

1 **Glacial runoff modulates 21st century basin-level water**
2 **availability, but models disagree on the details**

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6 **Key Points:**

- 7 • We compute the effect of glacial runoff on the Standardized Precipitation-Evapotranspiration
8 Index for 56 glaciated basins worldwide.
9 • In general, accounting for glacial runoff increases mean SPEI and decreases vari-
10 ance.
11 • Projected 21st-century changes in basin hydroclimate both with and without glacial
12 runoff show wide variation across models.

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Abstract

Global climate model projections suggest that 21st century climate change will bring significant drying in the midlatitudes. Recent glacier modeling suggests that runoff from glaciers will continue to provide substantial freshwater in many drainage basins, though the supply will generally diminish throughout the century. In the absence of dynamic glacier ice within global climate models (GCMs), a comprehensive picture of future basin-scale water availability for human and ecosystem services has been elusive. Here, we leverage the results of existing GCMs and a global glacier model to compute the effect of glacial runoff on the Standardized Precipitation-Evapotranspiration Index (SPEI), an indicator of basin-scale water availability. We find that glacial runoff tends to increase mean SPEI and reduce interannual variability, even in basins with relatively little glacier cover. However, in many basins we find inter-GCM spread comparable to the amplitude of the ensemble mean glacial effect, which suggests considerable structural uncertainty.

Plain Language Summary

Every year, glaciers accumulate some water from precipitation and release some water from melting and surface runoff. The seasonal pattern of freshwater release from glaciers makes them an important source of freshwater for mountainous regions around the world. Computer simulations have shown that the supply of freshwater from glaciers is likely to change as the climate changes. Separately, global climate model simulations suggest that many regions will experience more drought in the coming decades due to changes in the global water cycle. To understand what consequences those changes could have for on-the-ground water availability, we analysed existing simulations of glaciers together with global climate model simulations. We calculated a metric called the Standardized Precipitation-Evapotranspiration Index, which quantifies drought conditions. We found that including glacial meltwater and runoff in the calculation of SPEI can reduce drought risk during the 21st century in many regions. However, the glacial effect becomes weaker as glaciers shrink due to climate change, and the strength of the effect over time varies from one global climate model to another. Motivated by these results, we identify priority areas for model development to build a more consistent understanding of the glacial buffering effect on drought.

1 Introduction

Global climate model projections suggest that on large scales the terrestrial midlatitudes will experience significant drying over the coming century (Cook et al., 2014, 2020), although there are uncertainties related to the choice of hydroclimate metric and the role of land surface processes in driving those changes (Milly & Dunne, 2016; Swann et al., 2016; Scheff et al., 2017; Mankin et al., 2018; Yang et al., 2019; Mankin et al., 2019; Ault, 2020). While ongoing model development has improved the treatment of key climate processes that shape water availability for human and ecosystem services (“hydroclimate processes”), a number of factors remain difficult to capture, particularly those at regional and smaller spatial scales. For instance, current global climate models do not account for changing glacier volume and extent, with important consequences for projections of future water availability in glaciated regions (Barnett et al., 2005). Runoff from mountain glaciers accounts for up to 40% of dry-season water supply in arid regions (Soruco et al., 2015; Pritchard, 2019). Future glacier runoff depends on nonlinear glacier-dynamic response to changing climate (Huss & Hock, 2018), which cannot be simulated directly in global climate models nor extrapolated from observations. Moreover, the importance of glacial runoff for water supply differs with regional climate (Kaser et al., 2010; Immerzeel et al., 2010; Rowan et al., 2018), emphasising the need for a holistic view of glaciated-basin hydroclimate change.

62 The use of state-of-the-art global climate models (GCMs) to project hydroclimate
63 change is appealing because the simulated changes reflect self-consistent climate physics
64 on the global-to-regional scale. Nevertheless, the climate physics simulated by each GCM
65 are an uncertain approximation of those in the real world. Intercomparisons of multi-
66 ple GCMs allow for a quantification of the range of projections that result from the un-
67 certain approximations made by each—so called structural uncertainty. These quantifi-
68 cations are hindered, however, by the incomparability of directly-simulated hydroclimate
69 quantities across GCMs. For example, the land components of GCMs range widely in
70 complexity, including different numbers of soil levels with inconsistent corresponding depths
71 (e.g. Cook et al., 2014) and widely varying runoff sensitivities (e.g. Lehner et al., 2019).
72 The resulting difficulty in comparing hydroclimate metrics directly across GCMs has led
73 to the widespread use of offline hydroclimate metrics when quantifying hydroclimate change,
74 specifically in the form of standardized drought indices that facilitate like-for-like inter-
75 comparison.

76 Among the drought indices in operational use (reviewed by World Meteorological
77 Organization & Global Water Partnership, 2016), only a few are globally intercompara-
78 ble, scalable for different types of drought, and applicable under a variety of future cli-
79 mate change scenarios. The Standardized Precipitation-Evapotranspiration Index (SPEI;
80 Vicente-Serrano et al., 2009) satisfies all of these criteria. SPEI is regularly computed
81 at the coarse spatial resolutions typical of GCMs, both for operational drought moni-
82 toring and forecasting and for projections of drought conditions in a changing climate
83 (Cook et al., 2014). The index includes a user-defined temporal scale to facilitate stud-
84 ies of hydroclimate variability across timescales and climatic system components (e.g.
85 Lorenzo-Lacruz et al., 2010; Potop et al., 2012; Kingston et al., 2014; Ault, 2020). In semi-
86 arid mountain regions—where glacial runoff is most likely to be an important water source—
87 SPEI realistically captures hydrological drought at timescales of 11 to 15 months (McEvoy
88 et al., 2012; Jiang et al., 2017).

89 The analysis of GCM-derived drought indices depends on reliable simulation of hy-
90 droclimate. The representation of land surface processes, including those related to veg-
91 etation, remains a source of uncertainty in hydroclimate projections (Mankin et al., 2017,
92 2019; Lehner et al., 2019). In many cases, GCM land components are not equipped to
93 handle the hydrology of glaciated drainage basins on the century scale. The MATSIRO
94 land surface model (Takata et al., 2003) used in MIROC-ESM, for example, handles wa-
95 ter routing through snowpack, but not multiannual storage in glacier ice. The land sur-
96 face scheme of CNRM-CM6 allows limited water storage in snow and ice and includes
97 a “permanent snow/ice” land tile classification (Decharme et al., 2019), but cannot re-
98 solve changes in ice cover over time. GCMs including CCSM and NorESM use the Com-
99 munity Land Model (CLM) to simulate land-surface dynamics and hydrology. CLM in-
100 cludes glacier ice among its land-cover types, but does not account for glacier dynam-
101 ics or change over time (Lawrence et al., 2018). Further, the spatial resolution of cur-
102 rent GCMs leaves them poorly equipped to handle precipitation gradients in high-relief
103 areas (Flato et al., 2013), where mid-latitude glaciers are most likely to be found. Global
104 glacier models have demonstrated that glacier coverage worldwide cannot be assumed
105 static over the coming century (Huss & Hock, 2018; Marzeion et al., 2018); thus, sur-
106 face hydrology schemes that do not account for changing glacial water storage over time
107 risk under- or over-estimating the true water availability (van de Wal & Wild, 2001).

