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Characteristics and changes of glacial lakes and outburst floods

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42 Abstract:

43 Global glacier mass loss has accelerated, producing more and larger glacial lakes. Many of these glacial lakes are 44 a source of glacial lake outburst floods (GLOFs), which pose threats to people and infrastructure. In this Review, 45 we synthesize global changes in glacial lakes and GLOFs. More than 110,000 glacial lakes currently exist, 46 covering a total area of ~15,000 km². These lakes are transient features, increasing in area by ~22% dec⁻¹ from 47 1990-2020. GLOFs from these lakes are commonly initiated by dam failure or wave overtopping associated with 48 mass movements, with >ten million people globally exposed to their impacts. Although data limitations are 49 substantial, >3000 GLOFs have been recorded from 850-2022, particularly in Alaska (24%), High Mountain Asia 50 (HMA; 18%) and Iceland (19%). GLOFs from ice-dammed lakes account for 64.8% of the global total, while moraine-dammed and bedrock-dammed GLOFs account for only 12.6% and 1.0%, respectively. GLOFs have 51 52 increased in most glaciated mountain regions of the world. Ongoing deglaciation and lake expansion is 53 expected to increase GLOF frequency further, particularly in HMA where GLOF-related hazards are projected to 54 triple by 2100. However, changes in other regions will likely be lower given topographic constraints on lake 55 evolution. Future research should prioritize acquiring field data on lake and dam properties and producing globally-coordinated multi-temporal lake mapping, and robust and efficient modelling of GLOFs for 56

57 comprehensive hazard assessment and response planning.

58

60 [H1] Introduction

Glaciers have been losing mass since the end of the Little Ice Age¹⁻³, and at high—and accelerating—rates 61 since the 1960s (ref ^{4,5}). Indeed, overall mass loss from glaciers and ice caps (excluding the Greenland and 62 63 Antarctic ice sheets) totalled 267 ± 16 Gt yr⁻¹ from 2000-2019 (ref ⁴), much of which can be attributed to 64 anthropogenic warming ⁶⁻⁸. When the resultant meltwater is naturally dammed (by ice, a moraine or bedrock), 65 glacial lakes can form on (supraglacial), within (englacial), under (subglacial), at the edge of (ice-marginal), or beyond the front of (proglacial) glaciers. There are an estimated 14,394 (>0.05 km²) of these lakes globally⁹, the 66 67 majority of which are in Greenland, the southern Andes, Antarctica and the Subantarctic, Alaska, Canada and 68 High Mountain Asia (HMA) (Fig. 1a). The number and size of glacial lakes is generally increasing, especially for proglacial lakes, which is due to them being closely connected to contemporary glacier retreat and meltwater 69 production at local^{10,11}, regional¹²⁻¹⁵ and global⁹ scales. However, there is considerable regional variability^{9,16-19}, 70 71 including notable expansion in Alaska, Greenland periphery, Patagonia, and HMA. Nevertheless, the overall growth pattern is expected to continue²⁰⁻²⁴, in line with a projected 26-41% decrease in glacial mass by 2100 72 73 under 1.5-4°C temperature increases²⁵. 74 The stability and longevity of glacial lakes are highly variable. Glacial lakes can drain suddenly and very

quickly (hours to days), releasing a glacial lake outburst flood (GLOF). More than 3,000 GLOFs have been reported worldwide from 850-2022 (**Fig. 1b**)²⁶, each with characteristic rapid rise to peak discharge and often very large flood volumes. For example, the 1996 volcanic eruption beneath the Vatnajökull ice cap, Iceland, produced an outburst flood with an estimated peak discharge ~55,000 m³ s⁻¹, thereby temporarily becoming the second largest river in the world after the Amazon^{27,28}. Indeed, ice-dammed lakes have produced some of the largest peak discharges recorded in human history²⁹⁻³¹, including peak discharges of >10⁵ m³ s⁻¹ in High Mountain Asia³², and 10⁹ m³ in the Andes and Alaska^{30,33,34}

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Accordingly, GLOFs rank among the most prominent glacier hazards, killing thousands of people over the past century³⁵ and causing extensive damage tens to hundreds of kilometers downstream. For instance, the 1941 GLOF in Huaraz, Peru, destroyed a third of the city and killed about 5,000 people³⁶, and the 2013 GLOF in Kedarnath, India, killed more than 6,000 people³⁷. Given that millions of people are potentially at risk from GLOFs worldwide³⁸, especially in a warming, understanding the location, timing of formation, evolution and physical characteristics of glacial lakes is critical to mitigating the downstream impacts to communities and infrastructure.

In this Review, we synthesize glacial lake and GLOF hazard datasets from most glaciated regions of the
 world to assess their ongoing and projected changes. We begin by documenting the global and regional
 distribution of glacial lakes. We follow by assessing the characteristics and historical trends of GLOFs. We
 subsequently discuss future projections in glacial lakes and the corresponding GLOF hazard and risk, before

94 ending with research priorities. Throughout, focus is on the physical aspects of glacial lakes and GLOFs in a95 warming world.

96

97 [H1] Global and regional changes of lake size and abundance

98 Understanding glacial lakes is the first step in estimating GLOF hazard and risk (Fig. 2). Methods used to
 99 map glacial lakes are now discussed, followed by quantification of their historical changes at global and regional
 100 scales.

101

102 [H2] Mapping glacial lakes

103 A growing archive of satellite products and enhanced computing power³⁹ have improved mapping of 104 glacial lakes (Fig. 2). In most cases, mapping relies on the use of the normalized difference water index 105 (NDWI⁴⁰); a satellite image-derived calculation combining green and near-infrared (NIR) wavelength bands to 106 differentiate water bodies from all other landcover. Automated and semi-automated methods are used for lake 107 mapping from a NDWI classification, although lake outlines have also been delineated manually with enhanced accuracy^{12,41}. Landsat satellite imagery is often used as the basis for glacial lake mapping by NDWI owing to its 108 temporal coverage and a medium-resolution sensor^{9,17,42}. Nevertheless, Landsat imagery has limitations for 109 110 NDWI-based lake mapping, including poor image contrast due to seasonal snow and ice cover on lakes, as well as confusion introduced by mountain shadows and cloud cover⁴³. Cloud-free Synthetic Aperture Radar (SAR) 111 can overcome this limitation, but are of limited length and hence generally only suitable for validation of 112 mapping algorithms or case studies^{44,45}. Cloud computing, artificial intelligence and machine learning are 113 rapidly improving the ability to efficiently manage and automatically analyze remote sensing data^{46,47}. However, 114 interactive visual inspection and manual editing combined with original imagery is still essential to ensure a 115 116 consistent data quality with time.

