Towards understanding various influences on mass balance of the Hoksar Glacier in the Upper Indus Basin using observations

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Mass balance is a good indicator of glacier health and sensitivity to climate change. The debris-covered Hoksar Glacier (HG) in the Upper Indus Basin (UIB) was studied using direct and geodetic mass balances. During the 5-year period from 2013 to 2018, the glacier’s mean in situ mass balance (MB) was $-0.95 \pm 0.39$ m w.e. a$^{-1}$. Similarly, the glacier’s mean geodetic MB from 2000 to 2012 was $-1.20 \pm 0.35$ m w.e. a$^{-1}$. The continuously negative MB observations indicated that the HG is losing mass at a higher rate than several other Himalayan glaciers. The glacier showed increased mass loss with increasing altitude, in contrast to the typical decreasing MB with increasing elevation, due to the existence of thick debris cover in the ablation zone, which thins out regularly towards the accumulation zone. Rising temperatures, depleting snowfall and increasing black carbon concentration in the region, indicators of climatic change, have all contributed to the increased mass loss of the HG. During the lean period, when glacier melt contributes significantly to streamflow, the mass loss of glaciers has had a considerable impact on streamflow. Water availability for food, energy, and other essential economic sectors would be adversely affected, if, glaciers in the region continued to lose mass due to climatic change. However, long-term MB and hydro-meteorological observations are required to gain a better understanding of glacier recession in the region as climate changes in the UIB.

Outside the polar regions referred to as ‘the third pole’, the Himalaya has favorable climatic and topographic setting for hosting a large number of glaciers. The snow and glacier melt from the third pole contributes significantly to streamflow of the major Himalayan rivers, sustaining irrigation, hydropower, and a variety of other water-related activities in the region and beyond4–12. Therefore, research into a vast number of glaciers in the region continues to focus on their status, dynamics, hydrological significance and their responses to climate change and environmental pollution13–15. The mass balance of Indian Himalayan glaciers is largely negative with a recent increase in mass loss16,17. Because most glaciers in the Himalaya are small, they have a higher rate of mass loss. Several studies have found spatial variation in glacier mass loss across the Himalaya18–20. The Kashmir and the Lahaul-Spiti glaciers in the western Himalaya have experienced the highest relative mass loss18,21. The glaciers in the central and eastern Himalaya have comparatively experienced lower rates of mass loss22,23. However, to a few studies, glaciers in the Karakoram region are more or less in a stable state and a few glaciers are even advancing or surging24,25.

Glaciers in the Upper Indus Basin (UIB) are important because glacier-melt accounts for a major component of the streamflow and supports agriculture, water supply, energy generation and tourism, all of which are important sectors of the economy in the basin26,27. Glaciers in the UIB, like those elsewhere in the Himalaya, have experienced significant recession and mass loss in recent decades28–30. Several studies have shown that glaciers in the UIB have receded since the end of the Little Ice Age30,31. Recent research has also revealed that some of the glaciers in the basin may be melting at a faster rate in recent decades32,33.

Glacier MB is the most reliable metric for assessing the health of a glacier and its response to climate change7,22,23. However, studying glacier MB in the Himalaya is difficult due to a combination of adverse factors such as rugged topography, remoteness, security concerns, logistical constraints, and a lack of hydro-meteorological observations24,25. As a result, there are only a few mass balance records for Himalayan glaciers7. Despite a clear indication of climate change impacts on glaciers, no other glacier in the Kashmir Himalaya has been

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features present in the Hoksar glacial valley, which indicate past extents of the HG. Centimeters and large boulders exceeding half a meter in size. Figure S1 depicts a few of the glacio-geomorphic area, with varying debris thickness made up primarily of rock fragments measuring a few millimeters to tens of meters. The glacier is covered with debris, which currently covers around 80% of the ablation area and has a mean elevation of ~4000 m a.s.l. It is oriented north-west with a slope of 20°–30°, and drains into the Lidder river, which is one of the tributaries of the Jhelum in the UIB. The HG's current snout elevation is 3680 m. The central flowline length of the glacier measures ~2.2 km with width ranging from ~300 to 1200 m. The glacier is covered with debris, which currently covers around 80% of the ablation area, with varying debris thickness made up primarily of rock fragments measuring a few millimeters to tens of centimeters and large boulders exceeding half a meter in size. Figure S1 depicts a few of the glacio-geomorphic features present in the Hoksar glacial valley, which indicate past extents of the HG.