108 There have been substantial recent efforts to quantify 21st-century changes in glacial
109 water runoff at global (Bliss et al., 2014; Huss & Hock, 2018; Marzeion et al., 2018) and
110 regional scales (Juen et al., 2007; Immerzeel et al., 2012; Schaepli et al., 2019). To un-
111 derstand how these changes translate to changing basin-scale water availability for hu-
112 man and ecosystem services, however, requires the added context of regional hydrocli-
113 mate variability and change (Kaser et al., 2010). Here, we quantify the glacial effect on

114 future hydroclimate change, as indicated by SPEI, for all 56 large-scale glaciated drainage
 115 basins (hereinafter “basins”) worldwide.

116 2 Methods

117 We calculate SPEI following the methods of Cook et al. (2014, and see Supplemen-
 118 tary Information). The index is a simple climatic water balance, with water accumula-
 119 tion through precipitation and loss through potential evapotranspiration (PET), normal-
 120 ized such that its mean over a historical reference period is 0 and its standard deviation
 121 is 1. $\text{SPEI} < 0$ corresponds to drier conditions and $\text{SPEI} > 0$ to wetter conditions. Our
 122 approach isolates the glacial effect on SPEI using hydroclimate output of eight GCMs
 123 combined with offline simulated glacial runoff (Huss & Hock, 2018) forced by boundary
 124 conditions from the same GCMs. Although SPEI can be computed at multiple timescales,
 125 we focus here on the timescale of hydrological drought as it most relevant to water avail-
 126 ability for human and ecosystem services.

127 We leverage existing glacier runoff estimates generated by Huss and Hock (2018)
 128 for all large-scale ($> 5000 \text{ km}^2$) drainage basins in which present glacier ice coverage
 129 is at least 30 km^2 total and at least 0.01% of basin area. There are 56 such basins out-
 130 side of Greenland and Antarctica. They comprise 16 basins in Asia, 11 in Europe (in-
 131 cluding Iceland), 16 in North America, 12 in South America, and 1 in New Zealand. Maps
 132 of basin location and projected change in glacier runoff appear in Huss and Hock (2018).

133 We identify eight GCMs that (i) provide the variables necessary to calculate SPEI
 134 and (ii) have a corresponding glacier-runoff projection from Huss and Hock (2018). For
 135 each GCM, we select the same representative concentration pathway (RCP) 4.5 and 8.5
 136 simulations (Taylor et al., 2011) that were used to force projections in Huss and Hock
 137 (2018). From those GCM simulations, we extract atmospheric surface temperature, sur-
 138 face pressure, total precipitation, surface specific humidity, and surface net radiation for
 139 each of the 56 basins we study. Specifically, we identify all latitude-longitude grid points
 140 from the native GCM grid that fall within the boundary of the basin as defined by the
 141 Global Runoff Data Centre (2007), extract the required variables at each point, and then
 142 take the mean across grid points to produce a single timeseries for each variable in each
 143 basin. Because some GCM grids have low spatial resolution, there are GCMs and basins
 144 where no data is available (15% of the total). Nevertheless, at least one GCM for each
 145 basin has data.

146 To test the role of glacial runoff in water availability as indicated by SPEI, we cal-
 147 culate two versions of the index. The first, SPEI_N , is calculated in the standard way as
 148 described in Vicente-Serrano et al. (2009) and detailed in Supplementary Text S1, with
 149 no accounting for glacier change. For the second, SPEI_W , we account for glacier change
 150 by modifying the moisture source term in the calculation. We replace the total precip-
 151 itation input p with

$$\tilde{p} = \frac{A - A_g}{A} p + \frac{A_g}{A} r, \quad (1)$$

152 where \tilde{p} is the modified moisture source term, p is the initial moisture source term with
 153 no glacial component, A_g is the glaciated area of the basin, A is the total basin area, and
 154 r is the glacial runoff for that basin from Huss and Hock (2018) forced with each GCM
 155 (see Supplementary Text S2). All terms apart from the moisture source terms (p, \tilde{p}) are
 156 consistent between SPEI_N and SPEI_W . Our modified SPEI calculation assumes that both
 157 precipitation and glacial runoff are distributed evenly across the drainage basin, which
 158 is a considerable simplification that we address further below.

159 The focus of our analysis is hydrological drought in glaciated basins. As such, we
 160 compute SPEI at the 15-month timescale on which it has been shown to capture hydro-
 161 logical drought in semi-arid, snowmelt-dependent mountain basins (e.g. McEvoy et al.,
 162 2012). At this timescale, SPEI should capture variability in streamflow, and specifically

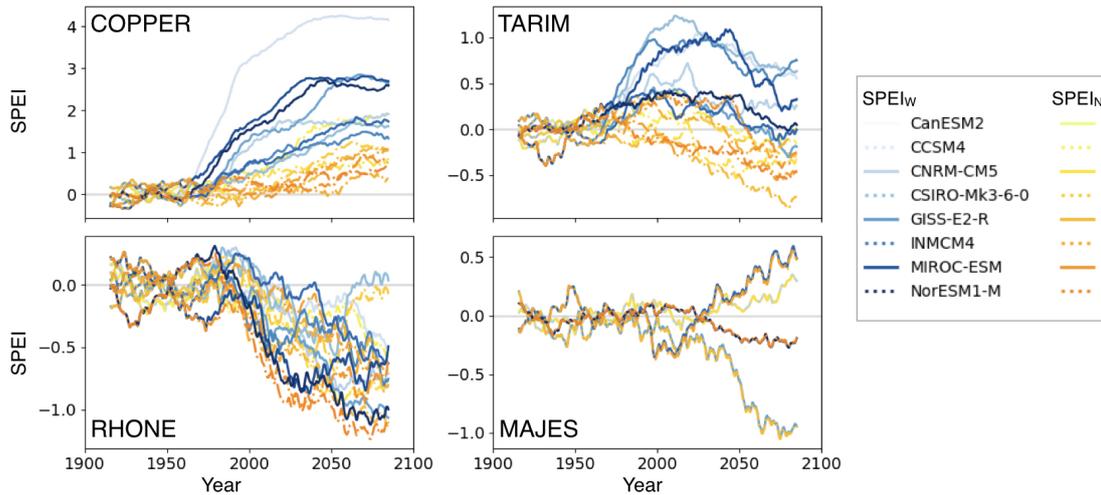


Figure 1. 30-year running mean time series of SPEI computed with each GCM with glacial runoff (blue shades) and without (orange shades) for the RCP 4.5 scenario in four example basins (name in corner of each figure panel).

163 inflow to reservoirs, lakes, wetlands, and potentially groundwater (Vicente-Serrano et al.,
 164 2009); reductions of these inflows are called hydrological drought. Results for timescales
 165 between 3 and 27 months are available in our public repository for the reader interested
 166 in other types of drought or timescales of hydroclimate variability. Nevertheless, we cau-
 167 tion that these other SPEI timescales may not reflect relevant hydroclimate processes
 168 in the basins we study.

