongoing measurements). Due to limited data coverage, no ad hoc estimates were possible for 2017/18 and before 1975/76.

Wouters et al., 2019). The relative difference between the anomalies (derived from the glaciological sample) of the two ad hoc years are consistent, but the absolute values vary between the different reference datasets (due to different mass change rates over the calibration periods). This implies that our approach allows for a regional selection of reference datasets and, hence, can be used in future consensus estimates of global glacier mass changes.

3.3 Lessons learned for the glaciological observation network

In the field of glacier monitoring, one outstanding question is how representative the local glaciological observations for regional to global mass changes are (Fountain et al., 2009; Kaser et al., 2006). With the availability of the global reference dataset by Zemp et al. (2019), the present approach allows us to assess the bias in the glaciological observations for all regions (cf. Eq. 5, basically the difference between B_{glac} and $B_{\text{ad hoc}}$ in Table 1). At a regional level, the annual bias ranges between -0.6 and $+0.5$ m w.e. This confirms that the glaciological observations are well suited to represent the temporal variability but not necessarily the absolute value of regional glacier mass changes. At global level, the bias averaged out for the area-weighted mean. However, this is rather fortuitous and can change with the use of a different reference dataset (e.g. Gardner et al., 2013; Wouters et al., 2019).

Another question is whether a glaciological observation network reduced to the long-term observation series is good enough to estimate the temporal variability of global glacier mass changes. We thus performed another ad hoc estimate with a glaciological sample reduced to the current 41 WGMS reference glaciers (Fig. 2b), coming with more than 30 years of ongoing mass-balance measurements (WGMS, 2017). The WGMS reference glaciers provide a more stable sample over time but come at the price of a much reduced sample size. As such, the sample is reduced from 154 to 38 glaciers with observations in 2016/17 and, hence, neighbouring glaciers are needed in 10 (instead of 4) out of 19 regions (Table S1). The ad hoc estimates for the WGMS reference glacier sample from 1975/76 (i.e. the first year with reference glacier data from the southern hemisphere) to 2016/17 show a much-increased variability, strong offsets over certain periods, and an increased uncertainty by about 40 % (Figs. 2, S4). This low performance suggests that – for the present approach – the WGMS reference glacier sample alone is too small and represents too few regions for an ad hoc estimation of global glacier contributions to sea-level rise. It is worthwhile to note that regions with large areas of glacierization (e.g. Arctic Canada South, Russian Arctic, South Asia East & West, peripheral Greenland, and peripheral Antarctica) lack long-term mass-balance series.

4 Conclusions and outlook

Direct glaciological observations, as currently conducted for about 150 glaciers worldwide, are able to satisfactorily capture the temporal mass-balance variability but are often not representative of the total mass change of a region. We presented a new approach to provide ad hoc estimates of regional glacier mass changes for the most recent years based on the anomaly of glaciological mass-balance observations and a bias correction to a reference dataset over a common

calibration period from 2006/07 to 2015/16. The ad hoc estimates for 2016/17 and 2017/18 indicate that global glacier mass loss has further increased (with respect to the previous decade) and resulted in annual global glacier contributions to sea-level rise exceeding 1 mm SLE, which corresponds to more than a quarter of the currently observed sea-level rise (cf. IPCC, 2019). Our new approach allows for the timely reporting of global glacier mass changes and can be applied to a new consensus estimate as reference data, once available. To increase the accuracy of the global ad hoc estimates, we need to extend the glaciological sample into so far underrepresented and strongly glacierized regions such as High Mountain Asia, the Southern Andes, Russian Arctic, Greenland, or Antarctica. At the same time, we need to tap the full potential of spaceborne surveys to further improve the spatio-temporal coverage and resolution of the reference datasets.

Code availability. The analytical scripts are available from the lead author on request.

Data availability. The full sample of glaciological observations for individual glaciers is publicly available from the WGMS (<https://doi.org/10.5904/wgms-fog-2019-12>; WGMS, 2019). The regional and global reference datasets from Zemp et al. (2019) are available from the Zenodo repository (<https://doi.org/10.5281/zenodo.3557199>; Zemp, 2019).

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Author contributions. MZ, FP, and MH developed the basic concept of the study consulting with ET and NE for statistical backup; MZ, IG, and SN compiled and quality-checked the glaciological data with the support of the WGMS collaboration network; MZ performed all computations, designed the figures and wrote the manuscript. All authors commented on the manuscript.

Competing interests. The authors declare that they have no conflict of interest.

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