



# 1 The Spatiotemporal Regime of Glacier Runoff in Oases Indicates the 2 Potential Climatic Risk in Dryland Areas of China

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8 **Abstract.** Glaciers continuously affected by climate change are of great concern; their supply and runoff variation tendency  
9 under the pressure of increasing populations, especially in dryland areas, should be studied. Due to the difficulty of observing  
10 glacier runoff, little attention has been given to establishing high-resolution and long-term series datasets established for glacial  
11 runoff. Using the latest dataset using digital elevation models (DEMs) to obtain regional individual glacier mass balance,  
12 simulating the spatiotemporal regime of glacier runoff in oases that support almost the entire income in the dryland areas of  
13 China (DAC) could be possible. The simulations quantitatively assess glacier runoff, including meltwater runoff and delayed  
14 runoff, in each basin of the DAC at a spatial resolution of 100 m from 1961 to 2015, classify glaciers according to the potential  
15 climatic risks based on the prediction results. The total glacier runoff in the DAC is  $(98.52 \pm 67.37) \times 10^8 \text{ m}^3$ , in which the  
16 meltwater runoff is  $(63.43 \pm 42.17) \times 10^8 \text{ m}^3$ , accounting for 64.38%. Most basins had continuously increasing tendencies of  
17 different magnitudes from 1961 to 2015, except for the Shiyang River basin, which reached its peak in approximately 2000.  
18 Glacier runoff nurtured nearly 143,939.24 km<sup>2</sup> of oasis agricultural areas (OAA) until 2015, while 19 regions with a total  
19 population of 14 million were built alongside the oases, where glacier runoff occupies an important place in agricultural,  
20 industrial and municipal water consumption. Therefore, providing a long time series of glacier runoff for different river basins  
21 is of great significance to the sustainable development of the oasis economy in the arid zones.



**Key words.** Glacier runoff, Oases, Dryland areas of China, Spatiotemporal regime

## 1 Introduction

Persistently affected by climate change, the cryosphere has a tremendous impact on global hydrology and water resources (Adler et al., 2019; Beniston & Stoffel, 2014; Bibi et al., 2018; Ding et al., 2006; Piao et al., 2010; Sorg et al., 2012). Research on snow and ice is in line with the corresponding targets of the Sustainable Development Goals (SDGs) (Avtar et al., 2019; Bolch et al., 2019; Gratzner & Keeton, 2017; Hinz et al., 2020; Rasul et al., 2019; Wu et al., 2018) and 2 goals in the Intergovernmental Science-Policy Platform on Biodiversity and Ecosystem Services (IPBES) (Arora & Mishra, 2019; Compagno et al., 2021; Hausner et al., 2020; Keller et al., 2019; Martin-Lopez et al., 2019). Glaciers are the largest reservoirs of fresh water on Earth, and they store most of the ice and snow (Beniston & Stoffel, 2014; Kraaijenbrink et al., 2017). Glaciers store water as ice in the colder months and release it as meltwater as warmer summer temperatures melt the glaciers, creating runoff that carries valuable fresh water downstream for the benefit of human society (Immerzeel et al., 2012; Laghari et al., 2012; Qin et al., 2006; Yang et al., 2019), mitigating drought (Kaser et al., 2010; Wang et al., 2021) and poverty (Wang, Zhou, et al., 2020; Zarfl et al., 2015). Under current climate conditions, warming causes glaciers to melt and sea levels to rise, creating a negative feedback between the two (Brun et al., 2017; Shean et al., 2020).

An oasis is a special combined landscape of nature and humanity, and oases are essential in arid areas (Shi et al., 2003; Zhu et al., 2019). Oases in the dryland areas of China (hereafter DAC) support 90 percent of local residents and generate more than 95 percent of social wealth (Bie & Xie, 2020) in areas where agriculture relies on river channels (Biemans et al., 2019; Immerzeel et al., 2012). Most river basins in the DAC depend most on glacier runoff, which is a high-altitude water resource (Chen et al., 2016; Huang et al., 2009; Li et al., 2011; Zhang, Liu, et al., 2016), and glacier runoff is sometimes the only source of water for some oasis agriculture areas (OAAs) (Waldron et al., 2020), especially in the Hexi Corridor (Li et al., 2018). Under the high demand for water as a result of the rapidly growing population and irrigation combined with the arid climate in the DAC (Barnett et al., 2005; Fan et al., 2013; Immerzeel & Bierkens, 2012), the importance of water provided by glaciers in arid regions is apparent (Barnett et al., 2005; Pritchard, 2019; Tak & Keshari, 2020; Wang et al., 2021). Affected by global



46 warming, the rapid change in the cryosphere and its interactions with the biosphere, lithosphere, hydrosphere, atmosphere, and  
47 anthroposphere are increasingly intensified, having especially extensive and profound impacts on hydrology, water resources,  
48 ecosystems (Sun et al., 2020; Zhang, Liu, et al., 2019), and the sustainable development of the human economy and society  
49 (Lin et al., 2020).