169 For each GCM and basin, we compute and compare the 30-year running mean and
 170 variance of the $SPEI_N$ and $SPEI_W$ time series. We also take the difference of SPEI with
 171 and without glacial runoff ($SPEI_W - SPEI_N$) and compute running means of this dif-
 172 ference for each basin. Finally, we compare GCM-by-GCM changes in SPEI mean and
 173 variance at the end of the 21st century (2070-2100) for RCP 4.5 and 8.5. We present re-
 174 sults below for four geographically distributed basins with differing magnitudes of the
 175 glacial effect on SPEI: the Copper (North America), Tarim (Asia), Rhone (Europe), and
 176 Majes (South America). Results for all 56 basins appear in Supplementary Figures S2-
 177 S3 and our online repository. Results that are applicable to all GCMs, as well as inter-
 178 GCM uncertainties, are also described in the Results section and summarized in Figure
 179 4.

180 3 Results

181 3.1 Glaciers reduce drought through the 21st century

182 Almost universally, the effect of accounting for glacial runoff is an increase in mean
 183 SPEI. More specifically, there is unanimous GCM agreement that glacial runoff increases
 184 mean SPEI (i.e. makes conditions wetter in the mean) in the late 21st century for 35 of
 185 the 56 basins tested. This is true for basins that are projected to dry throughout the cen-
 186 tury as well as those that are expected to become wetter. However, there is consider-
 187 able variation in the temporal trends of the glacial effect on mean SPEI both across basins
 188 and between GCMs in a single basin.

189 Figure 1 shows the 30-year running-mean SPEI for four representative basins. The
 190 basins shown are geographically distributed, span the range of basin area glacial cover

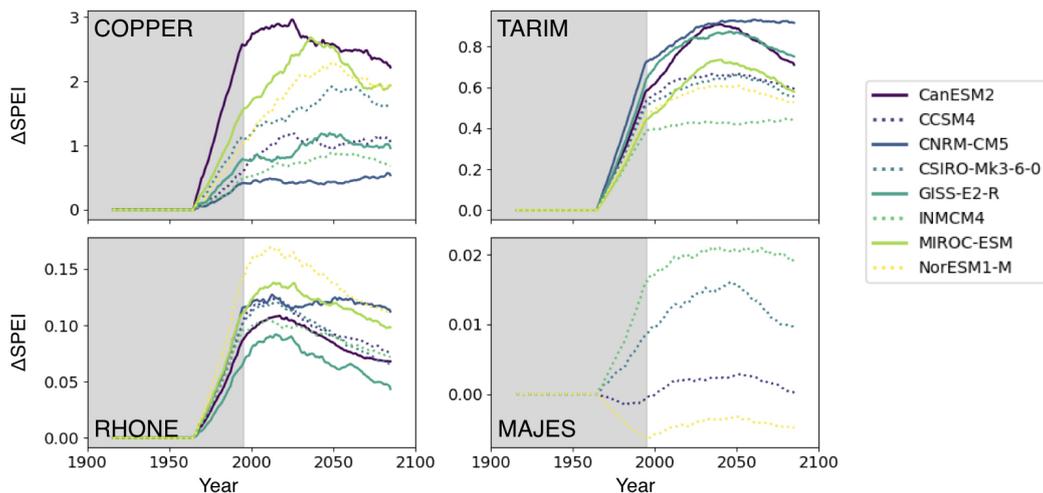


Figure 2. The effect on mean SPEI of including glacial runoff in four example basins, under emissions scenario RCP 4.5. Curves shown are a 30-year running mean of the difference $\text{SPEI}_W - \text{SPEI}_N$, where “W” and “N” denote “with glacial runoff” and “no accounting for glaciers”, respectively. A different vertical scale has been applied to each plot to aid readability. Grey shading indicates the period when 30-year running means include years for which the glacier model has not yet been switched on.

(A_g/A in Equation 1 above), and have projected future SPEI with both drying and wetting trends; results for all basins appear in the Supplementary Material. In the Copper River basin of Alaska, all eight GCMs project an increase in SPEI throughout the 21st century, with even more pronounced increases when glacial runoff is taken into account. In the Rhone basin of central Europe, most GCMs project decreasing SPEI throughout the century to be slightly mitigated by glacial runoff. The four GCMs available for the Majes basin of Peru (see Section 2) disagree about the temporal trend in SPEI, but none are much changed by the inclusion of glacial runoff. Most interesting is the Tarim basin of central Asia. When glacial runoff is not considered, all eight GCMs project SPEI to decrease throughout the 21st century, becoming negative on average after 2050. However, with glacial runoff included, GCMs show an initial increase in SPEI that remains positive (though decreasing) through the end of the century. This suggests that in the Tarim basin glacial runoff changes the projected future hydroclimate from one with less water availability for human and ecosystem services to one with greater water availability in the 21st relative to the 20th century.

Isolating the glacial effect ($\Delta \text{SPEI} = \text{SPEI}_W - \text{SPEI}_N$) in each basin further highlights the tendency for glacial runoff to increase mean SPEI, regardless of whether SPEI is projected to increase or decrease in the future (Figures 2 and S2). In the Copper basin, which is the most heavily glaciated of any we study ($A_g/A = 0.2001$) the glacial effect exceeds 1 SPEI unit and remains high throughout the 21st century. This means that the Copper basin is 1 standard deviation wetter on average with glacial runoff included, with the standard deviation being relative to interannual (15 month) variability over the late 20th century—in short, glacial runoff has a very large impact on average conditions in the Copper Basin. The glacial effect is also high, on the order of 1 SPEI unit, in the Tarim basin, even though the Tarim is an order of magnitude less glaciated ($A_g/A = 0.0234$) than the Copper. In the Rhone basin ($A_g/A = 0.0093$) there is a moderate glacial effect that declines throughout the century, and in the Majes basin ($A_g/A = 0.0031$) the glacial effect on SPEI is negligible. Figure S2 shows time series glacial effect for all basins

