

Glacial lake evolution and glacier–lake interactions in the Poiqu River basin, central Himalaya, 1964–2017

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ABSTRACT. Despite previous studies, glacier–lake interactions and future lake development in the Poiqu River basin, central Himalaya, are still not well understood. We mapped glacial lakes, glaciers, their frontal positions and ice flow from optical remote sensing data, and calculated glacier surface elevation change from digital terrain models. During 1964–2017, the total glacial-lake area increased by ~110%. Glaciers retreated with an average rate of $\sim 1.4 \text{ km}^2 \text{ a}^{-1}$ between 1975 and 2015. Based on rapid area expansion (>150%), and information from previous studies, eight lakes were considered to be potentially dangerous glacial lakes. Corresponding lake-terminating glaciers showed an overall retreat of 6.0 ± 1.4 to $26.6 \pm 1.1 \text{ m a}^{-1}$ and accompanying lake expansion. The regional mean glacier elevation change was $-0.39 \pm 0.13 \text{ m a}^{-1}$ while the glaciers associated with the eight potentially dangerous lakes lowered by $-0.71 \pm 0.05 \text{ m a}^{-1}$ from 1974 to 2017. The mean ice flow speed of these glaciers was $\sim 10 \text{ m a}^{-1}$ from 2013 to 2017; about double the mean for the entire study area. Analysis of these data along with climate observations suggests that ice melting and calving processes play the dominant role in driving lake enlargement. Modelling of future lake development shows where new lakes might emerge and existing lakes could expand with projected glacial recession.

KEYWORDS: central Himalaya, future lake development, glacier and lake mapping, glacier elevation change, glacier–lake interaction

1. INTRODUCTION

There are more than 5000 glacial lakes (larger than 0.003 km^2) in the Third Pole (a colloquial name given to the glaciated region of the Tibetan Plateau (TP) and surroundings), with the majority of these located in the Himalaya (Zhang and others, 2015; Nie and others, 2017). The glacial-lake area expanded by ~14% between 1990 and 2015 in the whole Himalaya (Nie and others, 2017). Within the Himalaya located in Chinese territory, glacial-lake area increased by ~30% between the 1970s and the 2000s (Wang and others, 2012a). These increases were due to the formation and development of glacial lakes, especially proglacial lakes, emerging and expanding as glaciers retreated (Benn and others, 2012; Zhang and others, 2015; Nie and others, 2017).

As climate changes, glacier-related hazards are likely to increase, although incomplete records and lag-times in glacier–lake interactions mean that no clear trend in response to anthropogenic warming is evident (Harrison and others, 2018). The sudden release of water from lakes impounded by moraines or ice dams can result in glacial lake outburst floods (GLOFs), while more rarely, impact waves from large mass movement can cause overtopping from bedrock dammed lakes. GLOFs are closely linked with glacier retreat in terms of the expansion of existing lakes and triggering of lake outbursts (Emmer, 2017). The Himalayas are one of the mountain regions of the world where GLOFs occur most frequently

(Carrivick and Tweed, 2016). A GLOF risk assessment has been coordinated for the entire Hindu-Kush-Himalayan region (Ives and others, 2010), while national-scale assessments of critical glacial lakes have been conducted for the Indian Himalaya (Worni and others, 2013), the Nepal Himalaya (Rounce and others, 2017) and the Chinese Himalaya (Wang and others, 2012b, 2015). Moraine-dammed lakes are more common in the central and eastern Himalayas, while ice-dammed lakes predominate in the western regions (Richardson and Reynolds, 2000). The failure of moraine-dammed lakes in particular can produce devastating GLOFs, owing to their tendency to mobilise large amounts of debris (e.g. Allen and others, 2015). Many GLOFs have been reported in the Himalaya, including 14 in Nepal, 30 in Tibet and 21 in Bhutan (ICIMOD, 2011; Komori and others, 2012; Liu and others, 2013; Khanal and others, 2015). Ten previously unreported GLOFs were detected recently using the full seasonal archive of Landsat images (Veh and others, 2018). GLOFs are considered the most serious glacial-related hazard, threatening ecosystems, livelihoods and infrastructure in the Himalaya, with well-documented historical disasters dating back to 1935 (Nie and others, 2018). Approximately 80% of GLOFs in the Himalaya were initiated by displacement waves from ice avalanches (Awal and others, 2010).

Lake mapping based on Landsat images revealed 329 moraine-dammed lakes ($\geq 0.02 \text{ km}^2$) in the Chinese Himalaya with ~100 of them identified as potentially dangerous glacial lakes (PDGLs) (Wang and others, 2012b, 2015). Several of these lakes are located in the Poiqu River Basin.

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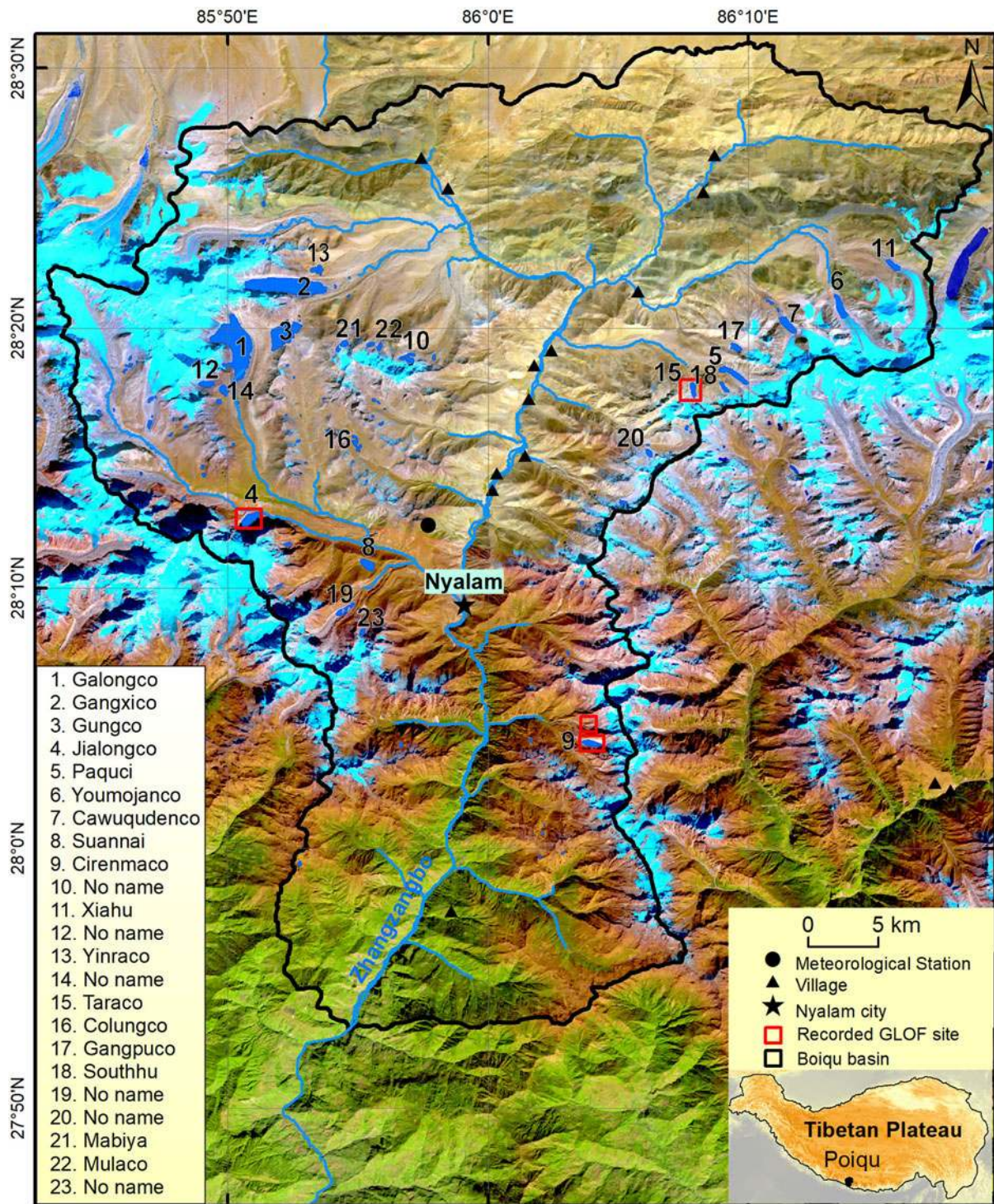


Fig. 1. Glacier and lake distribution in the Poiqu River basin, central Himalaya. The IDs and names of 23 lakes ($\geq 0.1 \text{ km}^2$) in 2017 are indicated. The inset indicates the location of the Poiqu River basin in the TP. The four recorded GLOF sites are also shown, corresponding to data given in Table 2.

This basin is a transboundary basin located in the central Himalaya. It originates in Tibet and flows into Nepal (Fig. 1). Previous studies identified the high level of risk in this basin, as the potential for GLOF hazards is high and any outburst could severely affect livelihoods and infrastructure (Khanal and others, 2015; Wang and others, 2015). This basin also has the highest ratio of glacier area to lake area in the Hindu-Kush-Karakoram-Himalaya (HKH) regions (Wang and others, 2014).

The specific objectives of our study are therefore: (1) to examine the detailed evolution of glacial lakes since 1964

in the Poiqu River basin; (2) to investigate glacier–lake interactions, that is glacier area, surface velocity and surface lowering and their relationship to glacial-lake changes, and (3) to simulate possible future lake development with an emphasis on lakes that are considered as being potentially dangerous.

2. PREVIOUS STUDIES IN THE POIQU RIVER BASIN

2.1 Glacier area shrinkage

Glacier area in the Koshi River basin (which includes the Poiqu River basin) has decreased by $\sim 19\%$ in the past four

decades (Table 1) (Shangguan and others, 2014; Xiang and others, 2018). Reported shrinkage rates for Poiqu basin based on Landsat observations vary between $\sim 1.3\% \text{ a}^{-1}$ for the period 1986–2001 (Chen and others, 2007b) and $\sim 0.54\% \text{ a}^{-1}$ for 1975–2010, with an accelerating rate after 2000 (Xiang and others, 2014). Although the retreat of glaciers allows proglacial lakes to develop and expand, glacial lake evolution in the Himalaya can be better explained by considering glacier mass balance (Gardelle and others, 2011; King and others, 2017).

2.2 Glacial-lake area expansion

The total area of glacial lakes in the Koshi River basin increased by $\sim 10\%$ ($0.7 \text{ km}^2 \text{ a}^{-1}$) between 2000 and 2009 (Wang and Zhang, 2014). The total area of glacial lakes (with area $\geq 0.02 \text{ km}^2$) in the Poiqu River basin increased by $\sim 47\%$ ($0.37 \text{ km}^2 \text{ a}^{-1}$) in the period 1986–2001 (Chen and others, 2007b), corresponding to retreat of the parent glaciers. Between 1976 and 2010, Landsat imagery revealed that glacial lakes had an area increase of $\sim 83\%$ ($0.26 \text{ km}^2 \text{ a}^{-1}$), with a larger rate of $0.26 \text{ km}^2 \text{ a}^{-1}$ for glacier-fed lakes compared with $0.003 \text{ km}^2 \text{ a}^{-1}$ for nonglacier-fed lakes (Wang and others, 2014). A comparison of topographic maps from 1974 and Landsat imagery for 2014 reveals that Galongco and Gangxico lakes expanded by $\sim 500\%$ ($0.45 \text{ km}^2 \text{ a}^{-1}$) and $\sim 107\%$ ($0.34 \text{ km}^2 \text{ a}^{-1}$) respectively over this period. This expansion corresponds to an area shrinkage of their parent glaciers of Jipucong and Reqiang of $\sim 40\%$ ($\sim 0.07 \text{ km}^2 \text{ a}^{-1}$) (Wang and Jiao, 2015). Seven lakes, including Galonco, Gangxico, Youmojianco and Cirenmaco in the basin have previously been identified as PDGLs based on high rates of expansion and a semiquantitative method considering other factors relevant for lake stability (Chen and others, 2007a; Wang and others, 2014).