The Hoksar Glacier

The Hoksar Glacier (HG), a small valley type glacier with an area of ~1 km², is located between 34°10′–34°11′ N and 75°17′–75°18′ E on the northern slopes of the Greater Himalayan range in the Jhelum sub-basin, a major tributary of the Indus (Fig. 1). The HG has a mean elevation of ~4000 m a.s.l, is oriented north-west with a slope of 20°–30°, and drains into the Lidder river, which is one of the tributaries of the Jhelum in the UIB40. The HG's current snout elevation is 3680 m. The central flowline length of the glacier measures ~2.2 km with width ranging from ~300 to 1200 m. The glacier is covered with debris, which currently covers around 80% of the ablation area, with varying debris thickness made up primarily of rock fragments measuring a few millimeters to tens of centimeters and large boulders exceeding half a meter in size. Figure S1 depicts a few of the glacio-geomorphic features present in the Hoksar glacial valley, which indicate past extents of the HG.

Materials and methods

Datasets used.

Several datasets were used to assess the mass change of the HG, which are briefly discussed below and listed in Table 1.

Remote sensing data.

Geodetic mass balance of the HG was estimated using two Digital Elevation Models (DEMs), the Shuttle Radar Topography Mission (SRTM) DEM and TanDEM-X DEM, from 2000 to 2012. The SRTM DEM was acquired in two frequencies (X-band and C-band) between 11 and 22, February 2000. In this research, the non-void filled version of the SRTM DEM with a spatial resolution of 90 m was used. The TanDEM-X mission is a TerraSAR-X-Add-on for Digital Elevation Measurements, which was acquired between 2010 and 2015 and was time-stamped as 2012 in this study. The TanDEM-X 90 m DEM, which was used in this study, is a product variant of the global DEM with vertical accuracy up to 2 m41.

Climatic data.

Climate data (1980–2018), namely daily precipitation and temperature, were obtained from the nearest Indian Meteorological Department (IMD) observatory located at Pahalgam in the Lidder valley, which is approximately 19 km away (aerial distance) from the glacier site (Fig. 1), and were used to determine the trends in the time series during the observation period.

Black carbon data.

The portable AE-42 Athalometer (Magee Sci., Inc., Berkeley, CA, USA) 33 was used to measure black carbon (BC) concentration on the ablation zone of the HG during one of the field expeditions from 21 to 24 September 2013 for roughly 5–7 h every day. Furthermore, the long-term variation in BC concentration in the Lidder valley was determined using the area-averaged BC concentration from 1980 to 2017, which was obtained from the Modern-Era Retrospective Analysis for Research and Applications (MERRA).

Field-observed data.

The glacier melt and accumulation measurements were carried out during the observation period at different altitudinal ranges of the HG using stakes and snow pit/probes, respectively. We also used the Differential Global Positioning System (DGPS) to monitor the snout position and altitude over the course of the study from 2013 to 2018.

Methods.

The purpose of the research was to use diverse approaches to understand and quantify the mass wastage of the HG and the reasons behind it. The methodology adopted to achieve the objective of the present study is described in the following sub-sections.
Figure 1. (a) Map showing the location of the Kashmir valley (blue color boundary) with respect to India country map, Lidder valley (dotted dark blue color) and other key landmarks including the Hoksar Glacier (dotted yellow color) and location of the meteorological station at Pahalgam (star). (b) Satellite imagery of the Hoksar Glacier showing the contour lines generated from SRTM DEM (dotted pink color), distribution of debris-cover, location of stakes (green diamond boxes), accumulation pits (blue square boxes), and (c) Cumulative hypsometric curve of the HG, two green dots depict the glacier area with a thick debris-cover. Maps (a,b) were generated in ArcGIS version 10.4.1 (https://www.esri.com) by utilizing the imageries provided by National Geographic, Esri and Planet Labs dated 23rd Sep 2019, respectively, (c) hypsometric curve was plotted using Microsoft office excel 2019.