117

118 In addition to mapping lake outlines, knowledge of glacial lake volume is important for quantifying hazard 119 and for estimating downstream impacts of GLOFs^{48,49} (Fig. 2). Empirical volume-area relationships for glacial 120 lakes have been established in many instances (Supplementary Table 1). Global compilations of lake depths, 121 areas and volumes suggest that lake area and depths are moderately-correlated, and lake area and volumes are 122 well-correlated⁵⁰. These correlations allow for the estimation of lake depths and volumes from area, especially in 123 regions where direct measurements are rare and difficult (**Supplementary Table 1**). Bathymetric measurements 124 of ice-marginal lakes have also been carried out in some locations, including the Southern Alps of New Zealand^{51,52} and on the Tibetan Plateau^{53,54}. 125

126

128 [H2] Global glacial lake characteristics

After mapping the outline of glacial lakes, it is possible to determine their overarching characteristics, including size, area and volume. Various such inventories exist (**Supplementary Table 2**), each compiled from satellite imagery but differing in maximum distance between glaciers and lakes (buffers of 1, 3, 5 or km) and the smallest lake size included (0.0002, 0.005 or 0.05 km²), introducing slight discrepancies at the regional and global scale. Here, several regional inventories^{9,12,18,19} (**Supplementary Table 2**) are merged to produce a global contemporary glacial lake compilation; a size threshold of 0.05 km² is set for all RGI regions⁵⁵ except Svalbard and Jan Mayen, Southern Andes and New Zealand (**Supplementary Table 2**).

This global compilation provides much insight into glacial lake characteristics. 22,133 glacial lakes are revealed in 2015-2019, collectively covering ~14,438 km² (**Supplementary Tables 2**). These totals are more than other reports of 14,394 lakes >0.05 km² situated within 1 km of glacier margins, covering a total area of ~8,950 km² in the time period between 2015 and 2018 (ref ⁹). Regional differences in the number, area, and volume of global glacial lakes are evident (**Fig. 2**). Glacial lakes are predominantly distributed in Greenland and the eastern Canadian Arctic, the southern Andes, Alaska and western Canada, and HMA. Glacial lakes in HMA are widespread, but with a smaller signal size and volume.

143

144 [H2] Glacial lake changes

145 Glacial lakes are naturally transient features. Each tends to follow a common trajectory, as documented in many mountainous regions around the world^{16,56-59}. Specifically, glacial lakes show an extensive and robust expansion 146 147 after 2000. Various processes can lead to such changes in glacial lake evolution, including shifts in inflow or outflow; gradual infilling by sediment particularly in deglaciating environments^{23,60,61}; abrupt infilling following 148 149 mass movements^{62,63}; coalescence of several lakes; detachment of an ice-marginal lake from the parent glacier as it retreats; or partial or complete dam failure resulting in a GLOF²³. Although global statistics are unavailable, 150 151 evidence from the tropical Andes suggests that, on average, only one in ten GLOFs has resulted in complete 152 lake drainage⁶². Indeed, most moraine- and bedrock-dammed glacial lakes persist after a GLOF has occurred⁶². 153 Accordingly, lakes can exist for vastly different timeframes: ice-dammed lakes can form and fail repeatedly as long as the ice dam is thick enough to impound a lake^{33,64}; bedrock-dammed lakes within overdeepenings can 154 persist for tens of thousands of years⁶⁵⁻⁶⁷; moraine-dammed lakes can survive over centennial or millennial 155 timescales⁶⁸ 156

157

The abovementioned inventories provide an opportunity to track these glacial lakes over time (Fig. 3a;
 Supplementary Fig. 1). The number and area of glacial lakes has increased by ~53% and ~51%, respectively,
 between 1990 and 2018 (ref ⁹). This global increase is subject to uncertainties due to missing lakes when

161 compared to regional multi-temporal lake inventories (Supplementary Table 2). Overall, the evolution of

glacial lakes within most regions showed a steady expansion between 1990 and 2020. Some sub-regions of the
Himalaya, Andes, and Alps showed faster trends in lake expansion than the global pattern (Supplementary Fig.
However, there are regional differences within sub-regions, which might be due to different types of glacial
lakes.

166

167 Regional datasets, which undergo extensive quality control during compilation, also indicate a general 168 increase in glacial lake area. Between ~1990 and 2020, glacial lake area increased by an average of ~22% dec⁻¹ 169 (Fig. 3a), higher than 17% dec⁻¹ suggested by the global dataset⁹. Of course, there is much regional and 170 temporal variability embedded. For instance, overarching changes in the Southern Andes and Greenland periphery are smaller than several other locations at <10% dec⁻¹ (**Fig. 3a**) and potentially highlight the 171 importance of short-term temporal variability; lake area temporarily decreased at the edge of the Northern 172 Patagonian Icefield from 1945-1976 (ref ⁶⁹) and in Greenland from 1987 to 1992 and from 2005 to 2010 (ref ¹⁶), 173 perhaps contributing to the smaller, yet still positive, long-term trends^{69,16} observed there. In contrast, overall 174 changes were much larger in Iceland, Scandinavia, and Russian Arctic at >40% dec⁻¹ 175 Local variability is also observed, as evidenced in HMA, particularly the Himalaya which has some of the 176

longest records of glacial lake growth. In the greater Himalaya, glacial lake area increased by $\sim 3.7 \text{ km}^2 \text{ yr}^{-1}$ (0.6% yr⁻¹) from 1990-2020. Yet, changes in the Chinese Himalaya and Nepal Himalaya were $\sim 1.28 \text{ km}^2 \text{ yr}^{-1}$ (0.8% yr⁻¹) between the 1970 and the 2008 (ref ⁷⁰) and 0.6 km² yr⁻¹ (1.1% yr⁻¹) from 1977-2017 (ref ⁷¹), respectively.