2.3 GLOF hazards

Historical records for moraine-dammed lake outbursts in the Poiqu River basin show that six GLOFs from four different glacial lakes have occurred since 1935 (Table 2 and

Fig. 1). The Taraco outburst occurred in 1935 because of seepage and dam collapse (Chen and others, 2007b). The flood destroyed $66\,000 \text{ m}^2$ of wheat fields and killed several yaks. It was followed by a small outburst at Cirenmaco in 1964. On 11 July 1981, Cirenmaco burst again, due to the collapse of the hanging glacier. This event caused ~ 200 deaths in Nepal and over \$3 million worth of damages (Xu, 1988) including the destruction of the Sino-Nepal Friendship Bridge and the Sun-Kosi hydro-power station. The immense destruction from this GLOF drew broad attention to Cirenmaco. Recent geomorphic field investigations indicate that Cirenmaco is prone to further GLOFs caused by ice/snow avalanches and the melting of dead ice in the moraine (Wang and others, 2018). Two large-scale debris-flows in 2002 damaged the Sino-Nepal Highway, a hydropower station, communication facilities as well as pasture land, with total damages estimated at ~ 1.1 million USD (Chen and others, 2006). The debris flow probably originated from a GLOF from Jialongco which was triggered by an ice avalanche and subsequent moraine dam failure (Chen and others, 2006). Gongbatongsha Tsho was drained by an outburst in 5 July 2016 (Nie and others, 2018), resulting in significant fluvial erosion in the downstream valley (Cook and others, 2018). The main cause of all these outbursts was ice avalanches into moraine-dammed proglacial lakes, consistent with observations from the broader Himalayan region (Richardson and Reynolds, 2000).

3. DATA AND METHODOLOGY

In this study, we mapped glacial lakes in 1964, 1974 and from 1988 to 2017 using Corona KH-4A declassified spy imagery (spatial resolution $\sim 2.7 \text{ m}$), Hexagon KH-9 (6–9 m) and multiple Landsat TM/OLI images (30 m), respectively (Table 3 and Table S1). In addition, we mapped glacier outlines in 2015 and glacier ice-front positions between 1964 and 2017 using Landsat data. Multiple Landsat images acquired at the end of the melt season (September/October) were selected to decrease the obscuration of glacier boundaries from snow cover. Glacier surface velocity was

Table 1. Overview of previous basin-scale glacial lake and glacier studies covering the Poiqu River basin, central Himalaya. The studies are sorted by year of publication

Study area	Study period	Rate of change in area	Data/model used	Key points	Source
Poiqu River basin	1986–2001	47% ($0.37 \text{ km}^2 \text{ a}^{-1}$)	Landsat TM	Changes in glacial lake area	Chen and others (2007a, b)
Sun Koshi basin Chinese Himalaya	1970s–2000s	– 29.7% ($\sim 1.6 \text{ km}^2 \text{ a}^{-1}$)	Hydrodynamic model Topography map and ASTER image; risk assessment	GLOF risk assessment Changes in glacial lake area; PDGLs for moraine-dammed lakes	Shrestha and others (2010) Wang and others (2012a, b); Wang and others (2015)
Poiqu River basin	1976–2010	83% ($0.26 \text{ km}^2 \text{ a}^{-1}$)	Landsat MSS, TM, ETM+	Changes in glacial lake area; PDGLs	Wang and others (2014)
Poiqu River basin	1975–2010	–19% ($-1.33 \text{ km}^2 \text{ a}^{-1}$)	Landsat MSS, TM, ETM+	Changes in glacier area	Xiang and others (2014)
Koshi River basin	1976–2009/ 2010	–19% ($-23.48 \text{ km}^2 \text{ a}^{-1}$)	Topographic map, Landsat MSS, TM, ETM+	Changes in glacier area	Shangguan and others (2014); Xiang and others (2018)
Koshi River basin	2000–10	6% ($0.72 \text{ km}^2 \text{ a}^{-1}$)	Landsat MSS, TM, ETM+	Changes in glacial lake area	Wang and others (2014)
Poiqu/Bhote Koshi/Sun Koshi River Basin	Until 2010, 2012, 2014	–		GLOF risk assessment	Wang and others (2014); Khanal and others (2015); Wang and others (2015)

Table 2. Historical GLOF events in the Poiqu River basin, central Himalaya

Lake name	Date of outburst	Latitude (° N)	Longitude (° E)	Elevation m a.s.l.	Burst water 10 ⁶ m ³	Damage	Trigger	Reference
Taraco	28 August 1935	28.29	86.13	5245	6.3	Farmlands, yaks	Dam collapse by seepage	Xu and others (1989); Chen and others (2007a, b)
Cirenmaco	1964	28.07	86.07	4627	–	–	Piping	Xu and others (1989); Liu and others (2014)
	11 July 1981				18.9	200 deaths, friendship bridge, hydro-power station	Ice avalanche	Xu and others (1988)
Jialongco	23 May 2002	28.21	85.85	4374	23.6	Hydropower station, highway	Ice avalanche	Chen and others (2007a, b)
	29 June 2002					Hydropower station, highway	Ice avalanche	
Gongbatongsha Tsho	5 July 2016	28.08	86.06	4608	–	–	–	Nie and others (2018)

calculated using repeat Landsat OLI imagery (15-m Pan) from 2013 to 2017. Glacier surface elevation change was calculated using Digital Terrain Models (DTMs) generated from 1974 KH-9 stereo images, 2014 and 2017 TanDEM-X CoSSC data and the 2000 SRTM1 DTM.

The Corona KH-4A mission carried two panoramic cameras and provided high-resolution ground samples for the period 1963–1969 (Dashora and others, 2007), enabling us to start the inventory of small glacial lakes in the mid-1960s. The ground swath was 19.7 × 267 km. Two films acquired on 26 November 1964 covering the study area were downloaded from <https://earthexplorer.usgs.gov/> (Fig. S1). Cloud cover in two images for the southern part of the Poiqu watershed is high, but the lakes are mainly distributed in the northern part of basin, such that this did not hinder the observations of lakes. Moreover, some glacial lakes were frozen in November when the images were acquired (Table 3). The boundaries of lake water are, however, still distinguishable from land owing to the high-resolution image and visible differences in the imaging characteristics of lake and land (Fig. S3). Image distortion is a serious problem away from the centre of the image (Slama, 1980; Lamsal and others, 2011; Goerlich and others, 2017). To correct for this, 194 ground control points were selected from Google Earth (Fig. S2) and co-registration of the Corona KH-4A data was conducted in ArcMap using the Georeferencing tool, with a spline transformation.

The Hexagon KH-9 mission operated during the period 1971–1980 and provided high-resolution observations of

6–9 m (Burnett, 2012). Two cloud-free KH-9 images covering the study area on 23 November 1974 were downloaded. The better quality of these images, relative to those from KH-4A, makes the identification of glacier and lake outlines easier, despite lower resolution (Fig. S2). Fifty-five ground control points were selected for co-registration.

The TerraSAR-X (TSX) satellite was launched in 2007. A twin satellite TanDEM-X (TerraSAR-X add-on for Digital Elevation Measurement, TDX) with almost identical instrumentation was launched in 2010. TanDEM-X CoSSC (Coregistered Single Look Slant Range Complex) images were produced by the German Aerospace Centre (Deutsches Zentrum für Luft-und Raumfahrt; DLR). The images cover 30 × 50 km², with a ground resolution of 1.7–3.5 m. Two images acquired in 2014 and 2017 (Table 3), covering 94.4% of the glaciers (excluding a small part of the east of the region without data) were downloaded from <https://tandemx-science.dlr.de/>.

3.1 Glacial lake mapping

The lake boundaries from the KH-4 and KH-9 images were manually vectorised using ArcGIS as these images are pan-chromatic. Visual inspection and manual delineation allowed also accounting for the different lake and snow conditions.

The raw water classification from the Landsat data was performed automatically using the normalised difference water index (NDWI, (green – NIR)/(green + NIR)), that is

Table 3. Data used for lake and glacier area mapping, glacier surface velocity and elevation change. A detailed list of Landsat images used for delineation of glacial lake and glacier outlines is provided in Table S1

Study period	Data source	Resolution m	Swath km	Number	Purpose
26 November 1964	KH-4A	~2.7	19.7 × 267	2	Lake area
23 November 1974	KH-9	6–9	250 × 125	2	Lake area, glacier surface elevation
1988–2017	Landsat TM/OLI	30	185	107	Lake area
2015	Landsat TM	30	185	5	Glacier area
2013–17	Landsat OLI	15	185	7	Glacier surface velocity
February 2000	SRTM DEM	30	225	–	Glacier surface elevation
5 March 2014, 11 April 2017	TanDEM-X	1.7–3.5	~30 × 50	4	Glacier surface elevation

the band ratio between top-of-atmosphere reflectance of green and near infrared (NIR) bands (McFeeters, 1996; Ji and others, 2009). The NDWI has shown a good performance in automated delineation of glacial lakes in the Himalaya (Bolch and others, 2008; Li and Sheng, 2012; Zhang and others, 2017). The lake boundaries were further examined by comparison with original Landsat images to manually correct the misclassification of water, which is most likely to happen for turbid lakes and lakes with partial ice cover and in areas of shadow (Bolch and others, 2008; Zhang and others, 2019). The lake ID, name, types, latitude, and longitude and perimeter for 2017 were labelled first. The corresponding details were then added for the earlier stages from 1964 to 2016. The lakes were classified as moraine-dammed, bedrock-dammed and supraglacial lakes according to how they are associated with glaciers.

3.2 Glacier mapping and ice-front position change

Glacier boundaries determined from Landsat images from 1975 to 2000 were derived from Xiang and others (2014). Debris-covered glaciers were identified by combining a previous study (Xiang and others, 2014) and the second Chinese glacier inventory (Guo and others, 2015). The glacier boundaries in 2015 were manually outlined from the Landsat OLI data in this study using the former outlines as guidance.

Rapidly increasing area is one important factor used to characterise dangerous glacial lakes, in addition to various other factors linked to GLOF triggering and the stability of the lake dam (Awal and others, 2010; Bolch and others, 2011; GAPHAZ, 2017). Glacier ice-front positions between 1964 and 2017 were manually mapped for eight lakes that showed rapid areal expansion (>150%), and where information from previous studies identified these lakes as being potentially dangerous (Chen and others, 2007a; Wang and others, 2014, 2015). Averaging along the glacier front provides more reliable estimations of frontal recession (Bhambri and others, 2012). Changes in glacier ice-front positions were therefore calculated according to the box-methods of Moon and Joughin (2008) and King and others (2018), that is the average ice-front position change was calculated within a polygon created between the ice front and a fixed reference line in the up-glacier direction.