| Dataset                  | Spatial/temporal resolution | Acquisition date | Source                                      |
|--------------------------|----------------------------|------------------|---------------------------------------------|
| SRTM DEM                 | 90 m                       | 11–22 Feb 2000   | http://srtm.cgiar.org                       |
| TanDEM-X DEM             | 90 m                       | December, 2010–January, 2015 | https://download.geoservice.dlr.de/TDM90/ |
| Climate data             |                            |                  |                                             |
| Temperature and precipitation | Station data/daily data  | 1980–2018        | IMD Pahalgam                                |
| Non-climatic data        |                            |                  |                                             |
| Black carbon             | 0.5° × 0.625°              | 1980–2017        | MEERA v2                                    |
| Black carbon             | 5 min                      | 21–24 Sep 2013   | In-situ                                     |

Table 1. Description of the datasets used in this study.
Glacier mass balance approaches. Glacial mass balance is calculated by several methods, viz., glaciological, geodetic, AAR, hydrological, empirical model, and gravitational. However, in this study, we used glaciological, and geodetic methods to calculate the mass balance of the HG to gain insight into the recent glacier mass changes and the controlling factors thereof.

Glaciological method. The glaciological mass balance method is an in-situ measurement of accumulation and ablation over the entire glacier during a hydrological year that provides a direct indication of mass change. In this study, glacier melting was measured using a network of bamboo stakes anchored in the ablation zone of the HG. Whereas, snow accumulation was accounted for using several snow pits dug into the accumulation zone of the glacier complemented by a number of snow probes. The annual glacier-wide mass balance, $b_n$, is calculated as follows:

$$b_n = \frac{1}{S} \sum b_i s_i$$

where $b_i$ is the MB of the altitudinal area ($s_i$) obtained from the corresponding stake readings or net accumulation measurements and $S$ is the total glacier area.

Mass balance measurements on the HG began in the year 2013 with the objective of creating a long-term mass balance dataset for the glacier to investigate glacier-climate interactions and the influence of other controlling factors on glacier response like debris, etc. The mass balance was calculated using 14 stakes and 3 snow pits (supplemented by several snow probes), positioned over the ablation and accumulation zones respectively (Fig. 1) and the glacier-wide mass balance was obtained by applying an integration over the entire glacier surface. The number of stakes remained constant throughout the observation, however, the number of accumulation pits increased from one in 2013 to 2014 to three in subsequent years. The number of snow pits is limited by the complexity of the accumulation area as well as other logistical considerations. For snow depth and density measurements, 3–5 snow pits, supplemented by snow probes, are usually recommended. However, in this study, a large number of snow probes placed across the accumulation zone augmented the data from the snow pits. All three snow pits were located on the right side of the accumulation area. Though, there should have been at least one snow pit on the left side of the accumulation area. It was not possible to locate one there due to the complex terrain, crevasses and logistical constraints. Using DGPS, the precise location of each stake and snow pit, and snow probe was determined. The hydrological year extends from October to September in the Kashmir Himalaya. The mass balance measurements were accordingly carried out towards the end of September or the beginning of October every year during the annual glacier field expeditions from 2013 to 2018. Steam-driven Heucke ice drill was used to drill 5–6 m deep ablation stakes. For volume to mass conversion, the average density of the annual layer of snow/firn and ice was measured altitude-wise from the accumulation area (550 kg m$^{-3}$) and ice density of 900 kg m$^{-3}$ for the ablation zone of the glacier was used from literature.

To assess the influence of non-climatic factors on glacier mass balance such as debris-cover and thickness variability, the mass change measured at stakes located in the clean and debris-covered portions of the glacier were analyzed separately. The supra-glacial debris extents were mapped from the satellite images and validated on the ground (110 sites), while the debris thickness was measured manually on the ground around each stake (point specific) and averaged over the observation period.

Geodetic method. Geodetic mass balance approach involves comparing two glacier surface elevation datasets from topographic maps or digital elevation models to determine the volume change over the considered time span. By applying the density of snow/ice at different parts of the glacier, the volume change can be converted into mass change. The geodetic mass balance, $B_{geo}$, within the time period $\Delta t$ is calculated by multiplying the glacier volume change ($\Delta V$) by the mean estimated glacier density ($\rho$) as follows:

$$B_{geo} = \Delta V \times \rho$$

The participating DEMs in this study were corrected for vertical and horizontal off-sets using the universal co-registration algorithm. The algorithm employs a slope normalized cosine relationship between aspect and elevation change to minimize the offsets as follows:

$$\frac{dH}{\tan(\alpha)} = a \cdot \cos(b - \Psi) + C$$

$$C = \frac{\overline{dH}}{\overline{\alpha}}$$

where $\alpha$ is slope; $\Psi$ is glacier aspect; and the variables $a$, $b$, and $c$ are the magnitude, direction, and mean bias, respectively. $dH$ and $\overline{dH}$ is elevation difference and overall elevation bias, respectively. The minimization process was repeated till either the magnitude of shift was <0.5 m or the normalized median absolute difference (NMAD) on off-glacier terrain was <5% than the previous pass. The voids in the DEMs were filled using the Natural Neighbour (NN) algorithm.