180

In addition to such substantial local and regional changes, there is also evidence of changes by glacial lake type. The imbalance between ice-marginal and glacier-detached proglacial lakes has been recorded worldwide (Figs. 3b-e), whereby the former are lakes in direct contact with their parent glaciers and have strong interactions between them. For example, in Southern Pamir, the number of proglacial lakes remained largely constant from 1968 to 1993 (the lower number in 1977 might be related to uncertainties due to poor image quality), increased to a peak of 44 in 2008, and then decreased to 26 by 2015 (ref ⁷²) (Fig. 3b).

In the Andes, the number and area of glacial lakes has progressively increased. From 1948-2017, three to 187 four new lakes formed each year, with an average expansion rate of ~0.1 km² yr^{-1 73}. Of these total lakes, the 188 number of proglacial lakes was stable from 1948-1990 (71 to 74, with some fluctuations in between) and then 189 190 decreased to 35 by 2018 (ref ⁷³). For the Peruvian Andes, an almost constant gain of detached proglacial lake 191 area was observed throughout the study period (Fig. 3c). This phenomenon, together with the increasing 192 average elevation of proglacial lakes, is a strong indication that large lakes dammed by Little Ice Age terminal moraines have lost contact with their parent glaciers, while bedrock-dammed lakes are forming at higher 193 194 elevations⁷³.

195 In the Southern Alps of New Zealand, an almost linear trend in lake area change has also been reported, 196 with an average of ~0.5 km² yr⁻¹ in four time steps from 1990-2020 (ref ⁷⁴). Tasman Glacier, New Zealand's 197 largest glacier, is retreating rapidly, and a proglacial lake formed in 1990 (ref ⁵²). The number of ice-marginal 198 proglacial lakes in New Zealand was greatest in 2011 and thereafter has decreased slightly as lakes coalesced 199 and as some became disconnected from the glaciers⁷⁴ (Fig. 3d).

200

In the European Alps, particularly the Austrian Alps, the number and area of lakes increased from 1850-2015, with the mean change in lake area doubling from ~0.038 km² yr⁻¹ during 1998 to 2006, to ~0.079 km² yr⁻¹ 203 during 2006 to 2015 (ref ⁷⁵). Similar changes have occurred in Switzerland. There, the number of proglacial lakes 204 increased from 21 in 1900 to 47 in 2006, and from 47 in 2006 to 82 in 2016 (ref ⁵⁹) (Fig. 3e). The increase in total 205 lake area in the Swiss Alps has accelerated from ~0.01 km² yr⁻¹ in 1850-1900 up to ~0.15 km² yr⁻¹ in 2006-2016 206 (ref ⁵⁹). However, part of this variability is due to the artificial impoundment of some lakes, mainly for

- 207 hydropower generation purposes.
- 208

209 [H1] Historical glacial lake outburst floods

With the presence of glacial lakes comes the risk of a GLOF. GLOFs arise when the lake dam is breached (by various triggers depending on the dam type) and meltwater is suddenly and rapidly released from the lake, subsequently flowing downstream where it can cause substantial societal and environmental impacts (**Fig. 4**). Together, data from river gauges, satellite images, sediment stratigraphy, and eyewitness and media reports suggest that at least 3,151 GLOFs have occurred globally since 850 (**Fig. 1b**)²⁶, with most recorded in Alaska (24%, *n*=768), HMA (18%, *n*=569) and Iceland (19%, *n*=590).

216

However, understanding of GLOFs is severely limited by inadequate data. Triggers are often unknown or
speculated owing to absent field data, necessitating reliance on climatic or geological-geomorphological
evidence^{35,76-78}. Numerical modelling is similarly challenged by absent knowledge of parameter values such as
lake water temperature or time-varying lake level, limiting insight^{58,79,80}. Moreover, GLOF frequency calculations
suffer from selective reporting and changes in instrumentation and satellite coverage^{33,81,82}. Nevertheless, it is
possible to glean evidence of GLOF characteristics, as now discussed for ice-dammed, moraine-dammed and
bedrock-dammed GLOFs. Resulting hazards and changes are also assessed.

224

225 [H2] Ice-dammed GLOFs

GLOFs from ice-dammed lakes are the most common type. Their activity is largely controlled by the damming glaciers activity and resulting fracture or flexure of the ice dam (**Fig. 4a**). Flotation of the ice dam once a critical lake level is reached also acts as a potential breach mechanism^{33,83,84}. When lake water suddenly drains

through an ice dam, thermal and mechanical erosion (usually progressively enlarging a subglacial tunnel) leads
 to an exponentially-rising discharge^{54,85,86}.

GLOFs from ice-dammed lakes constitute roughly two-thirds (2039 of 3151) of all reported GLOFs 231 232 worldwide^{26,81}. Their frequent occurrence is linked to the fact that they can drain repeatedly as an ice dam will 're-233 heal' temporarily once energetic egress of lake water has subsided. At the regional scale, Alaska is a hotspot of 234 GLOFs from ice-dammed lakes (n=764, 99% within Alaska, 37% of the global total in this category^{19,26,33} (Fig. 1a). 235 Indeed, 750 ice-dammed lakes have formed in Alaska over the 20th century^{87,88}, with some lakes having a volume $>10^9$ m³ when impounded by thick outlet glaciers⁸⁷. Yet, their GLOFs rarely cause damage owing to low exposure 236 237 of assets along river channels. Ice-dammed lakes are also the dominant source of reported GLOFs in Greenland Periphery (n=153; 100% of all GLOFs within Greenland Periphery, 7.5% of global ice-dammed GLOFs)^{89,90}, the 238 Karakoram (n=190; 33.4% within HMA, 9.3% of global)^{29,91}, Scandinavia (n=183; 96.8% within Scandinavia, 9.0% of 239 240 global)⁹², Central Europe (n=258; 58.2% within Central Europe, 12.7% of global), and Iceland (n=237; 40.2% within Iceland, 11.6% of global)⁸⁶ (Fig. 1b). In Central Europe, fatalities and damage from these occasional ice-dam 241 failures were particularly high before the 20th century, possibly related to limited warning and flood control 242 243 measures⁹³. In Scandinavia and particularly in Norway, whilst the percentage of ice-dammed GLOFs was high in the mid-20th century, the total number and size of outbursts is small compared to other regions²⁶ 244