3.3 Glacier surface velocity

Aspects of glacier dynamics, such as glacier flow instability, are important for understanding the development of glacial lakes and related hazards (Kääb, 2005; Bolch and others, 2008). Glacial-flow velocity can be obtained from repeat optical satellite imagery and synthetic-aperture radar data using feature tracking. In this study, glacier surface velocity was calculated using repeat Landsat OLI imagery (15-m Pan, Table 3), performed with the COSI-Corr (Co-registration of Optically Sensed Images and Correlation) software package (Leprince and others, 2007). An initial sliding window of 128 × 128 pixels combined with a smaller window of 16 × 16 pixels were used for frequency-based co-registration. The step size of a constant value of 5 pixels in each dimension, and a frequency masking threshold of 0.9 were adopted (Shen and others, 2018).

3.4 Glacier surface elevation change

Glacier elevation changes (and therefore approximate geodetic mass balance) were calculated using DTMs from different sources and years (Table 3). The two KH-9 images, with an overlap of >70%, were used to produce DTMs of the whole study area. The contrast of the images was enhanced by adaptive filtering and histogram equalisation using ERDAS Imagine (version 2011) to enable recognition of Reseau crosses. The locations of 1081 Reseau crosses were automatically extracted using MATLAB, and the image distortion was corrected using the spline interpolation method (Surazakov and Aizen, 2010; Pieczonka and others, 2013). The DTM was generated using the ERDAS Imagine Leica Photogrammetry Suite 9.2 (LPS). The nonmetric camera model was selected due to the lack of fiducials. Brown's physical model was used to correct for potential lens distortion and film deformation (Holzer and others, 2015). Thirty-four ground control points, identified from mountain ridge lines, river intersections and road intersections, were selected using Google Earth for external orientation (Zhou and others, 2018). The overall root mean square error after the triangulation calculation was 0.7 pixels. Water bodies in the image were masked to avoid interference in the triangulation process. The pixel size of the DTM was resampled to 30 m to match the resolution of the Shuttle Radar Topography Mission (SRTM) DTM. The correction of the elevation difference error between the DTM in 1974 and SRTM in 2000 was conducted using data from a nonglacier region. Registration errors, systematic spatial trend, aspect-, slope- and curvature-dependent differences were fitted using the Bisquare Remain Robust method and removed in MATLAB (Nuth and Kääb, 2011; Gardelle and others, 2012b; Pieczonka and others, 2013; Li and Lin, 2017) (Fig. S4). Brightness saturation in snow-covered regions causes poor texture in optical images, which can result in erroneous matching (Zhou and others, 2017). Based on the assumption that glacier thinning is at a maximum at the glacier front and decreases with increasing altitude (Pieczonka and Bolch, 2015), the peaks of glacier thinning were used as a reference to exclude the outliers. The outliers of elevation difference in each elevation bin were further removed using a 1.5 NMAD filter (Brun and others, 2017). The data gaps in the glacial area were not filled after outlier removal as the mean elevation change is used and consideration of an interpolation of data gaps can result in larger uncertainty.

DTMs from TerraSAR and TanDEM-X data were generated using the InSAR TanDEM-X bistatic DEM workflow in ENVI SARscape software, including interferogram generation, adaptive filter and coherence generation, phase unwrapping and phase-to-height conversion. TanDEM-X exhibited a better match and few outliers than the KH-9 DTM.

Debris cover and snow moisture content can affect the penetration depth of microwave bands. The difference between SRTM_{C-band} and SRTM_{X-band} was used to estimate a first approximation of C-band penetration assuming no penetration of X-band signal (Gardelle and others, 2012a). Elevation difference is regarded as a function of elevation, which is corrected by polynomial fitting (Gardelle and others, 2013). C-band has greater penetration depth, ~1.0 m in the central Himalaya (Gardelle and others, 2013; Zhou and others, 2018), relative to the X-band. The SRTM_{X-band} data are not available in our study area because of a trip-like distribution, preventing the estimation

of penetration depth. X- and C-SRTM data from the regions close to the study area were used to perform curvature and slope-dependence error correction (Gardelle and others, 2012b). The mean penetration depth difference between X- and C-SRTM is 0.93 ± 0.41 m, which is similar to the estimation of 1.0 m from Zhou and others (2018) and 1.4 m from Gardelle and others (2013) (Fig. S5). KH-9 and C-SRTM were acquired in 1974 and 2000, respectively, and the penetration of X-band could introduce a small annual uncertainty relative to a 26-year period. C-SRTM was acquired in February, while one TanDEM-X in October and KH-9 in November are used. The seasonal correction of monsoon-type glaciers with ablation and accumulation during the summer (Fujita, 2008), that is 1-year additional accumulation, was removed using the elevation difference between TanDEM-X and C-SRTM minus their annual average change (Li and Lin, 2017).

3.5 Meteorological data

Global Precipitation Climatology Centre (GPCC) data show better performance in estimating long-term trend of precipitation change in the TP compared with other precipitation products such as GPCP and PERSIANN (Yang and others, 2018). Gridded temperature (1960–2016) and precipitation (1960–2013) changes derived from the Climatic Research Unit (CRU) and GPCC data were used respectively. In addition, annual temperature and precipitation observed at the Nyalam station (located at 3810 m a.s.l.) from 1967 to 2017 were also collected.

3.6 Uncertainty estimation

The accuracy of delineated lake area was estimated using ± 0.5 pixels multiplied by the lake perimeter and spatial resolution (Fujita and others, 2009; Salerno and others, 2012; Haritashya and others, 2018). Uncertainties in the glacier area and ice-front position mapping were estimated following the methods from previous studies (Hall and others, 2003; Ye and others, 2006).

Uncertainties in glacier elevation change in each elevation bin were estimated using the method of Gardelle and others (2013). The uncertainty in each elevation bin was calculated based on Eqn (1):

$$Err_{hi} = \frac{E_{\Delta hi}}{\sqrt{N_{eff}}}, \quad N_{eff} = \frac{N_{tot} \cdot PS}{2d} \quad (1)$$

where Err_{hi} is the uncertainty of glacier elevation change in each elevation bin; $E_{\Delta hi}$ is the std dev. in each elevation bin; N_{eff} is the number of pixels with independent elevation change measurements; N_{tot} is the total number of elevation change measurements; PS is the pixel size (30 m here) and d is the distance of spatial autocorrelation (249 m here), which is determined by Moran's autocorrelation index of elevation difference from off-glacier regions (Gardelle and others, 2013).

The glacier surface elevation change was calculated using Eqn (2):

$$ME = \frac{\sum S_i \cdot h_i}{S_{tot}} \quad (2)$$

where ME is mean elevation change; h_i is the change in each

elevation bin; S_i is the area in each elevation bin and S_{tot} is the total glacier area.

The uncertainty of glacier elevation change was estimated by Eqn (3):

$$Err_{ME} = \sqrt{\sum \left(\left(\sigma_{Err_{hi}} \frac{\partial ME}{\partial h_i} \right)^2 \right)} \quad (3)$$

where Err_{ME} is the uncertainty of total glacier elevation change.

3.7 Future lake development

Proglacial lake formation and expansion are facilitated when overdeepened subglacial basins become proglacial depressions due to glacier retreat, and when these depressions fill with meltwater rather than sediments (Clague and Evans, 1994). Hence, by detecting overdeepenings in the glacier bed, sites of potential future lake formation and possible expansion of existing lakes can be identified (Allen and others, 2016; Linsbauer and others, 2016). We applied the GlabTop model, which was originally developed for estimating ice thickness and bed topography across the Swiss Alps (Linsbauer and others, 2012; Paul and Linsbauer, 2012). The modelled ice thickness distribution was subtracted from a surface DTM to obtain the glacier bed topography, that is, a DTM without glaciers, from which overdeepenings in the glacier bed could be detected and analysed. Comparisons to ground-penetrating measurements has shown that the uncertainty of the modelled ice thickness is about $\pm 30\%$, but the location of overdeepenings is robust (Linsbauer and others, 2012).

We compared the linear lake growth rates from 1964 through 2017 and rates using lake area differences between 1964 and 2017 for PDGLs. The growth rates from both methods were similar. We then used the linear rates from 1964 to 2017 to estimate the future timing of lake expansion, under scenarios where rates decrease by 50% or increase by same magnitude, 50 and 100%.

4. RESULTS

4.1 Changes in glacial lake area between 1964 and 2017

We found 102 lakes ranging in size from 0.007 to 5.5 km² in 2017 (67 of these are ≥ 0.02 km²), with a total area of 20.5 ± 0.4 km². Most of the lakes are moraine-dammed lakes (63%), followed by bedrock-dammed lakes (25%) and supraglacial lakes (13%). The number of glacial lakes increased from 73 in 1964 to 99 in 2000 (Fig. 2). This is followed by a relative stability of the total number between 2000 and 2017 (102 lakes). The total area of these lakes increased by $\sim 110\%$ from 9.7 ± 0.1 km² in 1964 to 20.3 ± 0.2 km² in 2010 with a rate of 0.23 ± 0.01 km² a⁻¹; this trend is especially apparent for large lakes (area ≥ 0.02 km²). The rate of increase in lake size slowed down after 2010 (0.03 ± 0.03 km² a⁻¹). Between 1964 and 2017, the total area of glacial lakes (≥ 0.02 km²) increased by $\sim 115\%$ (0.20 ± 0.06 km² a⁻¹).

The temporal evolution of relative lake area changes showed a slight decrease in area between 1964 and 1988 (Fig. 3). However, the area of moraine-dammed lakes (glacier-fed lakes) expanded during this period. Between