The DEMs were corrected for radar penetration bias before generating the DEM difference map at a pixel level. The relative penetration bias was calculated as a function of altitude. Hoksar Glacier boundary was used to calculate the mean glacier elevation changes between 2000 and 2012 and the volume changes thereof. Using the density conversion factor of 850 kg m$^{-3}$, the volume changes were then converted into glacier mass changes.
Equilibrium line altitude (ELA) changes. ELA is the average altitude at which accumulation exactly balances ablation over a period of 1 year. ELA of the HG was estimated each year using regression analysis of the altitudinal mass balance measurements taken throughout the observation period55. ELA is a good short-term indicator of glacier health56,57 and it has been used to calculate the mass balance of a glacier for which historical data is available64. The ELA changes were used as corroborating evidence for the observed mass losses of the HG.

Climate data analysis. Temperature and precipitation records were analyzed from 1980 to 2018 to determine the trends and demonstrate a link between changing climatic variables and glacier mass loss. The daily climate data used in this study were obtained from the Indian Meteorological Department (IMD) Pahalgam station which is the nearest observatory to the glacier. The data was checked for quality, consistency, and gaps. It is important to note that the data gaps were minimal-less than 1%. Therefore, we do not need to correct the data. The significance of the trends in the meteorological parameters was determined using the Mann–Kendall statistical nonparametric test58,59. Temperature lapse rates (TLRs) are commonly used to demonstrate the relationship between temperature and glacier mass loss in absence of the meteorological observations near or on the surface of a glacier60. The temporally and spatially variable TLRs used in this study were adopted after Romshoo and others61. At the HG altitude, the extrapolated temperatures indicated mean minimum and maximum temperatures of −4.51 °C and −1.42 °C, respectively.

Black carbon data analysis. The AE-31 series Aethalometer, used in this study, records optical measurements at seven different wavelengths ranging from 370 to 950 nm33. BC concentrations were measured at 5-min intervals. The data was retrieved and analyzed using a spreadsheet program to investigate BC patterns at the glacier site during September, 2013 field expedition. Furthermore, trend analysis of the area-averaged MERRA reanalysis of BC concentration data from 1980 to 2017 was used to determine the changes in BC concentration in the Lidder valley. We removed a few outliers observed in the MERRA time series data by averaging data of the 3 years preceding and succeeding the outlier.

Accuracy estimation
Glaciological mass balance. The accuracy of the glaciological mass balance estimations depends on various factors, which include the precise measurement of ice loss at each stake location, the spatial averaging of the measurements over the entire glacier, the accuracy of the ice density measurements and the representativeness of stakes and accumulation pits62–64. To account for the uncertainty caused by the extrapolation of mass balance in the accumulation zone, we used three different approaches including using a single constant accumulation value for all the glacier elevation bands in the accumulation zone, a linear gradient in accumulation values and an inverse gradient in the highest two elevation bands of the accumulation zone to account for the annual accumulation following Kenzhebaev et al.65. Based on the three techniques, the standard deviation in the accumulation was interpreted as the uncertainty of MB in the accumulation zone63. For the ablation zone, the MB uncertainty was calculated from one-sigma confidence intervals of the regression coefficients66. Based on the accumulation and ablation uncertainties, we calculate an annual glacier-wide mass balance uncertainty of ±0.39 m w.e. a−1 for the HG. The mass balance uncertainty estimates of this study are consistent with those of earlier studies conducted in the Himalaya67,68.

Geodetic mass balance. The uncertainties of the geodetic mass balance estimates arise due to several factors including the uncertainty due to DEM differencing, radar signal penetration, uncertainty due to void filling of the source DEMs, delineating glacier outlines, and mass conversion using a single value for the ice density. All these factors were considered for the uncertainty assessment following the methodology of Huber et al.69, with an additional term to account for the radar penetration error following Abdullah et al.8, assuming that all the errors are uncorrelated and random. The uncertainties analysis of geodetic mass balance is discussed in detail in Supplementary Sect. 1.