245

246 [H2] Moraine-dammed GLOFs

GLOFs from moraine-dammed lakes are the second-most common type globally after ice-dammed lakes 247 248 (Fig. 1b). In these situations, dam breaching can be caused by seepage of lake water through unconsolidated 249 material, degradation of an ice core, or overtopping due to calving, avalanches or landslides into the lake^{76,83} (Fig. 250 4). Moraine-dammed lakes in the ice-marginal phase of evolution are the most likely to produce GLOFs due to 251 calving processes and proximity to ice avalanche release zones. In contrast, glacial lakes detached from glaciers 252 become disconnected from the most frequent GLOF-triggering processes with increasing distance from glaciers⁵⁶. The almost instantaneous and sometimes complete failure of a moraine dam produces a linearly-rising discharge⁹⁴. 253 Furthermore, complete failure of the (moraine) dam restricts any future ability to impound meltwater^{95,96}. Hence, 254 255 moraine-dammed lakes usually fail only once.

GLOFs from moraine-dammed lakes make up at least ~13% (398 of 3151) of the global total number of recorded GLOFs from 850-2022 (**Fig. 1a**). However, their occurrence is highly regionally-variable. The majority of those reported are found in the low latitude Andes (n=100; 61.3% of GLOFs within the low latitude Andes, 25.1% of global moraine-dammed GLOFs), Central Asia (n=110; 46.2% within Central Asia, 27.6% of global) and the Himalaya (n=71; 77.2% within the Himalaya, 17.8% of global (**Fig. 1b**). Indeed, 52% and 32% of glacial lakes in the central Andes and Himalaya are moraine-dammed, respectively^{17,97}, and many others have associated geomorphological features suggesting possible past dam failures^{62,98,99}. The exact timing of these dam failures has yet to be determined, as the geomorphological evidence is largely limited to that visible in satellite images thatwere first available in the 1960s.

265

266 [H2] Bedrock-dammed and subglacial GLOFs

267 Bedrock dams are usually stable and so these glacial lakes produce fewer GLOFs compared to ice- and 268 moraine-dammed lakes. GLOFs from bedrock-dammed lakes make up only ~1% (30 of 3151) of the total number 269 of GLOFs from 850-2022 (Fig. 1a). Indeed, overtopping of bedrock barriers have only rarely been reported⁸¹, in 270 contrast with the with the high regional abundance of bedrock-dammed lakes⁶², especially in the Himalaya and 271 Andes^{17,97}. Their limited occurrence might arise from the fact that unfractured bedrock dams can withstand 272 increases in hydrostatic pressure, and hence are only overtopped by displacement waves from a mass movement 273 entering the lake⁶². GLOFs from bedrock-dammed lakes are only reported after the 1960s and those occurred 274 mainly in the low latitude Andes (n=27; 16.6% within the low latitude Andes, 90% of global bedrock-dammed 275 GLOFs). While evidence is limited, GLOF counts from bedrock-dammed lakes might be underestimated given the 276 short preservation time of any geomorphic evidence, especially compared to moraine dam failures¹⁰⁰.

277 Similarly, there are relatively few GLOFs attributed to englacial or subglacial lakes induced by geothermal or 278 volcanic activity compared to other GLOF triggers and mechanisms¹⁰¹. GLOFs from englacial lakes produce 279 poorly-preserved geomorphological evidence and are difficult to detect with optical remote sensing. They are 280 mainly reported in Central Europe (n=112, 25.3% within Central Europe, 69.1% of global englacial-GLOFs). The 281 majority of GLOFs from subglacial lakes are found in Central Europe (n=5; 1.13% within Central Europe, 71.4% of 282 global subglacial-GLOFs), Southeast Asia (n=1; 1.18% within Iceland, 14.3% of global) and the low latitude Andes 283 (n=1; 0.61% within the low latitude Andes, 14.3% of global) (Fig. 1b). In Iceland, for example, at least 264 outbursts from a small number of subglacial lakes³¹, which repeatedly form and drain due to geothermal activity beneath 284 the ice caps, have been observed, with further evidence of glacier-volcano interactions both in historical and 285 prehistoric times^{102,103}. Floods caused by rapidly-draining englacial lakes have also occasionally been reported in 286 New Zealand, central Europe, western Canada and the USA¹⁰⁴⁻¹⁰⁶ (Fig. 1b). 287

288

289 [H2] GLOF hazard assessment

Understanding the characteristics of glacial lakes, changes to them, and GLOF triggers and mechanisms is the basis for GLOF hazard assessment, which is critical for disaster prevention and damage mitigation. Globally, more than ten million people are potentially exposed to the impacts of GLOFs, mainly in HMA^{38,107}. Potentially dangerous glacial lakes have been identified using a range of assessment approaches, ranging from large-scale automated methods considering key determinants such as lake size, catchment area, ice/rock avalanche potential, and dam steepness^{108,109}, through to detailed catchment or lake-specific assessments including field investigations¹¹⁰⁻¹¹². Identifying the type of glacial lake dam is a critical first step in GLOF hazard assessments, as

297 it determines the stability of the lake, triggering processes, the potential magnitude of the GLOF, and the 298 mechanisms of drainage¹¹³.