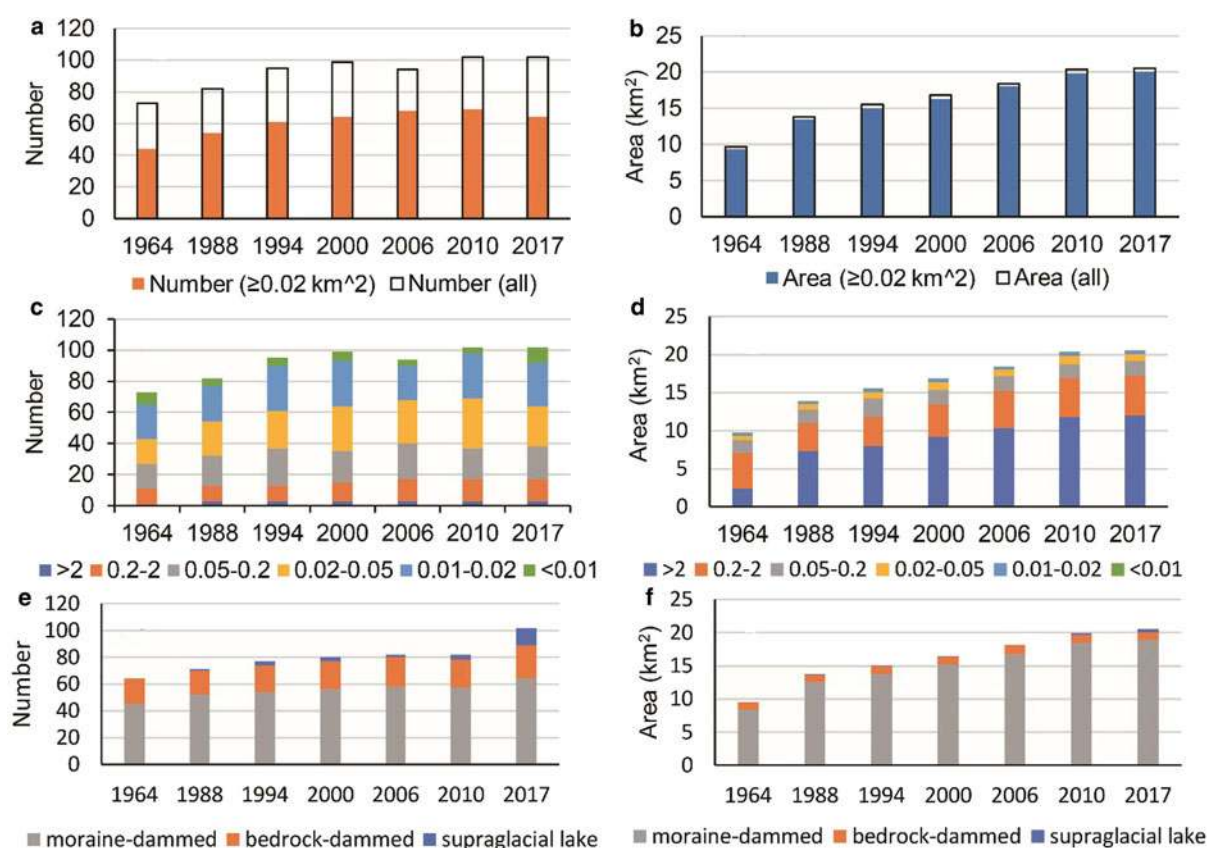


Fig. 2. Number and area changes from 1964 to 2017 for lakes identified visually from Landsat imagery. (a) Number change for all lakes and lakes with area $\geq 0.02 \text{ km}^2$. (b) Area change for all lakes and lakes with area $\geq 0.02 \text{ km}^2$. (c) Number change for lakes in different size divisions. (d) Area change for lakes in different size divisions. (e) Number change for lake classification (moraine-dammed, bedrock-dammed and supraglacial lake). (f) Area change for lake classification (moraine-dammed, bedrock-dammed and supraglacial lake).

1988 and 2010, glacial lakes rapidly increased in area, especially the large moraine-dammed lakes ($\geq 0.02 \text{ km}^2$). During recent years, the area of moraine-dammed lakes larger than 0.02 km^2 remained relative stable, but there has been a slight decrease in area for small glacial lakes ($< 0.02 \text{ km}^2$).

The lakes are mainly distributed in the catchments of the northwestern and northeastern parts of the basin (Fig. 4). Most lakes showed an area enlargement between 1964 and 2017, especially the moraine-dammed lakes. The spatial patterns of lake-area changes were clearer between 1988 and 2000 than between 2000 and 2017.

4.2 Potentially dangerous glacial lakes (PDGLs)

Based on results given in previous GLOF hazard and risk assessments (Chen and others, 2007a; Wang and others, 2014, 2015), eight lakes with a significant area increase of $>150\%$ over the time period 1964–2017 (ranging from 162 ± 148 to $649 \pm 81\%$) were considered as PDGLs in this study (Table 4, bold; Fig. 4).

The continuous time series mapping of PDGLs showed that Galongco, Gangxico, Jialongco and Youmojanco have the largest areas and the greatest magnitude of increase in area (Fig. 5). Lake no. 7 displayed an abrupt area increase between 1964 and 1988, then tends towards stability. Cirenmaco, Lake no. 11 and Lake no. 12 also showed a continuous increase in area.

Ground observations and 3-D-views from Google Earth images (Fig. 6) show that these eight PDGLs are in direct or very near contact with their parent glaciers. Glacier

tongues detached from Cirenmaco, Jialongco, Galongco and Gangxico. These lakes are still fed by the glacier tongues located on steep slopes behind the lakes. This situation could result in GLOFs due to ice avalanching from the steep glacier tongues causing wave overtopping of the damming moraines. The lake basin topography for Youmojanco and Lake no. 11, is relatively flat, which means that as these lake-terminating valley glaciers calve and retreat, the lakes can continue to advance rapidly up-valley. Cawuqudenco has two connected glaciers, but the steep tongues of the lake-terminating glaciers prevent further lake development. Lake no. 12 has lost connection to the surrounding steep glacial remnants, and is bounded by steep bedrock slopes that prevent this lake from expanding further.

4.3 Glacier–lake interactions

The glaciers in the Poiqu River basin have been shrinking at a rate of $-0.52 \pm 0.05\% \text{ a}^{-1}$ between 1975 and 2000 (Fig. 7). After 2000, glacier shrinkage accelerated to a rate of $-0.72 \pm 0.08\% \text{ a}^{-1}$ between 2000 and 2015. The overall shrinking rate of glaciers between 1975 and 2015 was $-0.56 \pm 0.02\% \text{ a}^{-1}$ (Table 5).

Lake-terminating glacier ice-front positions for the eight PDGLs showed overall retreat, which was accompanied by an expansion of the glacial lakes (Fig. 7). The ice-front retreat ranged from 258 ± 61 to $1410 \pm 58 \text{ m}$ (Table 6). Reqiang Glacier (parent glacier of Gangxico) experienced the fastest retreat ($26.6 \pm 1.1 \text{ m a}^{-1}$). However, Galongco

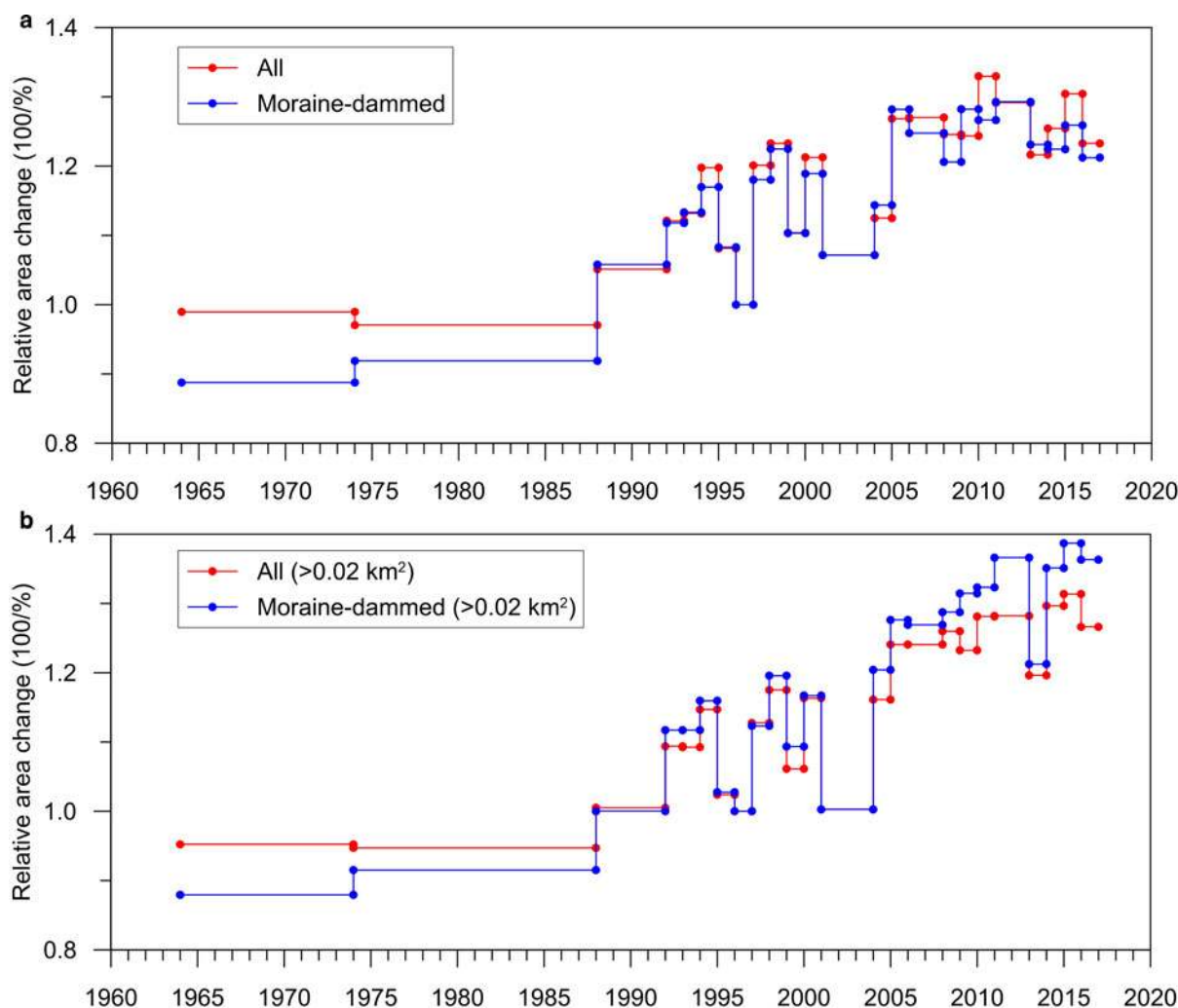


Fig. 3. Time series of relative lake area change from 1964 to 2017: (a) all glacial lakes and moraine-dammed lakes and (b) glacial lakes and moraine-dammed lakes (≥ 0.02 km²). The year 1996 is used as the reference year.

has the largest lake area expansion (0.08 ± 0.004 km² a⁻¹) which is slightly higher than the expansion of Gangxico (0.06 ± 0.003 km² a⁻¹), although the ice-front retreat was lower (-6.0 ± 1.4 m a⁻¹). This slow change could be due to topographic control and the low length to width ratio of the glacier.

The mean glacier surface velocities in the Poiqu River basin for 2013–2015 and 2016–2017 were 4.7 ± 3.2 and 5.0 ± 3.9 m a⁻¹, respectively (Fig. 8). The eight lake-terminating glaciers, however, flowed at a rate of ~ 10 m a⁻¹ (ranging from 8.2 ± 0.4 to 13.9 ± 0.4 m a⁻¹) (Table 6), which is for most glaciers significantly higher than the average of the study area. Five of the eight lake-terminating glaciers (Galongco, Gangxico, Jialongco, Cawqudenco and Cirenmaco) had increased surface velocities from 2016–2017 relative to 2013–2015 (Fig. 8). Two lake-terminating glaciers (Youmojanco and Lake no. 11) displayed variability in surface velocity between the two periods. The terminating glacier of Lake no. 11 had a decreased surface velocity, which could be the cause of the flat topography of the glacier terminus (Fig. 6).

The mean rate of glacier elevation change in the Poiqu River basin between 1974 and 2000 was 0.38 ± 0.18 m a⁻¹ (Fig. 9). In recent years (2000–2017), the glacier loss was similar, with an elevation lowering rate of -0.40 ± 0.14

m a⁻¹. During the whole period of 1974–2017, the mean rate of glacier thickness change was -0.39 ± 0.13 m a⁻¹.

The eight PDGL-terminating glaciers showed an overall thinning trend (Fig. 9), with the mean glacier thickness change rate from 1974 to 2000 being -0.65 ± 0.04 m a⁻¹, which indicates a greater melt than for the basin as a whole. These glaciers showed a higher thinning rate of -0.80 ± 0.05 m a⁻¹ from 2000 to 2017. Six of the eight glaciers showed increased loss rates in 2000–2017 compared with 1974–2000.