Results and discussion
Glaciological mass balance. Field-based glaciological mass balance measurements of the HG between 2013 and 2018 revealed a significant and continuous mass loss with a 5-year mean mass balance of −0.95 ± 0.39 m w.e.a−1 (Fig. 2; Fig. S2). Mass balance vs elevation of the HG is shown in Fig. 2 (2013–2018). However, the measured mass loss shows significant interannual variability (Table 2) with average annual mass balances of −0.72 ± 0.39, −0.78 ± 0.39, −1.01 ± 0.39, −1.14 ± 0.39 and −1.11 ± 0.39 m w.e.a−1 across the five hydrological years from 2013 to 2018. In recent years, there has been a higher rate of mass loss with a consistently increasing trend in mass wastage from 2013 to 2018 (Fig. S2). The higher positive mass balance at the 4100–4200 elevation zone is attributed to the fact that this elevation zone has relatively steeper slopes and is situated around the glacier ELA and as a result, the zone witnesses more mass turnover from the accumulation zone. Besides, at times there is additional snow accumulation from the frequent snow avalanches observed in this zone due to its peculiar geomorphology. Therefore, due to these two reasons, there is a relatively higher positive mass balance observed in this elevation band. Furthermore, the hump at 3734 m in Fig. S2 may be attributable in part to the existence of thick debris thickness at the left side of the flowline, and in part to the extra mass turnover from snow avalanches, which is a common occurrence on the eastern flank of the glacier. As a result, for the entire observation period, the mass loss is nearly the same at the spot.

Supplementary Table S1 shows field-based mass balance data for other Himalayan glaciers, which indicates an overall negative mass balance trend for the glaciers analyzed. Studies of the in-situ mass balance in the
Indian Himalaya have indicated a negative but fluctuating trend in the rate of mass loss (Table S1). The mean specific balance of the Indian Himalayan glaciers varies from $-0.24$ to $-1.43 \text{ m w.e. a}^{-1}$. Recent studies also suggest that glacial mass loss in the region has accelerated in the region over the past few decades, with some variance, primarily due to glacier geometry, debris thickness, and local climatic variability\textsuperscript{7,70}. It was further observed that the HG is among the top three glaciers in the Indian Himalaya that has consistently shown a higher rate of mass loss (Table S1).

**Debris-cover influences on the observed mass loss.** During the various annual field expeditions to the Hoksar Glacier from 2013 to 2018, and also corroborated by recent satellite data analysis\textsuperscript{90}, it was observed that $\sim 80\%$ of the HG ablation zone is covered by debris of varying thickness, ranging from rock fragments as small as one centimetre to boulders as large as 60 cm in size (Fig. 3a). The debris-cover for the glacier was mapped manually from satellite images using the visual image interpretation technique. Furthermore, since the glacier size is relatively small, we were able to extensively validated the remotely-sensed debris cover area in the field during annual glacier field expeditions to the HG. The debris-cover thickness was manually measured in the field using a metal scale. The majority of the debris cover on the glacier mostly comes from the weathered...
material falling from the steep valley slopes on either side of the glacier valley, with a less amount coming from aeolian material deposited on the glacier surface.

The impact of the non-climatic factors such as debris-cover on the glacier mass changes was assessed independently for stakes along the central flowline, the right side of the central flowline when viewed from the snout, and on the left side of the central flowline. From the analyses of the data (Fig. 3b), it is found that the stakes on the right side of the central flowline have a higher annual mass loss of \(-1.43 \pm 0.39\) m w.e., the stakes along the central flowline have a mass loss of \(-1.35 \pm 0.39\) m w.e. and the stakes on the left side of the central flowline have a comparatively lower mass loss of \(-1.26 \pm 0.39\) m w.e. The presence of a thin debris-cover of 6.9 cm on the right side of the central flowline may have enhanced the ablation due to the increased absorption of solar radiation and a shorter vertical distance for heat conduction\(^7\), and thus the higher observed mass loss on the right side of the central flowline. The debris layer on the left side of the central flowline, on the other hand, is comparatively thicker, with an average depth of 22 cm, resulting in the lowest measured mass loss on the left side of the HG. Because the average thickness of the debris along the central flowline of the glacier is 16 cm, stake data along the central flowline revealed a medium mass loss of \(-1.35 \pm 0.39\) m w.e. Several studies on the impact of debris-cover on glacier recession in the Indian Himalaya have concluded that debris-cover has a substantial impact on glacier melt\(^13,72\), and that the thickness and distribution of debris-cover affect the pattern and degree of glacial mass balance\(^73\).