299 For GLOF hazard assessment a distinction is typically made between those factors that are critical to the 300 inherent stability of the lake dam (geometry and structure of the dam) and those that influence the potential for 301 an external triggering event (a rock or ice avalanche)¹¹⁴. Additionally, the hydro-geomorphic characteristics of the 302 lake catchment area, which can influence the susceptibility to precipitation or melt-triggered outburst events have 303 also been highlighted^{37,115}. With high resolution optical imagery (such as available from google earth) and 304 corresponding high quality digital terrain models, it has become possible to quantify various physical characteristics of the dam and catchment area remotely over large spatial scales^{109,116}. However, precise geometric 305 measurements (such as dam freeboard or dam height) and in situ characteristics (such as ice-core, lithology) are 306 307 lacking, and can only be confirmed through local site investigations.

308 Typically, large glacial lakes are emphasized owing to the potential high-magnitude GLOFS that could originate from them, yet outbursts from small or even seasonal lakes have proven capable of eroding huge 309 volumes of sediment and producing catastrophic downstream process chains¹¹⁷. GLOFs can be both the trigger 310 of a process chain, or they can be initiated as part of a larger process chain, as in the case of a mass movement 311 causing a displacement wave, overtopping and downstream flood¹¹⁸. Several hydrodynamic numerical 312 models^{80,119-122} have been used to numerically propagate flood waves downstream, modelling not only a GLOF 313 but also entire process chains (Supplementary Table 3). However, in the absence of robust field data from past 314 315 events, modelling is often undertaken with poorly-constrained conditions and parameters. Some morphodynamic 316 models that include sediment transport and bed elevation changes during a simulation have also been applied where independent pre- and post-GLOF topographic data are available^{123,124}. These models can estimate sediment 317 318 entrainment and transport rates¹²⁵, and more generally this numerical modelling has potential to interpolate 319 between observations along a river reach, or to extend beyond them downstream.

320

321 [H2] Trends in GLOF frequency and magnitude

322 Although suffering from known biases and limitations^{62,100}, remote sensing observations and geomorphological evidence offers an opportunity to roughly estimate whether GLOFs have changed in frequency. 323 The number of reported GLOFs increased from 1 in 850 to 3151 in 2022, peaking from 2000-2020 (refs ^{26,35}). 324 However, poor instrumentation and limited available satellite imagery might be responsible for fewer records of 325 historical GLOF events before ~1980, suggesting a bias in the estimation of the historical GLOF trend^{26,81,126}. At 326 the regional scale, this bias has been confirmed. For instance, GLOFs from ice-dammed lakes in Alaska revealed 327 328 an unchanged frequency and decreasing magnitude from 1985-2020 (ref ⁸²). Furthermore, time-series analysis of 329 satellite images in the Himalaya suggest an unchanged frequency of moraine-dammed GLOFs from 1980s to 2017 (ref ¹²⁷). Therefore, the increasing number of moraine- and bedrock-dammed lakes in mountainous regions
 worldwide does not necessarily imply more GLOFs^{9,12}.

332 Little is also known about how average or extreme GLOF flood discharges and volumes have changed, but 333 some general themes have emerged. For instance, flood volumes of the largest reported GLOFs from ice-dammed 334 lakes worldwide have decreased by an order of magnitude since 1900³³. In contrast, the average peak discharge and volume of ice-dammed GLOFs remain unchanged³³. These changes align with the thinning of ice dams with 335 336 atmospheric warming and glacier ablation, such that maximum lake levels gradually fall and drainage of icedammed lakes occurs earlier in the melt season^{33,83}. Moreover, as glaciers retreat, many glacier dams can no 337 longer impound lakes at their termini at lower elevations, or the glaciers are lost altogether⁸². Where ice-dammed 338 339 lakes can form at higher elevations they tend to be smaller because the topography is steeper and thus the water 340 storage capacity is limited.

341

342 [H1] Future glacial lakes and outburst floods

Whether the increasing number and size of glacial lakes will lead to higher-magnitude GLOF discharges and greater GLOF volumes in the future remains a controversial hypothesis. With such apparent historical changes in glacial lake number and corresponding GLOFs, predicting their changes in a warming climate is important for understanding future natural hazards^{128,129}. The future of glacial lakes and potential hazard hotspots are now discussed.

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349 [H2] Future glacial lake evolution

The life cycle of glacial lakes is known to shift in a warming climate (**Fig. 5**). Supraglacial lakes can grow, coalesce, and eventually form proglacial lakes. Simultaneously, existing proglacial lakes can expand in area and in volume (Fig. 5). Formation of new lakes and the growth of existing lakes can accelerate glacier terminus retreat, via increased frontal ablation^{130,131}. Future increases in the volume of proglacial lakes will generally increase the downstream damage of any GLOFs³⁸. In addition, some ice-dammed lakes might form following glacier surges, and episodic failures of ice-dammed lakes are highly destructive^{132,133}. Ice-dammed lakes will continue to breach in the near future, even as glaciers thin and retreat^{33,64}.

Beyond these conceptual change, estimating subglacial topography and identifying potential overdeepenings are critical to project the location and size of future glacial lakes. As glaciers retreat, depressions can be exposed that have the potential to fill partly or fully with meltwater to develop into glacial lakes¹²⁸. Identification of these overdeepenings requires knowledge (or an estimate) of subglacial bedrock morphology, which can be modelled by subtracting ice thickness^{20,134} from a digital elevation model¹³⁵, and a hydrological filling algorithm applied to fill the overdeepenings¹³⁶. The difference between the filled and the original subglacial bed topography provides a bathymetric grid suggesting the extent and volume of the overdeepenings and, hence, of

potential future glacial lakes^{24,135}. Glacier evolution models^{20,137} can also predict future rates of glacier retreat so as to estimate when glacial lakes might begin to form^{21,24,135}. However, these studies cannot currently determine the dam type nor even can they confidently suggest the height of the future lake outlet ²⁴.

Nonetheless, despite the high and yet unassessed uncertainty, these ice thickness – overdeepening approaches have been used to project regional changes in glacial lakes, including HMA^{21,24} (**Fig. 6**; **Supplementary Table 4**).