4.4 Glacier-bed overdeepening and future lake development

The average modelled ice thickness in the Poiqu River basin is ~ 150 m with a maximum thickness of ~ 310 m. Most of the thicker ice, including thick tongues (>150 m) are located in the northwestern and northeastern corners of the basin (Fig. 10). The modelled glacier bed overdeepenings indicates the formation of 74 new lakes (>0.01 km²) and expansion existing lakes, with a maximum depth of ~ 200 m. According to the modelling with GlabTop five lakes are predicted to be larger than 1 km² (a–e in Fig. 10c).

Two PDGLs (Galongco and Gangxico) show a limited potential for future expansion. On the other hand, assuming

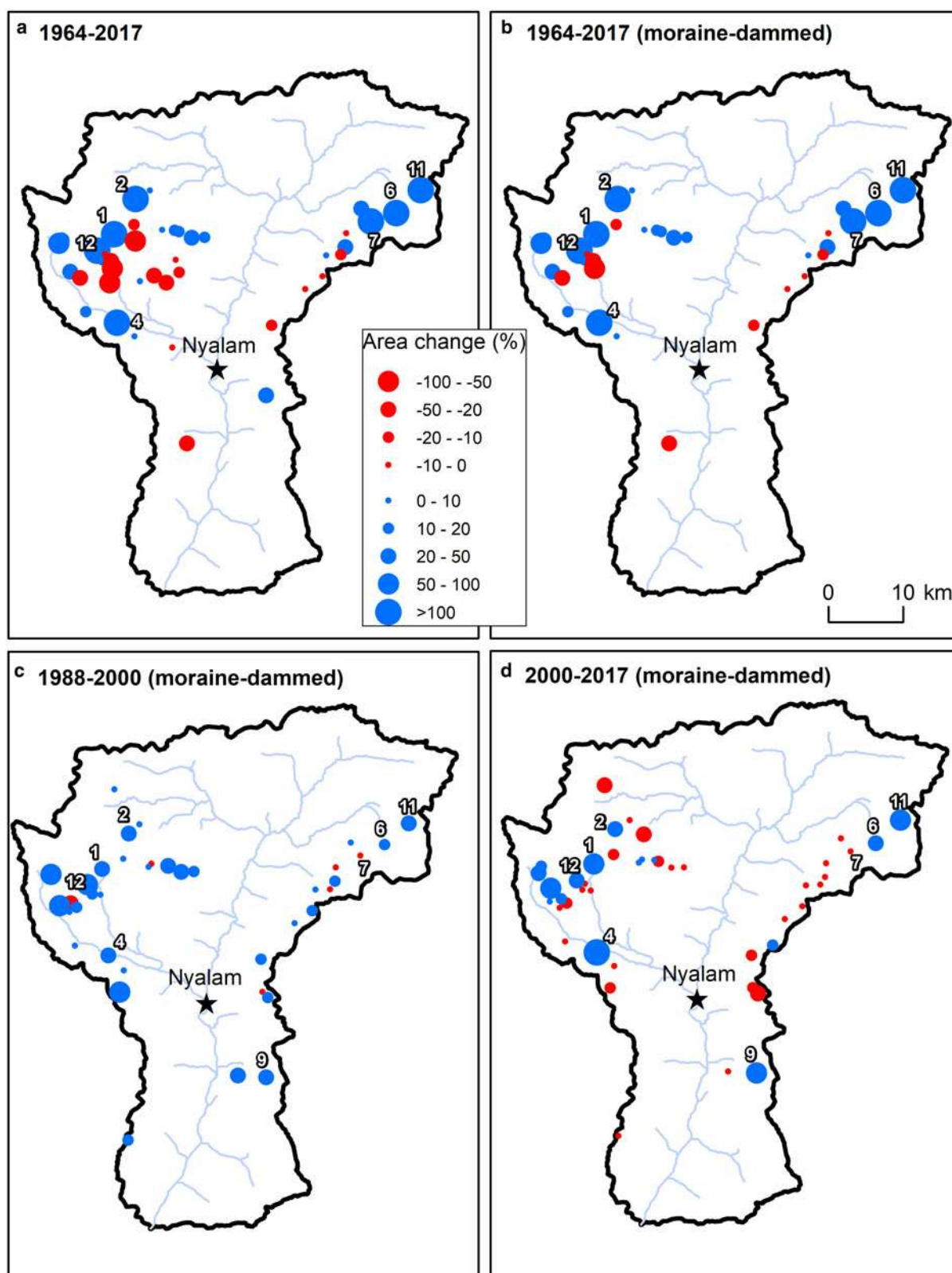


Fig. 4. Spatial patterns of lake area changes (lakes with area ≥ 0.02 km²) between 1964 and 2017: (a) area change between 1964 and 2017, (b) area change between 1964 and 2017 for moraine-dammed lakes, (c) area change between 1988 and 2000 for moraine-dammed lakes and (d) area change between 2000 and 2017 for moraine-dammed lakes. Lakes with a rapid increase in area (Table 4) are labelled by their ID.

that the expansion rates over the time period 1964–2017 slowdown, continue or accelerate, Youmojanco will continue expanding and could reach a maximum area of ~ 2.0 km², an increase of $\sim 240\%$ of its area in 2017. Depending on the scenario this maximum area could be reached by

~ 2110 (assuming an increased rate of 100%), 2150 (50%), 2200 (same rate) or 2400 (-50%). Lake no. 11 can potentially increase by a further $\sim 130\%$, reaching a size of ~ 0.7 km² by ~ 2060 (100%), 2080 (50%), 2100 (same rate) and 2200 (-50%).

Table 4. List of glacial lakes (≥ 0.02 km²) and their areas in 1964 and 2017 in the Poiqu River basin, central Himalaya. Only lakes for which data are available for both years are included. The lakes considered potentially dangerous are in bold type

ID	Lat. (° N)	Long. (° E)	Name	Elev. m a.s.l.	Area in 1964 km ²	Area in 2017 km ²	Area change %
1	28.32	85.84	Galongco	5067	1.00 ± 0.01	5.46 ± 0.23	447 ± 24
2	28.36	85.87	Gangxico	5212	1.30 ± 0.01	4.49 ± 0.18	245 ± 14
3	28.33	85.87	Gungco	5167	2.35 ± 0.01	2.07 ± 0.13	−12 ± 6
4	28.21	85.85	Jialongco	4376	0.08 ± 0.00	0.61 ± 0.06	649 ± 81
5	28.30	86.16	Paquci	5307	0.41 ± 0.01	0.59 ± 0.1	44 ± 23
6	28.35	86.23	Youmojanco	5348	0.16 ± 0.00	0.57 ± 0.07	252 ± 41
7	28.34	86.19	Cawuqudenco	5422	0.19 ± 0.00	0.56 ± 0.06	200 ± 35
8	28.18	85.92	Suannai	4355	0.48 ± 0.00	0.45 ± 0.05	−7 ± 11
9	28.07	86.07	Cirenmaco	4655	0.13 ± 0.07*	0.34 ± 0.04	162 ± 148
10	28.31	85.95	Xiahu	5227	0.22 ± 0.01	0.32 ± 0.06	47 ± 30
11	28.37	86.26		5544	0.04 ± 0.00	0.29 ± 0.04	608 ± 108
12	28.30	85.82		5080	0.05 ± 0.00	0.29 ± 0.03	456 ± 68
13	28.37	85.89	Yinraco	5242	0.28 ± 0.00	0.29 ± 0.06	2 ± 20
14	28.29	85.83	No name	5023	0.28 ± 0.00	0.27 ± 0.04	−4 ± 14
15	28.29	86.13	Taraco	5244	0.24 ± 0.00	0.24 ± 0.04	2 ± 19
16	28.26	85.92	Colungco	5106	0.33 ± 0.01	0.23 ± 0.07	−30 ± 21
17	28.32	86.16	Gangpuco	5549	0.23 ± 0.00	0.22 ± 0.04	−3 ± 17
18	28.30	86.15	Southhu	5346	0.18 ± 0.00	0.16 ± 0.04	−11 ± 22
20	28.25	86.10	No name	5189	0.16 ± 0.00	0.15 ± 0.02	−3 ± 15
21	28.32	85.91	Mabiya	5392	0.14 ± 0.00	0.15 ± 0.03	5 ± 18
22	28.32	85.93	Mulaco	5312	0.10 ± 0.00	0.12 ± 0.03	11 ± 27
25	28.27	85.78		5312	0.07 ± 0.00	0.1 ± 0.03	33 ± 35
26	28.32	85.92		5323	0.08 ± 0.00	0.09 ± 0.02	16 ± 23
28	28.29	85.83		5044	0.07 ± 0.00	0.08 ± 0.02	13 ± 25
29	28.19	85.87		4621	0.08 ± 0.00	0.08 ± 0.02	1 ± 24
32	28.31	85.97		5121	0.05 ± 0.00	0.06 ± 0.02	14 ± 30
34	28.29	85.84		4973	0.07 ± 0.00	0.06 ± 0.02	−21 ± 27
37	28.31	85.77		5595	0.04 ± 0.00	0.05 ± 0.03	35 ± 68
38	28.22	85.80		4748	0.05 ± 0.00	0.05 ± 0.02	13 ± 41
39	28.07	85.94		4529	0.06 ± 0.00	0.05 ± 0.01	−21 ± 22
42	28.27	85.93		5301	0.05 ± 0.00	0.04 ± 0.02	−15 ± 35
45	28.27	86.13		5551	0.04 ± 0.00	0.04 ± 0.02	−6 ± 46
46	28.31	85.77		5575	0.02 ± 0.00	0.04 ± 0.02	81 ± 83
47	28.27	85.80		5271	0.05 ± 0.00	0.04 ± 0.02	−20 ± 42
49	28.29	85.93		5141	0.03 ± 0.00	0.03 ± 0.01	0 ± 40
50	28.27	85.90		5251	0.05 ± 0.00	0.03 ± 0.02	−39 ± 33
55	28.13	86.05		4585	0.02 ± 0.00	0.03 ± 0.01	31 ± 53
56	28.35	86.18		5358	0.04 ± 0.00	0.05 ± 0.02	27 ± 63
57	28.33	85.91		5326	0.02 ± 0.00	0.03 ± 0.01	41 ± 57
58	28.21	86.06		4978	0.03 ± 0.00	0.03 ± 0.01	−16 ± 34
59	28.26	85.88		5214	0.03 ± 0.00	0.03 ± 0.01	4 ± 39
61	28.28	85.80		5377	0.02 ± 0.00	0.03 ± 0.01	39 ± 54
66	28.16	86.07		5167	0.02 ± 0.00	0.02 ± 0.01	3 ± 61
68	28.27	85.81		5383	0.02 ± 0.00	0.02 ± 0.01	30 ± 54
72	28.26	85.84		4976	0.04 ± 0.00	0.02 ± 0.01	−57 ± 22
74	28.35	85.91		5195	0.02 ± 0.00	0.02 ± 0.01	−15 ± 45
77	28.31	85.87		5281	0.04 ± 0.00	0.02 ± 0.01	−58 ± 24
82	28.30	85.88		5273	0.02 ± 0.00	0.01 ± 0.01	−22 ± 48
95	28.28	85.87		5197	0.02 ± 0.00	0.01 ± 0.01	−44 ± 41
96	28.27	85.87		5295	0.02 ± 0.00	0.01 ± 0.01	−35 ± 42
98	28.28	85.84		4964	0.02 ± 0.00	0.01 ± 0.01	−63 ± 30

* Area for Cirenmaco (no. 9) in 1988 is used, as the imagery available for the pre-1988 period did not cover this lake.