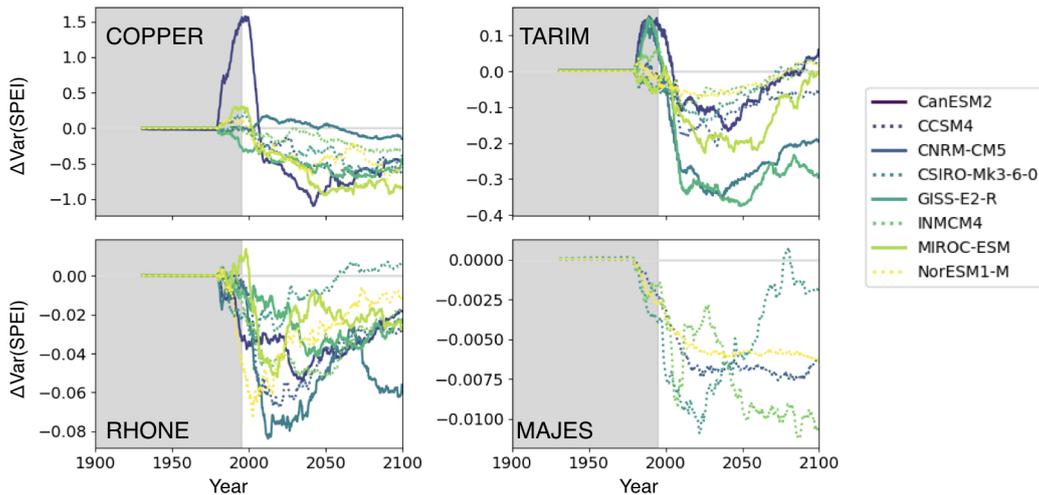


Figure 3. The effect on SPEI variance of including glacial runoff in four example basins, under emissions scenario RCP 4.5. Curves shown are the difference of running 30-year variances, $\text{Var}(\text{SPEI}_W) - \text{Var}(\text{SPEI}_N)$, where “W” and “N” denote “with glacial runoff” and “no accounting for glaciers”, respectively. A different vertical scale has been applied to each plot to aid readability. Grey shading indicates the period when 30-year running statistics include years for which the glacier model has not yet been switched on.

219 analysed, and we report end-of-century multi-GCM ensemble glacial effect for all basins
 220 in Figure 4.

221 3.2 Glacial effect on SPEI variance is heterogeneous between basins

222 Figure 3 shows the effect on SPEI variance of including glacial runoff. In the Ma-
 223 jes basin, the glacial effect on variance is just as negligible as the effect on mean SPEI.
 224 In the remaining three example basins, and in most other basins analysed (Supplemen-
 225 tary Figure S3), the glacial effect is an initial increase in variance after the addition of
 226 glacial runoff to SPEI. This effect is more likely to be numerical than physical in nature,
 227 as it appears when 30-year running windows still include years with no glacier model in-
 228 put (shaded grey on Figure 3 and S3). After the initial increase, including glacial runoff
 229 decreases SPEI variance in the Copper, Rhone, and Tarim basins, in each case with a
 230 temporal trajectory that mirrors the increase in mean SPEI shown in Figure 2. In the
 231 Tarim and Rhone basins, where the glacial effect on mean SPEI begins to taper before
 232 the end of the century, some GCMs show a second increase in SPEI variance.

233 Figure 4 confirms that accounting for glacial runoff decreases SPEI variance through
 234 the end of the 21st century in most basins. Under the more moderate RCP 4.5 climate
 235 scenario, there is only one basin for which all GCMs agree on the glacial effect being an
 236 increase in variance (positive y-axis values in Figure 4a; Figure S3). There are more pro-
 237 jections of increased variance due to glacial runoff under the high-end RCP 8.5 climate
 238 scenario. The glacial effect on SPEI under RCP 8.5 also shows more heterogeneity among
 239 basins (wider dispersal of markers on Figure 4b) and among GCM projections (longer
 240 whiskers and wider interquartile range in Figure 4b). Nevertheless, on average, glacial
 241 runoff continues to provide a moderating influence through the end of the 21st century
 242 on both mean SPEI and the year-to-year SPEI variability that is typically associated with
 243 on-the-ground impacts.

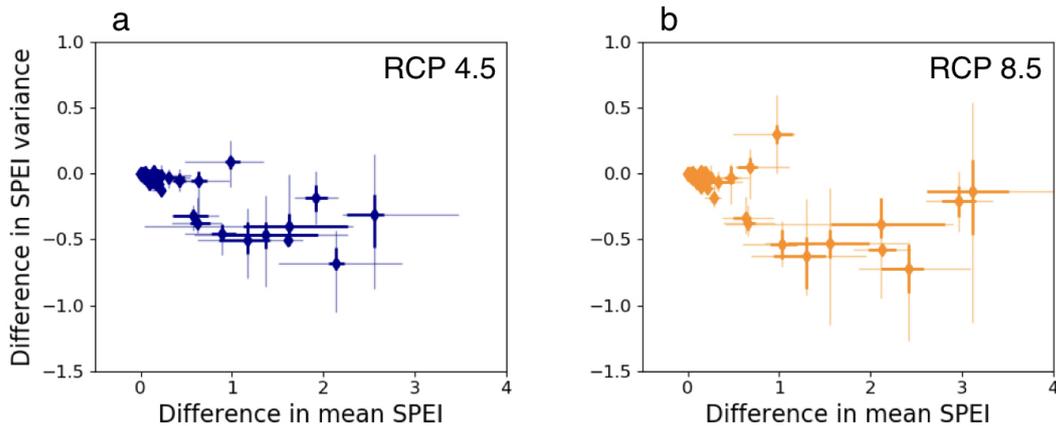


Figure 4. Difference due to explicit accounting of glacial runoff in SPEI 30-year mean and variance at end of 21st century (2070-2100), for climate scenarios RCP 4.5 (panel a) and RCP 8.5 (panel b). A diamond marker for each of the 56 basins analysed shows the difference in SPEI 30-year ensemble mean (x-axis) and variance (y-axis) for each basin. Whiskers show the range of single-GCM results for each basin, with interquartile range shaded.

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4 Discussion

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Huss and Hock (2018) found that the response of glacial runoff to 20th-21st century climate change took the shape of a bell curve, with maximum basin-level runoff (“peak water”) occurring in some year after the onset of glacial retreat. Our analysis of $SPEI_N$ and $SPEI_W$ shows that in most basins, the effect of including glacial runoff is an increase in mean SPEI that diminishes later in the 21st century (Figure 2 and S2). This pattern is consistent with the “peak water” framing. We note, however, that the time evolution of the glacial effect on SPEI is not consistent across GCMs, with some GCMs showing a pronounced “peak” shape and others showing a “plateau” or a more steady slope (Figure 2 and S2). This inter-GCM spread is particularly evident in the Copper basin, where CanESM2 produces a large, sharp peak in glacial effect early in the century while MIROC-ESM produces a slower, nearly monotonic increase in the glacial effect on mean SPEI. Further, for several basins including the Copper and Tarim, even the end-of-century decline in glacial runoff does not return mean SPEI to values without glacial runoff. That is, the relevance of glaciers for future drought projections is not limited to this century.

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Theoretical understanding suggests that interannual variance in water availability should be lower when basins have substantial glacial runoff, a sort of glacial drought buffering (Fountain & Tangborn, 1985; Fleming & Clarke, 2005). While accounting for glacial runoff initially can increase SPEI variance (Figure 3 and S3), which is superficially inconsistent with the theoretical prediction, we find that the increase is a numerical artifact. In running windows that include some years before 1980 (when the glacier model is switched on) and some after, the sudden increase in mean SPEI with the introduction of glacial runoff manifests as an increase in variance. In subsequent years we find a reduction, on average, of SPEI variance due to glacial runoff (negative y-axis values in Figure 3, S3, and 4), which is consistent with the theoretical prediction.