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In HMA, glacial lake area and volume is generally expected to increase. These changes arise due to high projected 371 glacier volume losses (60-75% by 2100 under unabated CO₂ emissions^{25,138}), exposing subglacial overdeepenings 372 and, thus, expanding existing lakes and developing new glacial lakes^{21,24}. For example, with complete glacier 373 disappearance in HMA, ~13,000 new glacial lakes (each larger than 0.01 km²) could potentially form, with a total 374 375 area of ~1,510 km² and volume of ~52.3 km³ (ref ²⁴). Similar estimates of a maximum number of 10,068 [6981, 376 13538] new ice-dammed lakes are projected by 2100 under SSP585, with an area of 290 [204, 639] km², and a volume of 2.9 [1.9, 4.9] km³ (ref ⁶⁴). However, these quantifications are uncertain. Indeed, a different ice thickness 377 378 model and hence subglacial bed topography suggests ~25,285 lakes (larger than 0.01 km²) could form by 379 complete deglaciation, having an area of 2,683 \pm 773.8 km² and volume of 99.1 \pm 28.6 km³ ¹³⁵.

The magnitude of the projected glacial lake changes in HMA is regionally variable as well as strongly dependent on the emission scenario (hence, temperature rise). Generally, greater changes are expected in western regions (**Figs. 6a-c**). Glacial lake area, for example, is expected to increase by 26.8×10^2 km² in south-western Asia compared to 15.1×10^2 km² in south-eastern and 8.3×10^2 km² in central Asia (**Fig. 6a, c**). Glacial lake volume also reflects similar shifts (**Fig. 6b, c**). Future lake area and volume in most subregions under all emission scenarios show a continuous increase until about 2090 and then decrease (**Fig. 6e, f**). However, there are sub-regional differences, with larger increases in the Karakoram and Himalaya under all emission scenarios (**Fig. 6e, f**).

387 Glacial lakes area and volume is also expected to increase somewhat in the European Alps. At the bigger regional scale, lake area and volume are expected to increase by 477.0 km² and 1.7 km³, respectively by 388 389 deglaciation (Fig. 6a, b). However, at a national level, different climate scenarios and glacier evolution models are 390 often used that make comparisons difficult. In the Swiss Alps, the number and area of lakes are 987 and 6.22 \pm 391 0.25 km² in 2016, respectively (ref ⁵⁹). If all glaciers were to disappear, ~500 new glacial lakes (of at least 0.01 km²) could form, with a total area of about 50 km² and volume of 1.6 km³ (ref ¹²⁸). These estimates are broadly in 392 393 keeping with ice free scenarios based on current ice thickness measurements; they suggest 683 glacial lakes (larger 394 than 0.005 km²) with a total area and volume of 45.2 ± 9.3 km² and 1.16 [1.05, 1.32] km³, respectively, could 395 develop²³. Looking at specific emissions scenarios rather than total ice elimination, glacial lake volumes of 0.35396 [0.12, 0.49] km³ and 0.94 [0.51, 1.04] km³ could be realized by 2100 for SSP1-2.6 and SSP5-8.5, respectively²³. In

the upper Rhône catchment, southwestern Swiss Alps, alone, 100 sites are predicted to have a high potential for
 future glacial lake formation¹³⁹.

Smaller changes are anticipated in other regions of the European Alps. In Austria, 42 potential new glacial lakes with a total area of about 2 km² could form by deglaciation ¹⁴⁰, an increase from the current 1410 lakes with a total area of 17.1 km² in 2015 (ref ⁷⁵). A similar number of new lakes are expected under complete ice loss in the Aosta Valley region, Italy; 46 potential new lakes larger than 0.01 km² might develop, with a total area of 3.1 ± 0.9 km² and a volume of 0.06 ± 0.02 km³ (ref ¹⁴¹), expanding the current 186 lakes with a total area of 1.4 km² (ref ¹⁴²). Likewise, 80 (48 with a high level of confidence) potential new lakes could form under full deglaciation in the Mont Blanc massif of the French Alps¹⁴³

Smaller changes are generally expected in glacial regions of the Southern Hemisphere, including the New Zealand Alps. Here, lake area is expected to increase by 42.3 km² by 2100 under RCP4.5 (**Fig. 6a, b**). More specifically, icemarginal lakes across the Southern Alps could expand from 20.9 km² in 2020 to 40.4 km² in 2050 (ref ⁷⁴). However, from 2050 onwards, the rate of increase in total area is projected to decrease from 0.65 km² yr⁻¹ in 2020-2050 to 0.04 km² yr⁻¹ in 2050-2100 as lakes detach from glaciers and/or fill with sediment⁷⁴.

In the Peruvian Andes, glacial lake area is projected to increase by 65.5 km² and volume by 0.7 km³ by 2100 411 412 under RCP8.5^{73,144} (Fig. 6a, b). In the still glaciated Cordillera Blanca, 38 or 50 new lakes could emerge by 2100 under RCP2.6 or RCP8.5, respectively⁷³, increasing from the current 870 lakesaccordingly, glacial lake area is 413 414 expected to increase by ~10% compared to 2018 values, from 35.2 to 37.0 km². In the deglaciating Vilcanota-415 Urubamba basin, lake area in 2100 is projected to be 3.2% higher than 2016 values under RCP2.6 (from 26.9 to 27.8 km² and 6.0% higher under RCP8.5 (from 26.9 to 28.5 km²)¹⁴⁴. The topographic setting means that the rate 416 of increase is higher for 2016-2050 compared to 2050-2100 as glaciers are already retreating to very steep slopes 417 418 by 2050 (ref ¹⁴⁴). In deglaciated areas of the Peruvian Andes, 201 sites (of at least 0.01 km²) with a total volume of 0.26 km³ have been compiled for a future glacial lake inventory¹⁴⁵. 419

420 Often not included in these assessments is sediment deposition within newly exposed overdeepenings, 421 infilling potential future lakes and complicating specific projections. Such infilling is particularly likely in 422 tectonically active, high-relief regions with abundant sediment supply such as HMA and the Southern Alps^{61,146}. 423 Where lakes receive meltwater from GLOFs as well as from ablation-fed meltwater flows, and where GLOF-induced 424 bank erosion widens river channels hundreds of kilometers downstream^{23,78}, then sedimentation rates within 425 future lakes will also be very high. Indeed, erosion rates and sediment transport in glacierized basins are generally expected to increase due to cryosphere degradation^{61,146}, but there has been almost no quantitative analysis of 426 this process. One exception is in the Swiss Alps, where approximately half of newly-formed glacial lakes and 11-427 25 % of the total overdeepening volume are expected to disappear by 2100 due to sediment infilling²³. If sediment 428 429 delivery is not considered, the potential future glacial lakes are likely to be over-estimated in number and size.