5. DISCUSSION

5.1 Glacier–lake interactions and potential GLOF threats

The majority of glaciers in the Himalaya are retreating and losing mass at an accelerating rate, especially in the period after 2000, which is consistent with atmospheric warming and decreasing precipitation (Bolch and others, 2012; Yao and others, 2012; Azam and others, 2018). The main exception to this trend is the nearly balanced mass budget of glaciers in the Karakoram since the 1970s (Bolch and others,

2017; Zhou and others, 2017) and a significant acceleration of glacier mass loss since ~2000 in Lahaul-Spiti, western Himalaya (Azam and others, 2018; Mukherjee and others, 2018). Glaciers in the mid-east Himalaya are more sensitive to climate change than those in the western Himalaya and their rates of decline are greater (Azam and others, 2018). These contrasting spatial patterns of glacier mass balance result in faster glacial lake growth in the central Himalaya compared with the western part (Gardelle and others, 2011; Wang and others, 2014). Glacier–lake interaction has also been observed in southeast Tibet (Liu and others,

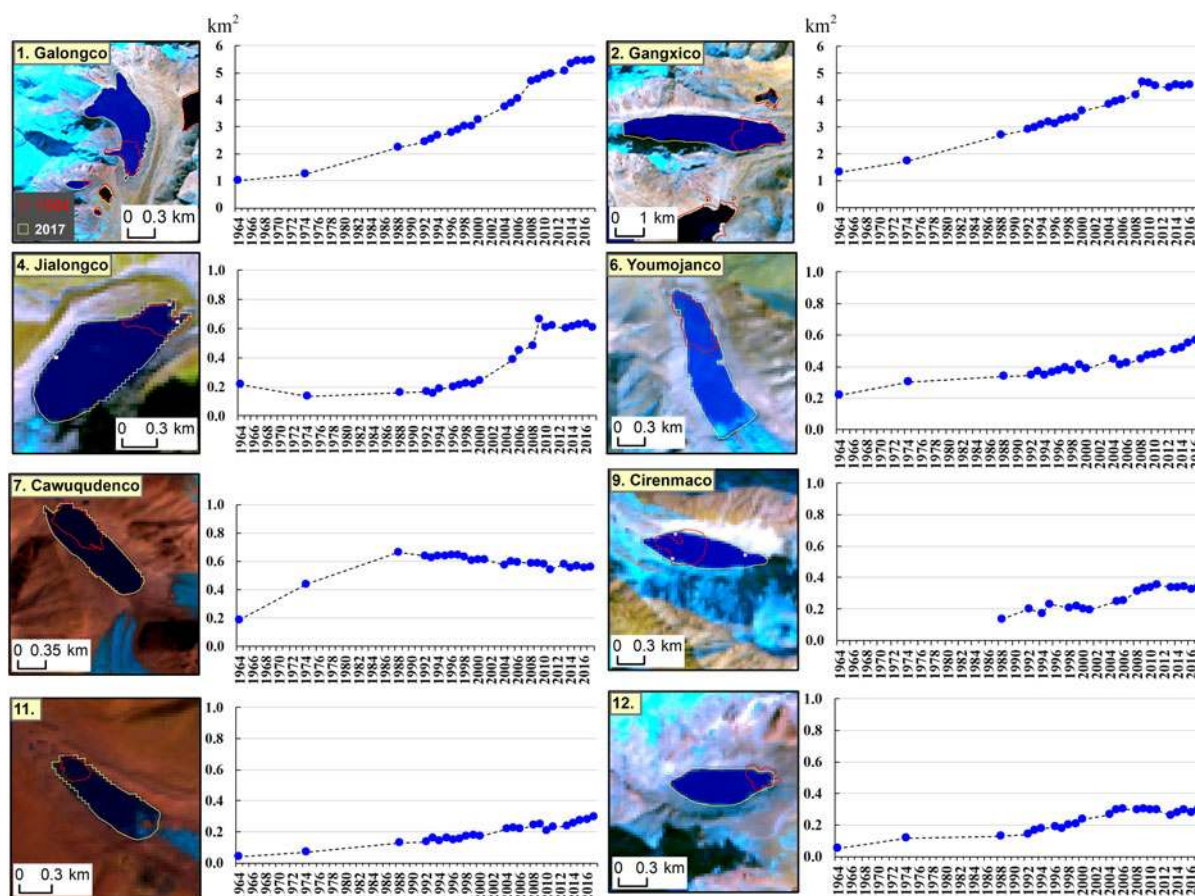


Fig. 5. Time series of area for eight PDGLs with rapid area change between 1964 and 2017.

2016), in the central Himalaya (Jiang and others, 2018; King and others, 2018) and Sikkim Himalaya (Basnett and others, 2013). These studies have shown that lake-terminating glaciers retreat faster than land-terminating glaciers (Basnett and others, 2013; Liu and others, 2016; Jiang and others, 2018). The wide distribution of glacial lakes in the Himalaya (Zhang and others, 2015) could have accelerated the retreat of their mother glaciers in other regions of the Third Pole.

Eight lakes are considered as potentially dangerous (Chen and others, 2007b; Wang and others, 2014, 2015), show rapid rates of expansion over recent decades. Two of them (Cirenmaco and Jialongco) have a historical record of GLOFs (Table 2). Triggered by external factors such as strong precipitation, extreme temperatures, ice avalanche and earthquake, outbursts from these lakes pose a significant threat to downstream communities. As lake-terminating glaciers further retreat, lakes such as Youmojanco and Lake no. 11 can expand rapidly up-glacier until they have reached their possible maximum extents bounded by topography. For such situations, the GLOF hazard potential can continue to increase into the future, as potential flood magnitudes increase, and as the lakes eventually advance towards steep mountain headwalls from which ice or rock avalanches become more likely (Allen and others, 2016).

5.2 Glacier and lake variation in response to climate change

Temperature in the central Himalaya has increased significantly since the 1960s (Fig. S6a). The warming rate observed

at the Nyalam station was $0.024 \pm 0.004 \text{ } ^\circ\text{C a}^{-1}$ ($p < 0.01$) between 1967 and 2017 (Fig. S6c). The increasing temperatures have probably driven the accelerated melting of glaciers as elsewhere (King and others, 2017; Wang and others, 2017; Xiang and others, 2018). A heterogeneous pattern of precipitation for the 1960–2013 period was found in the central Himalaya (Fig. S6b). The precipitation observed at the Nyalam station showed a decreasing trend with a rate of $-0.76 \pm 1.34 \text{ mm a}^{-1}$ (although not statistically significant) (Fig. S6d). In addition, the precipitation for the entire Himalaya over the past few decades has a decreasing trend (Yao and others, 2012). This trend suggests that it is glacier melting and calving that has played the dominant role in driving the observed lake enlargement.

5.3 Future lake development

In the most recent decade (2010–2017), the glacial lake area ($\geq 0.02 \text{ km}^2$) expanded by $\sim 1.1\%$, which is significantly smaller than changes during 1970s–2010 (also reported by Wang and others (2014) and Chen and others (2007b)). The rate of increase slowed down after 2010, indicating that many lakes have reached their maximum extent bounded by an abrupt steeping of topography. For example, the expansion of Cirenmaco, which is prone to GLOFs (Wang and others, 2018), has stopped expanding after 2010, as the lake has reached a steep topographic step and cannot expand further upslope (Fig. 6). This means that the current volume of this dangerous lake can be used to reasonably estimate maximum flood magnitudes that could also

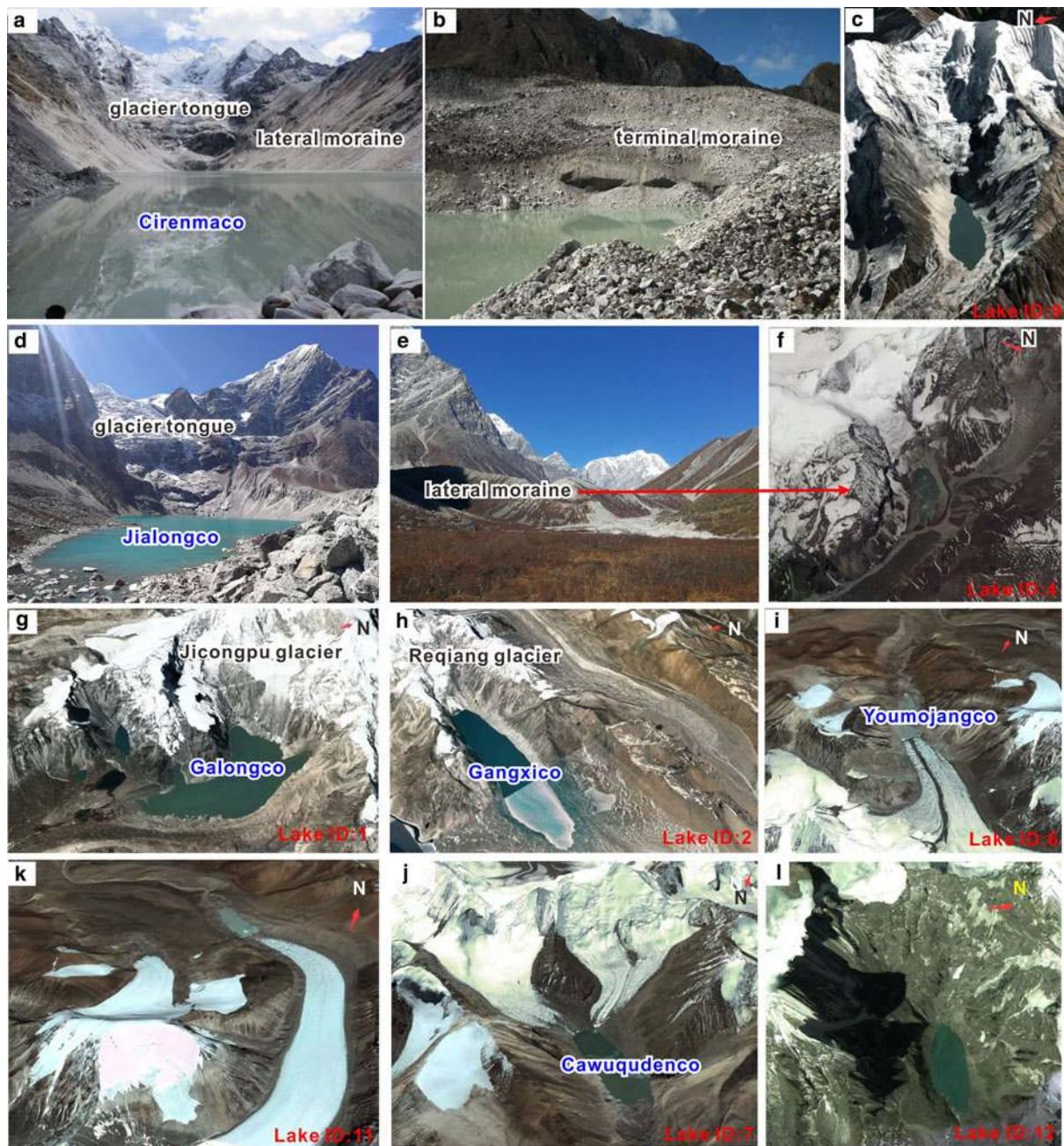


Fig. 6. Ground and 3-D views of eight PDGLs. (a, b) Photos for Cirenmaco (taken by W. Wang on 21 September 2012); (c) Cirenmaco from Google Earth image on 25 November 2016. (d, e) Photos for Jialongco (taken by G. Zhang on 18 October 2017); (f–i) Jialongco, Galongco, Gangxico, Youmojangco, Lake no. 11 from Google Earth images on 5 June 2015, 10 October 2017, 10 October 2017, 01 November 2012 and 01 November 2012, respectively. (k–l) Cawuquenco and Lake no. 12 from Google Earth images on 01 November 2012 and 28 November 2009, respectively. Source of Google Earth images is from DigitalGlobe. The numbers displayed in red refer to the ID of the lakes listed in Table 4.

occur in the future, reducing uncertainty in future risk reduction strategies relating to this lake.