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The glacial effect on variance weakens as glacial runoff decreases through the 21st century (smaller absolute values in Figure 3), supporting the prediction that glacial drought buffering will decline with 21st century climate change (Biemans et al., 2019). However, in most basins and for most GCMs, glacial runoff remains effective in reducing interannual SPEI variability at the end of the century under both RCP 4.5 and 8.5 (Figure 4).

274 In the context of current glacier-modelling efforts that show glacial runoff decreasing with
275 continued climate change (Juen et al., 2007; Immerzeel et al., 2010; Marzeion et al., 2018;
276 Huss & Hock, 2018), it has not previously been apparent that glaciers will continue to
277 buffer droughts through the end of the 21st century. Our SPEI analysis adds the basin-
278 level hydroclimate context necessary to interpret glacial drought buffering in a changed
279 climate. Under RCP 8.5, as compared to RCP 4.5, there are more GCMs and basins in
280 which there is a weak end-of-century glacial effect on SPEI variance (negligible or even
281 positive y-axis values in Figure 4b). We interpret that the greater warming under RCP
282 8.5 reduces seasonally-available meltwater (or “buffering capacity”) due to the declin-
283 ing precipitation storage capacity of shrinking glaciers, such that the basin transitions
284 to a precipitation-dependent regime. In short, the decline in buffering capacity happens
285 faster with greater climate warming.

286 We assess that there are two categories of basins in which glacial effects are large
287 and long-lived. The first category consists of heavily glaciated basins such as the Cop-
288 per, where there is a large quantity of water stored as glacial ice. The second category
289 consists of arid basins such as the Tarim, in which glacier runoff is a substantial water
290 source. Basins in this category may not be heavily glaciated—the Tarim basin is only
291 2% glaciated by area—but other sources are sufficiently small that even limited glacial
292 runoff has a pronounced effect on SPEI within the basin. Previous authors have also com-
293 mented on the importance of glacial runoff in arid basins (Pritchard, 2019) and dry sea-
294 sons (Soruco et al., 2015; Frans et al., 2016; Biemans et al., 2019).

295 The magnitude and temporal trajectory of the glacial effect varies not only by basin
296 but also by GCM, as the examples in Figures 1 - 3 and S2-S3 illustrate. Of particular
297 interest is that there is no consistent ordering to the GCM estimates of the glacial ef-
298 fect. That is, no one GCM of the eight we test is consistently wetter or drier, or more
299 or less variable, when accounting for glacial runoff. Figures 2 and S2 also show that the
300 glacial effect on SPEI peaks in different years for different GCMs. This inter-GCM het-
301 erogeneity reflects the complexity of basin-scale hydroclimate: The different treatments
302 of the physical processes relevant to hydroclimate have implications for the glacial ef-
303 fect on SPEI despite each GCM driving the same glacier model of Huss and Hock (2018).
304 For example, CanESM is the only GCM to use the Canadian Land Surface Scheme (“CLASS”,
305 Verseghy, 2000) and in the Copper basin CanESM has a glacial effect much stronger than
306 any other model (Figure 2). Yet the same figure shows that glacial effects computed with
307 CCSM and NorESM, both of which account for (static) glacier ice cover in the same Com-
308 munity Land Model (Lawrence et al., 2018), but which utilize different atmospheric mod-
309 els, peak in different years and with different magnitudes. We deduce that there are pro-
310 cesses within both land surface schemes and atmospheric model components of GCMs
311 that must be addressed to account for dynamic glacier changes.

312 Two assumptions are inherent in our approach: first, that 15-month SPEI is an ap-
313 propriate metric of variability in water supply for human and ecosystem services, and
314 second, that glacial runoff and precipitation can be treated as evenly spatially distributed
315 over the basin area for this purpose. The first assumption is justified by previous work
316 on multi-scalar drought indices (Szalai et al., 2000; Vicente-Serrano & López-Moreno,
317 2005; Vicente-Serrano et al., 2009). In particular, the 15-month integration time scale
318 we choose relates to variability in surface/ground water flows (see Methods and Supple-
319 mentary Text S1.1) and has been shown to capture hydrological drought in semi-arid moun-
320 tain basins (McEvoy et al., 2012). Our choice of temporal scale is also consistent with
321 our second (spatial) assumption. Over time, heterogeneously-distributed glacial runoff
322 and precipitation reaches humans and ecosystems—and becomes more evenly distributed
323 over a basin—in several ways. For example, runoff localized in a stream could be diverted
324 by irrigation infrastructure (Sorg et al., 2012), dammed for hydropower (Schaeffli et al.,
325 2019), or collected in a downstream reservoir serving a major city (e.g. La Paz, Bolivia;
326 Soruco et al., 2015). Runoff could also recharge high-altitude wetlands (paramos) and

327 groundwater aquifers (Liljedahl et al., 2017; Chidichimo et al., 2018; Somers et al., 2019).
328 Finally, runoff that remains as standing water on the surface, whether proglacial lakes
329 or irrigation ponds, provides a ready source of moisture to the atmosphere, which can
330 locally enhance precipitation and thereby spread water supply across the basin (de Kok
331 et al., 2018). Directly modelling and accounting for these within-basin effects is beyond
332 the scope of the present work, as well as current GCMs and glacier models. These con-
333 siderations are part of the reason that hydrological drought is regularly quantified on the
334 basin scale (e.g. Zhang et al., 2016; Leblanc et al., 2009, for the Yangtze and Murray-
335 Darling basins, respectively) and SPEI is regularly computed at 100 km or lower spa-
336 tial resolution (Cook et al., 2014). We assess that both assumptions inherent to our ap-
337 proach are justified in our interpretation of 15-month SPEI as an indicator of average
338 water availability for human and ecosystem services in a basin.

339 We do not address uncertainty arising from the accounting of non-glacial processes
340 within SPEI. The metric lacks explicit accounting for some vegetation processes that could
341 change the coupling of the land surface to the atmosphere under future climate change
342 (Mankin et al., 2017, 2019; Lehner et al., 2019). It is unclear what role these vegetation
343 processes play in the hydroclimate of the glaciated basins we analyse, particularly as re-
344 lates to hydrological drought, and our results should be interpreted in the context of this
345 uncertainty.

346 The simple offline computation we present here helps account for the first-order glacio-
347 logical effect on future basin-scale water availability for human and ecosystem services.
348 However, offline computations are unable to capture atmospheric feedbacks of changing
349 mountain glacier extent. For example, ice and snow-covered surfaces reflect more inci-
350 dent radiation to the atmosphere than bare rock or soil surfaces do. Water vapor sub-
351 limated from glacier ice or evaporated from supraglacial meltwater pools is a ready source
352 of moisture to the local atmosphere. Finally, glacier surfaces are favorable for creation
353 of strong downslope (katabatic) winds, which can be the dominant feature in local-scale
354 atmospheric circulation (e.g. Obleitner, 1994; van den Broeke, 1997; Aizen et al., 2002).
355 To the extent that any of these local processes are parameterized in current GCMs, their
356 projection into the future will suffer from the inaccurate assumption that glacier ice cover
357 is permanent. The effects of these feedbacks will only be resolved with eventual addi-
358 tion of fully coupled mountain glacier schemes in GCMs.