Differential thinning of the debris-covered and clear-ice parts of glaciers has been reported in studies and varies depending upon debris-cover distribution, lithology, pattern and thickness\(^74,75\). Thin debris-covered ice melts at a rate of around 9% faster than clean ice\(^75\). Thick debris-covered ice melts at a third of the pace of clean ice\(^76\). Popovnin and Rozova\(^77\) found that a glacier with debris thickness of 7–8 cm melts faster. Due to the absorption of incident solar radiation\(^7\) and the concomitant low albedo of debris-cover relative to snow and ice\(^78\), it has been hypothesised that thin debris-cover increases sub-debris melt rates. The findings of this study are consistent with earlier studies that suggest that glaciers with heavy debris cover have slower thinning rates and vice versa\(^51,71\).

Altitudinal variation of the mass balance. Glacier mass balance varies significantly with altitude\(^64,72\). The mean mass balance data of the debris-covered HG (point specific) was analysed by altitude ranges; 3690–3750 m, 3750–3800 m, and 3800–3850 m at around 50 m intervals in the ablation zone and a single zone with 3850–4350 m altitude in the steep ablation and accumulation zone to understand the altitudinal variation of the observed point mass balance. From Table 3, it is evident that the ablation zone at the lower elevations (3690–3750 m) showed a mean mass loss of \(-1.29 \pm 0.39\) m w.e (SD of 0.20) based on the average of the measurements from 6 stakes, while the ablation zone at the mid-altitudes (3750–3800 m) showed a mean mass balance of \(-1.35 \pm 0.39\) m w.e...
mass balance (2013–2018) of −0.95 ± 0.42 m w.e. a⁻¹ observed for the Greater Himalayan range. The assessment of the glacier. The mean geodetic mass balance (2000–2012) of the HG is broadly consistent with the glaciological temperature and precipitation. The Western Disturbances, bring precipitation in the Lidder basin, both in the form of rain and snow. From October to April, snowfall is the most common form of precipitation. During these 39 years, the mean annual lapse-rate-adjusted temperature of the study area showed a continuously increasing trend from 1980 to 2018 with inter-annual variations and ranged from a minimum of −4.51 °C to a maximum of −1.42 °C. The analysis showed that the mean annual temperature is increasing at the rate of 0.05 °C a⁻¹. The lapse-rate adjusted temperature data at the HG site showed a significant increasing trend (p < 0.01) (Fig. 5a). Several studies have found a strong negative relationship between mass balance and temperature. Changes in the form and amount of precipitation have an impact on glacier mass balance. Similarly, precipitation data analysis revealed that the highest precipitation of 1691 mm was observed in 2014 and the lowest of 705 mm in 1985 with an average annual precipitation of 1260 mm based on the long-term meteorological observations from 1980 to 2018. Trend analysis of the precipitation data showed that there is no statistically significant trend in total precipitation during the period (Fig. 5b). However, it has been reported that, while the total amount of precipitation has remained largely unchanged, the precipitation phase has changed from snow to rainfall as a result of the rise in the average minimum and maximum temperatures in the area. During the last few decades, the amount of snowfall in the region has decreased and correspondingly, the amount of rainfall has increased. The long-term impact of the reduced snowfall during winters in the Kashmir Himalaya has

| Altitude (m) | Mass balance (m w.e.) | SD | Debris thickness (cm) |
|-------------|----------------------|----|----------------------|
| 3690–3750   | −1.29                | 0.20| −17                  |
| 3750–3800   | −1.38                | 0.07| −14                  |
| 3800–3850   | −1.44                | 0.12| −5                   |
| 3850–4350   | 0.51                 | 0.20| −2                   |

Table 3. Altitudinal variation of mass balance of the Hoksar Glacier.
resulted in less snow accumulation over glaciers in the region, leading to a negative mass balance of glaciers in the region, as evidenced by the consistent negative mass balance of the HG from 1980 to 2018.

In the short term, the increasing summer temperatures and depleted snow precipitation during winters (Fig. 6a,b) is reflected in the mass balance of the HG. A direct and significant correlation was found between the observed glacier mass loss and summer temperature ($r = -0.80, p < 0.01$) and winter precipitation ($r = 0.72, p < 0.01$) during the 5 years of the in-situ glacier mass balance measurements from 2013 to 2018.