Future lake developments were estimated using GlabTop (Linsbauer and others, 2016). The bed overdeepenings at slow flowing termini could be slightly overestimated by GlabTop as the flow of glaciers is not considered in this model (Pieczonka and others, 2018). Uncertainties in the overdeepenings can result from the resolution and offset between SRTM DTM and the glacier outlines. The eight PDGLs considered in this study are fed from debris-free glaciers. Typically such lakes will have longer lifetimes, as sediment delivery into lakes from debris-free glaciers is less,

although higher rates of erosion and sediment delivery may occur under the effects of rapid atmospheric warming (Linsbauer and others, 2016). Timelines for future lake expansion given in this study are rough estimates only, because of uncertainties in future climate scenarios and glacier dynamics. Nonetheless, these results highlight the need for decision-makers to consider long-term planning, and risk reduction strategies must consider that future flood volumes may for some lakes far exceed historical dimensions (Haerberli and others, 2016).

Warming of 2.1 ± 0.1 °C by the end of 21st century could occur in the high mountains of Asia with the projected global

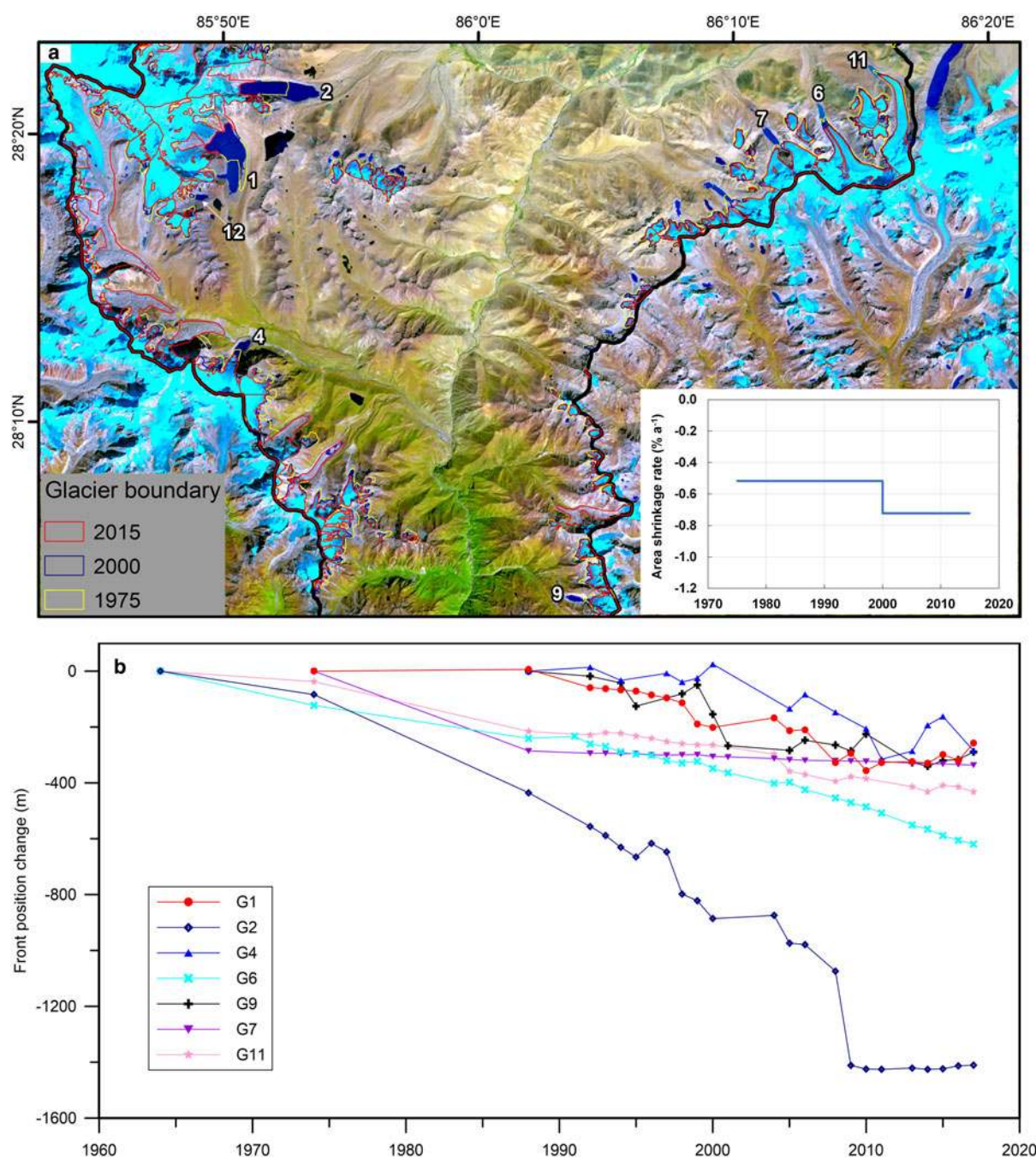


Fig. 7. Glacier area and glacier-front position changes. (a) Glacier area change in the Poiqu River basin from 1975 to 2015. The inset shows the shrinkage rate of glacier area in the whole Poiqu River basin. (b) Ice front changes for the PDGLs.

temperature rise of 1.5 °C (Kraaijenbrink and others, 2017). Under this scenario, approximately half of the glacier ice in the central Himalaya is projected to disappear (Kraaijenbrink and others, 2017). As demonstrated for the

Poiqu River basin, this future loss of glacier mass will almost certainly be associated with increased glacial lake area, and a corresponding increasing threat to villages downstream.

Table 5. Changes in glacial lake area, glaciers and related climatic factors in the Poiqu River basin, central Himalaya between 1974 and 2017. Lakes with areas of ≥ 0.02 km² are selected

Study period	Lake area change % a ⁻¹	Glacier area change % a ⁻¹	Glacier surface elevation change m a ⁻¹	Temperature change °C a ⁻¹	Precipitation change mm a ⁻¹
1974–2000	2.12 ± 0.14	-0.52 ± 0.05	-0.38 ± 0.18	0.02 ± 0.01	-3.69 ± 4.13
2001–2017	1.35 ± 0.20	-0.72 ± 0.08	-0.40 ± 0.14	0.003 ± 0.019	-0.22 ± 4.91
1974–2017	2.11 ± 0.04	-0.56 ± 0.02	-0.39 ± 0.13	0.024 ± 0.004*	-2.14 ± 1.69

* $p < 0.01$.

Table 6. Rates of changes for PDGLs and the associated lake-terminating glaciers between 1964 and 2017

Lake ID	Lake name	Rate of change in lake area $\text{km}^2 \text{a}^{-1}$	Rate of change in glacier ice-front position m a^{-1}	Rate of change in glacier velocity* m a^{-1}	Rate of change in glacier elevation (m a^{-1})
1	Galongco	0.084 ± 0.004	-5.99 ± 1.42	8.25 ± 0.13	-0.47 ± 0.04
2	Gangxico	0.060 ± 0.003	-26.61 ± 1.10	9.19 ± 0.25	-1.28 ± 0.07
4	Jialongco	0.010 ± 0.001	-9.84 ± 3.70	10.20 ± 0.45	-0.41 ± 0.06
6	Youmojanco	0.008 ± 0.001	-11.69 ± 1.15	13.94 ± 0.39	-0.68 ± 0.05
7	Cawuqudenco	0.007 ± 0.001	-7.82 ± 1.15	9.21 ± 0.24	-0.79 ± 0.05
9	Cirenmac	0.007 ± 0.002	-9.98 ± 2.62	8.17 ± 0.43	-0.32 ± 0.07
11		0.005 ± 0.001	-8.16 ± 1.53	12.24 ± 0.28	-0.39 ± 0.03
12		0.005 ± 0.001		11.33 ± 2.46	-1.36 ± 0.37

* Glacier velocities for eight lake-terminating glacier basins in 2016–2017 are used.

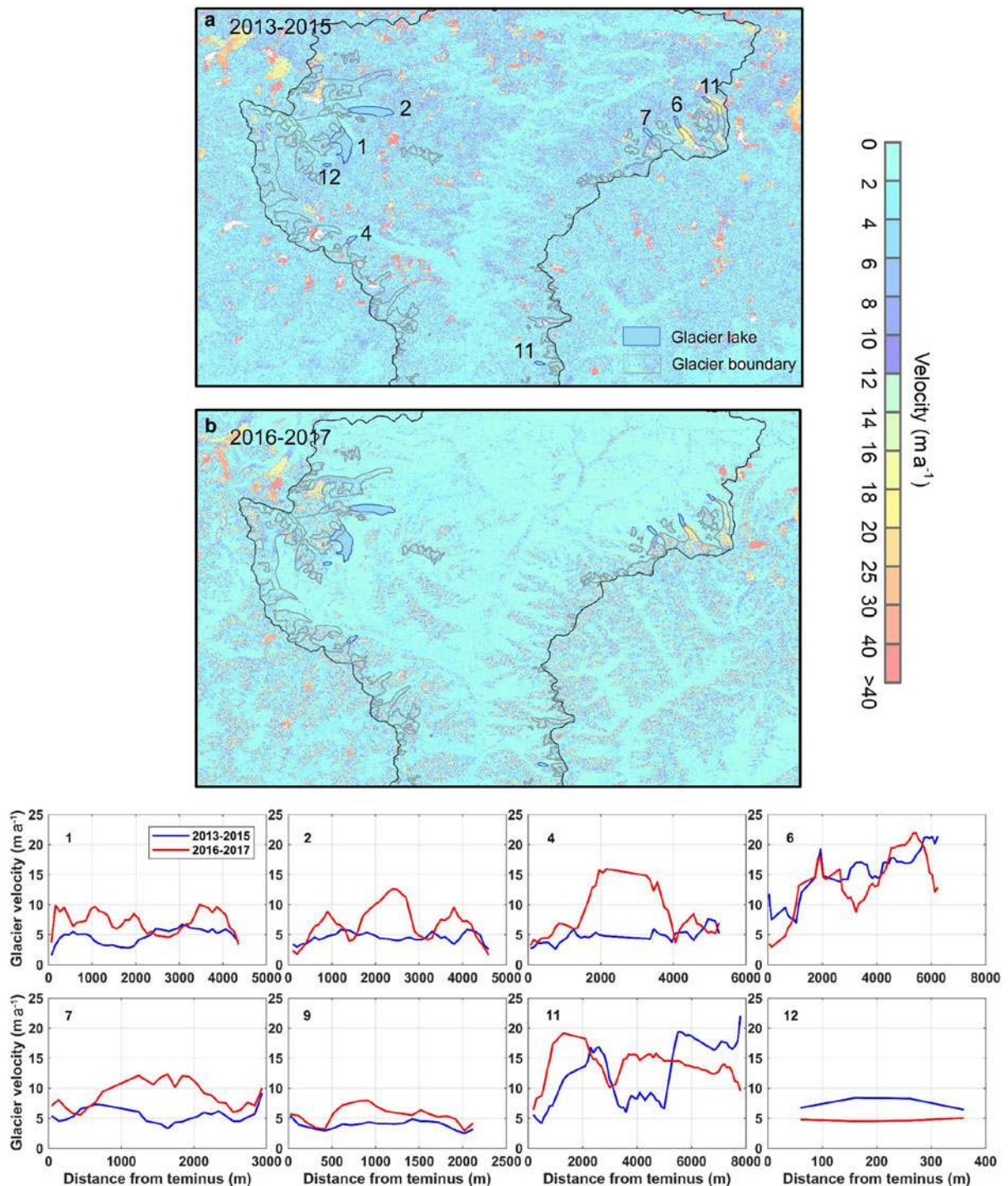


Fig. 8. Glacier surface velocities and changes in the Poiqu River basin: (a) 2013 to 2015 velocity stack and (b) 2016 to 2017 velocity stack. The lower panels show the surface velocity changes of eight PDGLs in the 2016–2017 velocity stack compared with the 2013–2015 velocity stack.