359 Here, we have focused on global intercomparison of basin-scale water availability
360 for human and ecosystem services. However, local-level water resource studies may ben-
361 efit from more granular information (Milly et al., 2008; Head et al., 2011; Frans et al.,
362 2016). Our method can be adapted for use with regional climate models (e.g. Noël et
363 al., 2015; Skamarock et al., 2019), with models simulating individual glacier evolution
364 (e.g. Gagliardini et al., 2013; Maussion et al., 2019; Rounce et al., 2020), and in prob-
365 abilistic ensemble simulations.

366 5 Conclusions

367 Basin-scale hydroclimate as observed and experienced in the present is affected by
368 numerous regionally-variable factors, including the supply of water from glaciers. GCMs
369 in use to study past and future hydroclimate are ill-equipped to capture decade-to-century
370 scale variation in glacial runoff. Although fully dynamic representations of glacier ice within
371 GCMs will be necessary to produce a physically consistent projection of hydroclimate
372 change in glaciated basins, we have presented a simple method to leverage recent glacier
373 model developments (Huss & Hock, 2018) and account for changing glacial runoff in 21st-
374 century projections of hydrological drought. Our analysis shows that applying glacier
375 model output to account for glacial runoff in the SPEI tends to increase mean SPEI and
376 reduce interannual variability in SPEI, even in basins with $< 2\%$ glaciation by area. As
377 glaciers continue to retreat late in the century, their “drought buffering” effect on SPEI

378 diminishes but does not vanish. Nevertheless, the glacial effect on SPEI shows strong
 379 variation across basins and across GCMs, suggesting considerable structural uncertainty.
 380 More fundamental work on the modelling of hydroclimate is thus clearly needed. Of great-
 381 est relevance to hydroclimate in glaciated basins will be the inclusion of online glacier
 382 models, increasing model resolution and associated improvements in the representation
 383 of hydroclimate-topography interactions, and improved simulation of frozen precipita-
 384 tion processes.

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 387 ers are encouraged to reproduce the analysis for any basin of their choice using the code,
 388 data, and Jupyter notebook guide we have made available at [http://github.com/ehultee/](http://github.com/ehultee/glacial-SPEI)
 389 [glacial-SPEI](http://github.com/ehultee/glacial-SPEI). This manuscript is SOEST publication number [XXXXX - number will
 390 be provided if accepted and must be added to final version].

391 References

- 392 Aizen, V. B., Aizen, E. M., & Nikitin, S. A. (2002). Glacier regime on the northern
 393 slope of the Himalaya (Xixibangma glaciers). *Quaternary International*, *97-98*,
 394 27–39. doi: 10.1016/S1040-6182(02)00049-6
- 395 Ault, T. R. (2020). On the essentials of drought in a changing climate. *Science*,
 396 *368*(6488), 256–260. doi: 10.1126/science.aaz5492
- 397 Barnett, T. P., Adam, J. C., & Lettenmaier, D. P. (2005). Potential impacts of
 398 a warming climate on water availability in snow-dominated regions. *Nature*,
 399 *438*(7066), 303–309. doi: 10.1038/nature04141
- 400 Biemans, H., Siderius, C., Lutz, A. F., Nepal, S., Ahmad, B., Hassan, T., ... Im-
 401 merzeel, W. W. (2019). Importance of snow and glacier meltwater for agricul-
 402 ture on the Indo-Gangetic Plain. *Nature Sustainability*, *2*(7), 594–601. doi:
 403 10.1038/s41893-019-0305-3
- 404 Bliss, A., Hock, R., & Radić, V. (2014). Global response of glacier runoff to twenty-
 405 first century climate change. *Journal of Geophysical Research: Earth Surface*,
 406 *119*(4), 717–730. doi: 10.1002/2013JF002931
- 407 Chidichimo, F., Mendoza, B. T., De Biase, M., Catelan, P., Straface, S., & Di Gre-
 408 gorio, S. (2018). Hydrogeological modeling of the groundwater recharge feeding
 409 the Chambo aquifer, Ecuador. *AIP Conference Proceedings*, *2022*(1), 020003.
 410 doi: 10.1063/1.5060683
- 411 Cook, B. I., Mankin, J. S., Marvel, K., Williams, A. P., Smerdon, J. E., & An-
 412 chukaitis, K. J. (2020, 2020/05/08). Twenty-first century drought projections
 413 in the cmip6 forcing scenarios. *Earth's Future*, *n/a*(n/a), e2019EF001461.
 414 Retrieved from <https://doi.org/10.1029/2019EF001461> doi: 10.1029/
 415 2019EF001461
- 416 Cook, B. I., Smerdon, J. E., Seager, R., & Coats, S. (2014). Global warming and
 417 21st century drying. *Climate Dynamics*, *43*(9-10), 2607–2627. doi: 10.1007/
 418 s00382-014-2075-y
- 419 Decharme, B., Delire, C., Minvielle, M., Colin, J., Vergnes, J.-P., Alias, A., ...
 420 Voldoire, A. (2019). Recent changes in the ISBA-CTRIP land surface system
 421 for use in the CNRM-CM6 climate model and in global off-line hydrological
 422 applications. *Journal of Advances in Modeling Earth Systems*, *11*(5), 1207–
 423 1252. doi: 10.1029/2018MS001545
- 424 de Kok, R. J., Tuinenburg, O. A., Bonekamp, P. N. J., & Immerzeel, W. W. (2018,
 425 2019/12/03). Irrigation as a potential driver for anomalous glacier behavior in
 426 High Mountain Asia. *Geophysical Research Letters*, *45*(4), 2047–2054. doi: 10
 427 .1002/2017GL076158
- 428 Flato, G., Marotzke, J., Abiodun, B., Braconnot, P., Chou, S., Collins, W., ...