**Black carbon impacts on glacier mass balance.** Various studies on black carbon (BC) have found that an increase in BC concentration in the atmosphere contributes significantly to atmospheric warming since BC is a strong heat-absorbing atmospheric constituent, thus enhancing glacier ablation. The BC concentration in the area has significantly increased from ~90 ng m$^{-2}$ in 1980 to ~235 ng m$^{-2}$ in 2017 (Fig. 7a). Furthermore, the analysis of the in-situ measurements of BC concentration on ablation of the glacier revealed that BC concentration varied from 105 to 959 ng m$^{-3}$ with an average of 531 ng m$^{-3}$ (Fig. 7b), which is significantly higher than the BC concentration reported at other glacier sites in the Himalaya. It is thus inferred that the increasing trend of the BC in the valley has impacted the glacier health, as is evident from the growing trend of mass loss. Bhat and others have also reported higher BC concentration over the Kashmir Himalaya and suggested its adverse impacts on glacier health. However, it needs detailed investigation to ascertain the magnitude of the impact of the increasing BC concentration over the glacier melting at a regional scale.

Figure 4. Interpolated elevation changes of the Hoksar Glacier from 2000 to 2012.
Conclusions

Given the lack of knowledge about glacier mass loss in the UIB, this paper contributes significantly by offering insights into the mass balance of one of the glaciers in the UIB’s Jhelum sub-basin. The two approaches used in this study produced a good agreement in MB estimations, indicating that the Hoksar Glacier is increasingly losing a significant amount of ice mass. The in situ glaciological measurements from 2013 to 2018 revealed that the mean annual mass loss of the HG is $-0.95 \pm 0.39$ m w.e., with an increasingly negative mass balance trend recorded during the five hydrological years. The geodetic mass balance estimates from 2000 to 2012, revealed a higher mean negative mass balance of $-1.20 \pm 0.35$ m w.e.a$^{-1}$. The analysis revealed that the debris-cover had a significant impact on the glacier melting with the thick debris-covered ablation zone at lower altitudes showing less mass loss than the thin debris-covered ablation zone at higher altitudes. This shows that the regulating mechanisms for debris-covered glaciers that defy the normal elevation mass-balance gradient are complexly intertwined. The increasing mass loss of the HG has influenced its extent and health as evidenced by the glacier ELA changes, which have shifted $40 \pm 3$ m between 2013 and 2018, indicating the glacier imbalance. The growing negative mass balance and ascending ELA suggests that the HG is losing mass at a faster rate than the recorded mass balance estimates of the Nehnar$^{26}$, Kolahoi and Sheshram$^{27}$ glaciers situated in the vicinity of the glacier. Several other studies in the Jhelum have also revealed that the glaciers in the region are receding significantly$^{17,18}$.

The significant rise in temperatures, decrease in snow precipitation and increasing concentration of black carbon in the basin, have all led to the increased mass loss of the HG. Streamflow in the basin has depleted due to the significant reduction of glacier cover and mass during the last several decades. Recent studies have suggested that glacier-fed streams saw an increase in the streamflow for a certain period of time due to the increased glacier melting, and then, exhibited a drop because of the reduction in ice mass$^{90,91}$. However, continuing and strengthening glacier mass balance, glacio-hydrological, climatic and non-climatic data observations in the UIB is important for developing a robust understanding of glacier mass loss under changing climate and its impacts on streamflow in the UIB, so that existing gaps in knowledge are adequately addressed for developing long-term strategies for sustainable use of the depleting water resources in the UIB.

Figure 5. Temporal variations of (a) average annual temperature on the Hoksar Glacier from 1980 to 2018 calculated by using the temperature lapse-rate from the nearest observatory at Pahalgam (19 km away), and (b) total annual precipitation observed from 1980 to 2018 at Pahalgam.
Figure 6. Correlation of the observed annual mass balance with (a) annual summer temperature and (b) annual winter precipitation from 2013 to 2018.

Figure 7. (a) Variation of the area-averaged MERRA BC concentration in the Lidder valley from 1980 to 2017, and (b) variation of the observed BC concentration at the ablation zone of the HG from 21 to 24 September, 2013.
Data availability
The datasets generated or analysed during the current study are available from the corresponding author on reasonable request.

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