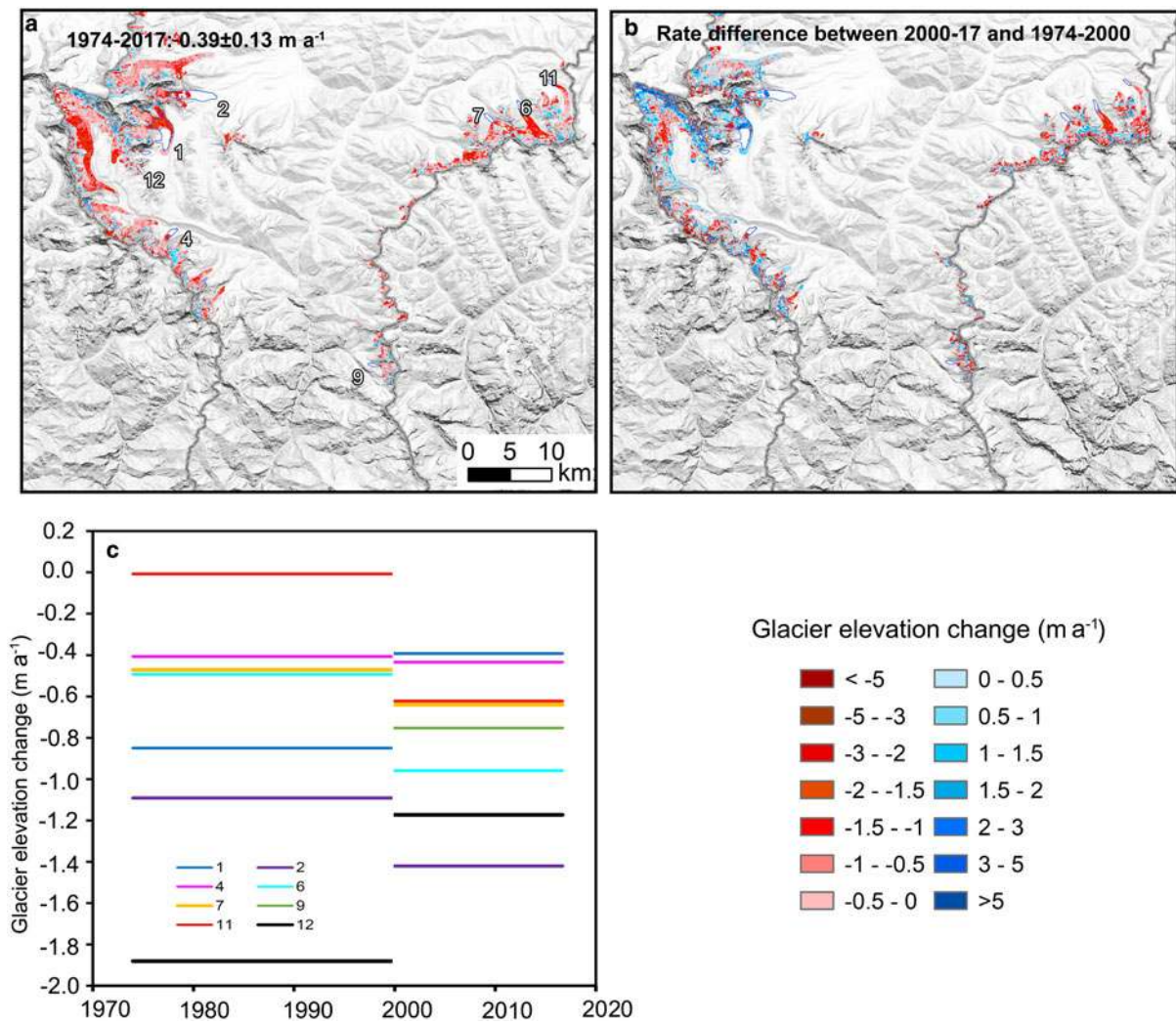


Fig. 9. Glacier elevation changes in the Poiqu River basin. (a) Glacier elevation change in 1974–2017. (b) Rate difference of glacier elevation change between 2000–17 and 1974–2000. (c) Changes in surface lowering for eight lake-terminating glaciers from 1974 to 2017.

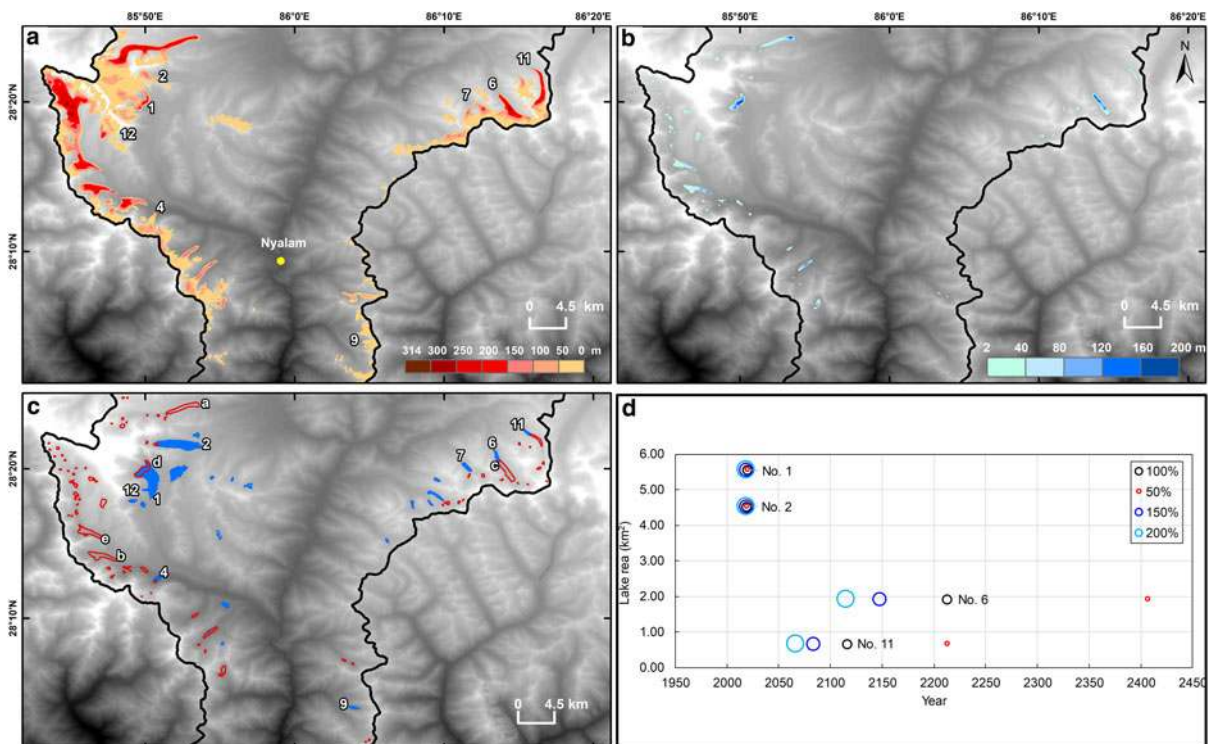


Fig. 10. Future glacial-lake development. (a) Modelled ice thickness using GlabTop. (b) Modelled bed overdeepenings. (c) Potential future new lakes or expansion of lake boundaries. Five new lakes larger than 1 km^2 are labelled (a–e). (d) Future lake development in scenarios with an increase rate of -50% , same rate, 50% and 100% (relative to rates measured from 1964 to 2017).

6. CONCLUSIONS

The Poiqu river basin is prone to GLOFs, and recent and future lake development should be carefully monitored to improve the prediction of such events, and to estimate likely flood volumes. We extended the record of glacial-lake evolution to before the 1970s, by using high resolution KH-4A images from 1964, to the present, using Landsat 8 data of 2017. Specifically, we examined lake area changes in detail using 25 intervals between 1964 and 2017. The dense time series of lake-area observations helps to examine shifts in their different development phases, and the evolution of lakes considered as potentially dangerous. The total area of glacial lakes between 1964 and 2017 has greatly increased, predominantly from large lakes (area $\geq 0.02 \text{ km}^2$) and moraine-dammed lakes.

Monitoring lake-terminating glacier changes is important for evaluating lake expansion and related GLOF potential, and is lacking in previous studies from this important trans-boundary basin. Here, we revealed a mean change rate of $-0.56 \pm 0.02\% \text{ a}^{-1}$ in glacier areas and of $-0.39 \pm 0.13 \text{ m a}^{-1}$ in glacier thickness over the whole Poiqu River basin for the period 1974–2017. Larger ice-front position retreat (258 ± 61 to $1410 \pm 58 \text{ m}$), shrinkage rate ($-0.62 \pm 0.01\% \text{ a}^{-1}$) and thinning rates ($-0.71 \pm 0.05 \text{ m a}^{-1}$) are found for eight PDGLs.

Modelling of future glacial-lake developments reveals 74 potential new lakes ($>0.01 \text{ km}^2$) and expansion of lake boundaries. Because of topographic controls, four of the eight potentially dangerous lakes have already reached their maximum extents and have stopped expanding, even though their parent glaciers are still retreating. Two lakes should soon reach their maximum extents; and the remaining two will continue to expand to reach their maximum topographically-controlled extents by ~ 2110 – 2400 (Youmojanco) and 2060–2200 (Lake no. 11). This wide range of dates encompasses different future expansion scenarios, considering slowdown or acceleration of current expansion rates.

The state-of-the-art evaluation of glacier–lake interactions in the Poiqu River basin presented here emphasises that the examination of coupled glacier and lake change is necessary to understand how catchment scale processes are evolving. Beyond the hazard potential from the eight PDGLs considered in this study, it should also be recognised that rapidly evolving glacial lakes can represent opportunities, as attractive landscape features for tourism, and as a water resource.

SUPPLEMENTARY MATERIAL

The supplementary material for this article can be found at <https://doi.org/10.1017/jog.2019.13>

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