431 [H2] Future GLOF hazard and risk

432 With projected changes in glacial lakes come potential changes in GLOFs. Based on physical understanding and supported by models, increasing GLOFs are assumed for the future^{24,64,135}, albeit with much regional 433 434 variability. The higher potential for GLOF impacts in HMA compared to other regions is due to the large (and 435 exposed) population and to low economic development³⁸. In HMA, future GLOF hazards are expected to triple 436 from current conditions due to lake development (Fig. 6d). Even greater increases (>fivefold) are projected in 437 the Karakoram and Pamir regions²⁴, which are expected to become a hotspot of potential GLOF hazard¹³⁵, although the timing of lake formation is uncertain¹⁴⁷. The characteristics of GLOFs in HMA are also expected to 438 439 shift. Scenario modelling in the Poigu River basin of China and Nepal, for example, suggests that permafrost 440 degradation will enhance large mass movements (of tens of millions of m³) into glacial lakes, resulting in larger flood magnitudes and thereby longer distances downstream of flood impact than historically observed¹⁴⁸. 441

Future GLOF hazards in other regions of the world are unlikely to increase as in HMA. For example, there is relatively low potential future for GLOFs in the Mont Blanc massif (Western European Alps) owing to the flat glacier bed topography ¹⁴³. In the Cordillera Blanca (Peru), glacier retreat and lake formation are already at an advanced stage, and new lakes still to form will be predominantly dammed by stable bedrock⁷³. However, in lceland mega GLOFs induced by volcanic activity can occur in the future, irrespective and independent of climate change⁸⁹.

Of course, while GLOF hazard might increase, overall risk also necessitates consideration of exposure and vulnerability. To date, comprehensive risk assessments considering the changing flood hazard and societal vulnerability and exposure have been lacking. However, the expansion of communities and infrastructure, including hydropower facilities, has been and will continue to be a major driver of GLOF risk ¹⁴⁹⁻¹⁵¹. Thus, infrastructure expansion in glacial valleys, coupled with expanded glacial likes, will likely result in enhanced GLOF risk, threatening downstream populations and infrastructure^{129,152-154}. Accordingly, there are new challenges for warning systems or other disaster risk reduction measures¹⁵⁵.

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456 [H1] Summary and future perspectives

Global glacier melt has accelerated due to atmospheric warming, feeding rapid growth of glacial lakes in most world regions from the 1960s onwards. Although uncertain, it is estimated that glacial lake number and area have increased ~50% from 1990-2018 (ref ⁹), such that more than 110,000 glacial lakes with a total area of ~15,000 km² in 2015-2019 have been identified. This trend in glacial lakes is associated with a potential increase in GLOF hazards and risks. More than 3,000 GLOFs have occurred worldwide from 850-2022, with ~88% recorded since 1900. Indeed, GLOFs have increased in frequency and magnitude in most glaciated mountain regions, especially after 2000 (ref ^{26,35}), a trend that is likely to continue with ongoing deglaciation, increasing

464 GLOF risk and hazard when coupled with enhanced development in downstream river valleys. In HMA, in

465 particular, GLOF risk is projected to increase threefold by deglaciation ^{24,126}.

466 While GLOF knowledge has advanced considerably, key challenges remain, particularly surrounding data. 467 As a starting point, homogeneous and standardized multi-temporal glacial lake inventories are needed, so far 468 limited by mapping efficiency. Visual inspection and manual editing of lake outlines have been the main 469 methods used to date, time-consuming approaches that rely heavily on individual expertise. The use of cloud 470 computing, machine learning and artificial intelligence technologies should overcome manual limitations. However, access to regional high-quality lake inventories to train machine learning classifiers is vitally important. 471 472 With any such inventories, consistent thresholds for minimum lake area and distance from glaciers are needed, 473 as well as consistent classifications. An updated multi-period inventory of global glacial lakes with a single 474 criterion is expected to fill the gaps of missing lakes and regional deficiencies 475 Hydrodynamic modelling and reconstruction of GLOFs is also hindered by absent data. Field data of lake 476 properties (including bathymetry, temperature and lake outflow peak discharge) and GLOF mechanisms is 477 desperately needed in different glaciated environments and for different lake types to refine and test model 478 parameters, as well as parametrize dam breach models. Yet, such data is extremely difficult to acquire given 479 accessibility and safety that makes successful recovery of instrumentation and sensors challenging, especially in 480 ice-proximal locations. Accordingly, local, regional and even global understanding of GLOF flow dynamics is 481 limited, feeding into hazard assessment, early warning systems, infrastructure design, and emergency response. 482 In addition to the use of modern field observation instruments and data transmission, broader international 483 cooperation and the establishment of data opening and sharing are important ways forward. Future research 484 should focus on comparing model results with field observations, historical flood records, and other 485 independent data sets to improve model credibility.

486 Assessments of future glacier lakes under-report the common problem of uncertainty about the location, 487 size and timing of potential future lakes. The average error in measured ice thickness of $10 \pm 24\%^{156}$ masks 488 considerably higher uncertainties for specific glaciers, including an uncertainty range of ±30% suggested by the validation of ground-penetrating radar measurements in the Swiss Alps¹²⁸. Thus, while common ice thickness 489 models can estimate the total ice volume of all glaciers globally^{20,134} or regionally^{157,158}, differences between ice 490 thickness models can lead to substantial local differences. Crucially, the potential future lake area is highly sensitive 491 492 to small errors in, for example, the height of a subglacial rock barrier or the depth of an overdeepening²³. Obtaining accurate glacier bed topography by ice thickness modelling remains a challenge, but it can be improved 493 by increasing the accuracy of the underlying input data, adding measured thickness data, and multi-model 494 synthesis^{20,156,159,160}. In the future, with the launch of P-band and L-band radar satellites, obtaining ice thickness 495 496 using tomographic SAR technology will provide new opportunities and possibilities to improve the accuracy of 497 future glacial lake prediction^{161,162}.