- 429 Rummukainen, M. (2013). Evaluation of climate models. In T. Stocker et
 430 al. (Eds.), *Climate change 2013: The physical science basis. Contribution of*
 431 *Working Group I to the Fifth Assessment Report of the Intergovernmental*
 432 *Panel on Climate Change*. Cambridge, United Kingdom and New York, NY,
 433 USA: Cambridge University Press.
- 434 Fleming, S. W., & Clarke, G. K. (2005). Attenuation of high-frequency interannual
 435 streamflow variability by watershed glacial cover. *Journal of Hydraulic Engi-*
 436 *neering*, *131*(7), 615–618. doi: 10.1061/(ASCE)0733-9429(2005)131:7(615)
- 437 Fountain, A. G., & Tangborn, W. V. (1985). The effect of glaciers on stream-
 438 flow variations. *Water Resources Research*, *21*(4), 579–586. doi: 10.1029/
 439 WR021i004p00579
- 440 Frans, C., Istanbuluoglu, E., Lettenmaier, D. P., Clarke, G., Bohn, T. J., & Stum-
 441 baugh, M. (2016). Implications of decadal to century scale glacio-hydrological
 442 change for water resources of the Hood River basin, OR, USA. *Hydrological*
 443 *Processes*, *30*(23), 4314–4329. doi: 10.1002/hyp.10872
- 444 Gagliardini, O., Zwinger, T., Gillet-Chaulet, F., Durand, G., Favier, L., Fleurian,
 445 B. d., ... others (2013). Capabilities and performance of Elmer/Ice, a new-
 446 generation ice sheet model. *Geoscientific Model Development*, *6*(4), 1299–1318.
 447 doi: 10.5194/gmdd-6-1689-2013
- 448 Global Runoff Data Centre. (2007). *Major river basins of the world*.
 449 <http://grdc.bafg.de>. 56068 Koblenz, Germany.
- 450 Head, L., Atchison, J., Gates, A., & Muir, P. (2011). A fine-grained study of the
 451 experience of drought, risk and climate change among Australian wheat farm-
 452 ing households. *Annals of the Association of American Geographers*, *101*(5),
 453 1089–1108. doi: 10.1080/00045608.2011.579533
- 454 Huss, M., & Hock, R. (2018). Global-scale hydrological response to future glacier
 455 mass loss. *Nature Climate Change*, *8*(2), 135–140. doi: 10.1038/s41558-017-
 456 -0049-x
- 457 Immerzeel, W. W., van Beek, L. P. H., & Bierkens, M. F. P. (2010). Climate change
 458 will affect the Asian water towers. *Science*, *328*(5984), 1382. doi: 10.1126/
 459 science.1183188
- 460 Immerzeel, W. W., van Beek, L. P. H., Konz, M., Shrestha, A. B., & Bierkens,
 461 M. F. P. (2012). Hydrological response to climate change in a glacier-
 462 ized catchment in the Himalayas. *Climatic Change*, *110*(3), 721–736. doi:
 463 10.1007/s10584-011-0143-4
- 464 Jiang, P., Liu, H., Wu, X., & Wang, H. (2017). Tree-ring-based spei reconstruction
 465 in central tianshan mountains of china since a.d. 1820 and links to westerly
 466 circulation. *International Journal of Climatology*, *37*(6), 2863–2872. doi:
 467 10.1002/joc.4884
- 468 Juen, I., Kaser, G., & Georges, C. (2007). Modelling observed and future
 469 runoff from a glacierized tropical catchment (Cordillera Blanca, Perú).
 470 *Global and Planetary Change*, *59*(1), 37–48. doi: [https://doi.org/10.1016/
 471 j.gloplacha.2006.11.038](https://doi.org/10.1016/j.gloplacha.2006.11.038)
- 472 Kaser, G., Großhauser, M., & Marzeion, B. (2010). Contribution potential of glaciers
 473 to water availability in different climate regimes. *Proceedings of the National*
 474 *Academy of Sciences*, *107*(47), 20223–20227. doi: 10.1073/pnas.1008162107
- 475 Kingston, D. G., Stagge, J. H., Tallaksen, L. M., & Hannah, D. M. (2014).
 476 European-scale drought: Understanding connections between atmospheric
 477 circulation and meteorological drought indices. *Journal of Climate*, *28*(2),
 478 505–516. doi: 10.1175/JCLI-D-14-00001.1
- 479 Lawrence, D., Fisher, R., Koven, C., Oleson, K., Swenson, S., & Vertenstein, M.
 480 (2018). *Technical description of version 5.0 of the Community Land Model*
 481 *(CLM)* (Tech. Rep.). National Center for Atmospheric Research.
- 482 Leblanc, M. J., Tregoning, P., Ramillien, G., Tweed, S. O., & Fakes, A. (2009).
 483 Basin-scale, integrated observations of the early 21st century multiyear

- drought in southeast australia. *Water resources research*, 45(4).
- 484 Lehner, F., Wood, A. W., Vano, J. A., Lawrence, D. M., Clark, M. P., & Mankin,
485 J. S. (2019). The potential to reduce uncertainty in regional runoff projections
486 from climate models. *Nature Climate Change*, 9(12), 926–933.
- 487 Liljedahl, A. K., Gädeke, A., O’Neel, S., Gatesman, T. A., & Douglas, T. A.
488 (2017). Glacierized headwater streams as aquifer recharge corridors, sub-
489 arctic Alaska. *Geophysical Research Letters*, 44(13), 6876–6885. doi:
490 10.1002/2017GL073834
- 491 Lorenzo-Lacruz, J., Vicente-Serrano, S. M., López-Moreno, J. I., Beguería, S.,
492 García-Ruiz, J. M., & Cuadrat, J. M. (2010). The impact of droughts and
493 water management on various hydrological systems in the headwaters of
494 the tagus river (central spain). *Journal of Hydrology*, 386(1), 13–26. doi:
495 10.1016/j.jhydrol.2010.01.001
- 496 Mankin, J. S., Seager, R., Smerdon, J. E., Cook, B. I., & Williams, A. P. (2019).
497 Mid-latitude freshwater availability reduced by projected vegetation responses
498 to climate change. *Nature Geoscience*, 1–6. doi: 10.1038/s41561-019-0480-x
- 499 Mankin, J. S., Seager, R., Smerdon, J. E., Cook, B. I., Williams, A. P., & Horton,
500 R. M. (2018). Blue water trade-offs with vegetation in a CO₂-enriched climate.
501 *Geophysical Research Letters*, 45(7), 3115–3125. doi: 10.1002/2018GL077051
- 502 Mankin, J. S., Smerdon, J. E., Cook, B. I., Williams, A. P., & Seager, R. (2017).
503 The curious case of projected twenty-first-century drying but greening
504 in the American West. *Journal of Climate*, 30(21), 8689–8710. doi:
505 10.1175/JCLI-D-17-0213.1
- 506 Marzeion, B., Kaser, G., Maussion, F., & Champollion, N. (2018). Limited influ-
507 ence of climate change mitigation on short-term glacier mass loss. *Nature Cli-
508 mate Change*, 8(4), 305–308. doi: 10.1038/s41558-018-0093-1
- 509 Maussion, F., Butenko, A., Champollion, N., Dusch, M., Eis, J., Fourteau, K., ...
510 Marzeion, B. (2019). The Open Global Glacier Model (OGGM) v1.1. *Geosci-
511 entific Model Development*, 12(3), 909–931. doi: 10.5194/gmd-12-909-2019
- 512 McEvoy, D. J., Huntington, J. L., Abatzoglou, J. T., & Edwards, L. M. (2012). An
513 evaluation of multiscalar drought indices in Nevada and Eastern California.
514 *Earth Interactions*, 16(18), 1–18.
- 515 Milly, P. C., Betancourt, J., Falkenmark, M., Hirsch, R. M., Kundzewicz, Z. W.,
516 Lettenmaier, D. P., & Stouffer, R. J. (2008). Stationarity is dead: Whither
517 water management? *Science*, 319(5863), 573. doi: 10.1126/science.1151915
- 518 Milly, P. C., & Dunne, K. A. (2016). Potential evapotranspiration and continental
519 drying. *Nature Climate Change*, 6(10), 946. doi: 10.1038/nclimate3046
- 520 Noël, B., van de Berg, W., van Meijgaard, E., Munneke, P. K., van de Wal, R.,
521 & van den Broeke, M. (2015). Evaluation of the updated regional climate
522 model RACMO2.3: summer snowfall impact on the Greenland Ice Sheet. *The
523 Cryosphere*, 9, 1831–1844. doi: 10.5194/tc-9-1831-2015
- 524 Obleitner, F. (1994). Climatological features of glacier and valley winds at the Hin-
525 tereisferner (Ötztal Alps, Austria). *Theoretical and Applied Climatology*, 49(4),
526 225–239. doi: 10.1007/BF00867462
- 527 Potop, V., Možný, M., & Soukup, J. (2012). Drought evolution at various time
528 scales in the lowland regions and their impact on vegetable crops in the
529 Czech Republic. *Agricultural and Forest Meteorology*, 156, 121–133. doi:
530 10.1016/j.agrformet.2012.01.002
- 531 Pritchard, H. D. (2019). Asia’s shrinking glaciers protect large populations from
532 drought stress. *Nature*, 569(7758), 649–654. doi: 10.1038/s41586-019-1240-1
- 533 Rounce, D. R., Hock, R., & Shean, D. E. (2020). Glacier mass change in
534 High Mountain Asia through 2100 using the open-source Python Glacier
535 Evolution Model (PyGEM). *Frontiers in Earth Science*, 7, 331. doi:
536 10.3389/feart.2019.00331
- 537 Rowan, A. V., Quincey, D. J., Gibson, M. J., Glasser, N. F., Westoby, M. J., Irvine-

- 539 Fynn, T. D. L., ... Hambrey, M. J. (2018). The sustainability of water
 540 resources in High Mountain Asia in the context of recent and future glacier
 541 change. *Geological Society, London, Special Publications*, 462(1), 189. doi:
 542 10.1144/SP462.12
- 543 Schaeffli, B., Manso, P., Fischer, M., Huss, M., & Farinotti, D. (2019). The role of
 544 glacier retreat for Swiss hydropower production. *Renewable Energy*, 132, 615–
 545 627. doi: 10.1016/j.renene.2018.07.104
- 546 Scheff, J., Seager, R., Liu, H., & Coats, S. (2017). Are glacials dry? Consequences
 547 for paleoclimatology and for greenhouse warming. *Journal of Climate*, 30(17),
 548 6593–6609. doi: 10.1175/JCLI-D-16-0854.1
- 549 Skamarock, W. C., Klemp, J. B., Dudhia, J., Gill, D. O., Liu, Z., Berner, J., ...
 550 Huang, X.-Y. (2019). *A description of the Advanced Research WRF version 4*.
 551 NCAR Tech. Note NCAR/TN-556+STR. doi: 10.5065/1dfh-6p97
- 552 Somers, L. D., McKenzie, J. M., Mark, B. G., Lagos, P., Ng, G.-H. C., Wickert,
 553 A. D., ... Silva, Y. (2019). Groundwater buffers decreasing glacier melt in
 554 an Andean watershed—but not forever. *Geophysical Research Letters*, 46(22),
 555 13016–13026. doi: 10.1029/2019GL084730
- 556 Sorg, A., Bolch, T., Stoffel, M., Solomina, O., & Beniston, M. (2012). Climate
 557 change impacts on glaciers and runoff in Tien Shan (Central Asia). *Nature*
 558 *Climate Change*, 2(10), 725–731. doi: 10.1038/nclimate1592
- 559 Soruco, A., Vincent, C., Rabatel, A., Francou, B., Thibert, E., Sicart, J. E., &
 560 Condom, T. (2015). Contribution of glacier runoff to water resources of
 561 La Paz city, Bolivia (16°S). *Annals of Glaciology*, 56(70), 147–154. doi:
 562 10.3189/2015AoG70A001
- 563 Swann, A. L., Hoffman, F. M., Koven, C. D., & Randerson, J. T. (2016). Plant
 564 responses to increasing CO₂ reduce estimates of climate impacts on drought
 565 severity. *Proceedings of the National Academy of Sciences*, 113(36), 10019–
 566 10024. doi: 10.1073/pnas.1604581113
- 567 Szalai, S., Szinell, C., & Zoboki, J. (2000). *Drought monitoring in Hungary* (Vol. 57;
 568 Tech. Rep.). Geneva, Switzerland: World Meteorological Organization.
- 569 Takata, K., Emori, S., & Watanabe, T. (2003). Development of the minimal ad-
 570 vanced treatments of surface interaction and runoff. *Global and Planetary*
 571 *Change*, 38(1), 209–222. doi: 10.1016/S0921-8181(03)00030-4
- 572 Taylor, K. E., Stouffer, R. J., & Meehl, G. A. (2011). An overview of CMIP5 and
 573 the experiment design. *Bulletin of the American Meteorological Society*, 93(4),
 574 485–498. doi: 10.1175/BAMS-D-11-00094.1
- 575 van den Broeke, M. R. (1997). Structure and diurnal variation of the atmospheric
 576 boundary layer over a mid-latitude glacier in summer. *Boundary-Layer Meteoro-*
 577 *logy*, 83(2), 183–205. doi: 10.1023/A:1000268825998
- 578 van de Wal, R. S. W., & Wild, M. (2001). Modelling the response of glaciers to cli-
 579 mate change by applying volume-area scaling in combination with a high reso-
 580 lution GCM. *Climate Dynamics*, 18(3), 359–366. doi: 10.1007/s003820100184
- 581 Versegny, D. L. (2000). The Canadian land surface scheme (CLASS): Its history and
 582 future. *Atmosphere-Ocean*, 38(1), 1–13. doi: 10.1080/07055900.2000.9649637
- 583 Vicente-Serrano, S. M., Beguería, S., & López-Moreno, J. I. (2009). A multi-
 584 scalar drought index sensitive to global warming: The standardized precipi-
 585 tation evapotranspiration index. *Journal of Climate*, 23(7), 1696–1718. doi:
 586 10.1175/2009JCLI2909.1
- 587 Vicente-Serrano, S. M., & López-Moreno, J. I. (2005). Hydrological response to
 588 different time scales of climatological drought: an evaluation of the Standard-
 589 ized Precipitation Index in a mountainous Mediterranean basin. *Hydrology and*
 590 *Earth System Sciences*, 9(5), 523–533. doi: 10.5194/hess-9-523-2005
- 591 World Meteorological Organization, & Global Water Partnership. (2016). *Hand-*
 592 *book of drought indicators and indices* (Tech. Rep.). Geneva, Switzerland: Inte-
 593 grated Drought Management Programme (IDMP).

- 594 Yang, Y., Roderick, M. L., Zhang, S., McVicar, T. R., & Donohue, R. J. (2019).
595 Hydrologic implications of vegetation response to elevated CO₂ in climate pro-
596 jections. *Nature Climate Change*, *9*(1), 44. doi: 10.1038/s41558-018-0361-0
597 Zhang, D., Zhang, Q., Werner, A. D., & Liu, X. (2016). Grace-based hydrological
598 drought evaluation of the yangtze river basin, china. *Journal of Hydrometeorol-*
599 *ogy*, *17*(3), 811–828.