498 These improved data and models are vital to enhance GLOF hazard assessment, particularly in a warming 499 world associated with enhanced GLOF risk. However, GLOF hazard assessments suffer from inconsistent 500 approaches (indicators and their thresholds) and a lack of a common assessment framework (filed survey, 501 hazard and risk assessment and management action)^{108,116}. Technical guidelines have been established at the 502 international level, but have yet to be adapted or widely consolidated into regional or national approaches, as 503 the level and development of guidelines varies widely across regions¹¹³. Where existing assessments provide 504 conflicting results, efforts should be undertaken to consolidate findings to determine which lakes should be 505 prioritized for monitoring and other response actions. In particular, the need to consider small lakes is emphasized, as such lakes have often been overlooked but can have devastating downstream impacts^{77,117}. 506 507 Importantly, this knowledge needs to be used to anticipate the hazards of future GLOF events, including worst-508 case scenarios. Given the tendency for GLOFs to be triggered by or associated with other mass movements and 509 cascading processes, multi-hazard perspectives are encouraged.

Future efforts to move beyond hazard to comprehensive GLOF risk assessment must also involve a wider network of local experts and broader disciplines. Failure to adequately consider local vulnerabilities, needs and perceptions can ultimately limit the success of disaster risk reduction measures, such as early warning systems¹⁶³. As a transboundary phenomenon, GLOFs pose particular challenges for disaster risk reduction where cooperation and sharing across political boundaries are required, and where societal and institutional capacities to manage GLOF risks can vary widely between upstream and downstream regions. Scientists, policymakers and stakeholders should work together towards broader international and regional across transboundary

517 cooperation to reduce the risk of GLOFs.

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on future glacial lakes and impacts. G.Z., S.A., and J.C. contributed the section on summary and perspectives. X.W.
contributed to some of the figures. G.Z. and J.C. led the writing, and all authors reviewed and edited the manuscript
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890

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- 904

905 Data availability

906 The global compilation of glacial lakes is available at https://doi.org/XXX

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Fig. 1 | Global distribution of glacial lakes and historical GLOFs. a, Area and volume of present-day (~2018) 912 glacial lakes within 1 km of glaciers, aggregated over 220 km hexagon grid cells⁹ (red shades), and regional 913 statistics of lake volume, area and number according to GTN-G glacier regions of the Randolph Glacier 914 915 Inventory (RGI) 55 (donut plots); outer, middle and inner circles indicate the total volume, area and number 916 percentage of glacial lakes in a given size interval, respectively, with the total lake area in each region in the 917 center of the circle. Two RGI subregions (Svalbard and Jan Mayen, Antarctic and Subantarctic) are not included as they are not part of the underlying global glacial lake dataset ⁹. **b**, The global distribution of historical GLOFs 918 919 aggregated over 220 km hexagon grid cells (red shading), and regional break down of GLOF number by glacial lake (dam) types ²⁶ (pie charts). Some RGI subregions are not presented as they are not covered by the global 920



Fig. 2 | Methodology for quantifying glacial lake changes and impacts. Methods to map glacial lakes (red),
 estimate lake volume and peak (yellow) and assess GLOF susceptibility and simulation (blue). Glacial lake
 mapping, estimates of GLOF susceptibility, volume and peak discharge, and hydrodynamic simulations provide

932 important baseline integrated data for GLOF hazard assessment.



a Glacial lake area changes





- number (dark green line) and area (light green bar) of detached proglacial lakes in Southern Pamir⁷² (see panel
- a for location). The spans in the different time blocks are shown as the limited data available. Error bars
- 940 indicate uncertainties and inaccuracies owing to low image resolution or quality, or the use of images from
- 941 different years for the same time step. **c**, As in b, but for the Peruvian Andes ⁷³. **d**, As in b, but for New Zealand
- 942 ⁷⁴. **e**, As in b, but for Switzerland ⁵⁹. Global patterns of glacial lake change show that glacial lakes have expanded
- 943 worldwide, especially for proglacial lakes



b GLOF hazard chain



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Fig. 4 | The triggers and mechanisms of GLOFs. a, Flowchart indicating the process of a GLOF, from trigger of
 mechanisms (blue), flood modelling (yellow), to downstream impact (red). b, Schematic diagram and
 corresponding photos (1-8) of the hazard chain, from triggering factors to glacial lake outburst, downstream

- impacts and damage). Understanding the triggers and mechanisms of GLOFs and flood modelling practices canimprove hazard mitigation.



Fig. 5 Future formation and growth of glacial lakes and GLOF hazard. Future development of supraglacial,
proglacial and ice-dammed lakes (top 2 rows), their corresponding impact on GLOF occurrence (bottom left)
and potential change in GLOF hazard (bottom right). The life cycle of different types of glacial lakes shifts in a
warming climate

a Projected glacial lake area



C Projected glacial lake area and volume in HMA



e Scenario dependence of HMA glacial lake area

b Projected glacial lake volume



d Projected GLOF hazard and risk in HMA





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Fig. 6 | Global potential future glacial lakes and GLOF hazard. a | Published estimates of potential future 960 961 glacial lake area by deglaciation (Supplementary Table 4). b, As in a, but for potential future glacial lake volume 962 by deglaciation. c | Potential future glacial lake area (circles) and volume (shading) in HMA by 2100 under RCP 963 8.5 (ref ²⁴). Background shading depicts drainage basins using the colours in panels e and f. d, Future GLOF risk 964 (light shading), exposure (medium shading) and hazard (dark shading) in HMA by 2100 under RCP 8.5 (ref ²⁴). Physical or social vulnerability is not considered. e, Time series of potential future glacial lake area in HMA under 965 966 different SSPs, with shading representing different subregions²¹. **f**, As in e, but for lake volume. Projected global 967 glacial lakes will increase globally by 2100 under different emission scenarios, posing a potential hazard threat to downstream communities 968