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51 Field observation is by far the most accurate method used to obtain individual glacier mass balance and was used to establish  
52 the first and second glacier catalogs in China in the 1970s and the early 21<sup>st</sup> century, respectively (Liu et al., 2015; Sun et al.,  
53 2018). Continuous yearly mass balance data for long time series could not be calculated effectively due to the time consumption  
54 and high energy consumption of field observations (Brun et al., 2017; Shean et al., 2020). Therefore, the energy balance  
55 equation was used to reconstruct the glacier mass balance (Sakai et al., 2015; Yao et al., 2010) based on remote sensing datasets  
56 (Hussain et al., 2019) or imagery (Tak & Keshari, 2020), and the snow line was identified to be approximately the same as the  
57 equilibrium-line altitude (ELA). Another method used to calculate glacier runoff focuses on establishing the relationship  
58 between runoff and air temperature through meteorological station data with the degree-day factor model to better reflect the  
59 role of temperature in meltwater (Li et al., 2020; Liu, Zhang, et al., 2019). Semi-distributed hydrological models were also  
60 used to estimate the contribution of meltwater runoff to river flow, and similarly, river isotopic studies (Duan et al., 2020;  
61 Garee et al., 2017; Zhang, Luo, et al., 2016). However, some limitations were obvious: the relationship between stations and  
62 the degree-day factor model was too difficult to establish in large regions, while the energy balance model could be applied in  
63 large regions but with low resolution (such as 0.25 degrees (Sakai et al., 2015)). Semi-distributed hydrological models semi-  
64 quantitatively calculated the proportion of meltwater runoff to total runoff without time series. Taking advantage of digital  
65 elevation models (DEMs), some studies (Brun et al., 2017; Shean et al., 2020) have published mass balance datasets with high  
66 resolution; the former were 30 m based on the single-source Glacier Area Mapping for Discharge from the Asian Mountains  
67 (GAMDAM) inventory (Sakai, 2018), and the latter were accurate to each individual glacier based on the multisource  
68 Randolph Inventory (RGI Consortium, 2017), which makes estimating high-resolution glacier runoff data possible.

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We used the mass balance equation and dataset with high resolution to inversely reconcile high-altitude precipitation and then estimate the yearly ablation and accumulation to obtain glacier runoff time series. The first aim of this study was to totally quantify glacier runoff rather than qualify (Yang et al., 2015; Ye et al., 2017) or semi-quantify (Kayastha et al., 2020; Kumar et al., 2019; Mimeau et al., 2019; Wang et al., 2015) runoff in watersheds of the DAC. Second, the two parts of glacier runoff, which are called delayed runoff and meltwater runoff, were identified quantitatively and their impacts on the OAAs in the DAC were assessed. Additionally, the overall trend of glacier runoff was discerned, including the change trend and turning point of the two components. The spatial resolution of this study was improved to 100 m from 0.25 and 0.5 degrees in previous studies, and glacier runoff time series were observed with a time span of 54 years. By improving the spatial resolution, extending the temporal scope and correcting high-mountain precipitation and temperature, this paper provides a more accurate dataset for the evaluation of cryospheric ecological security patterns and ecosystem services in the future as well as a more scientific basis for sustainable cryospheric development.

## 2 Materials and methods

### 2.1 Observations

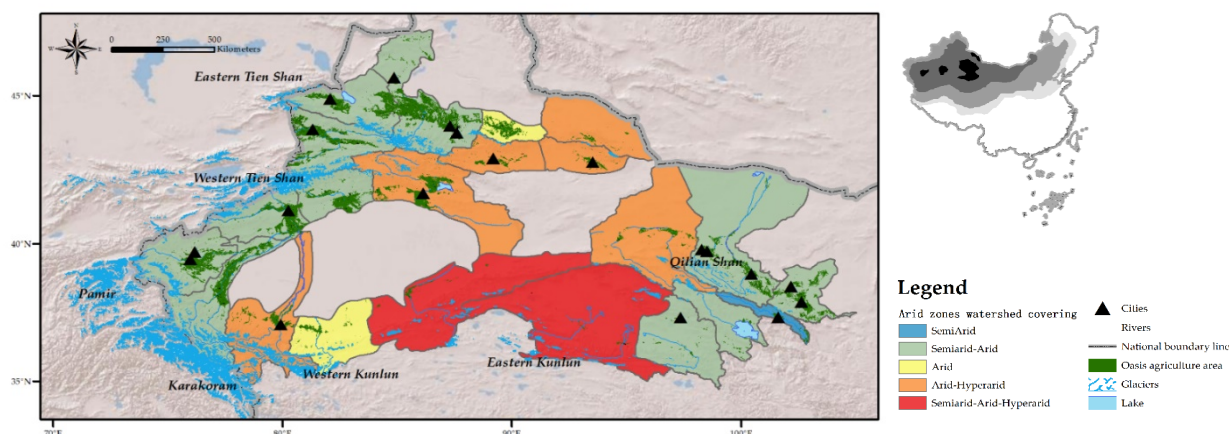
This paper used daily precipitation datasets from the Asian Precipitation – Highly Resolved Observational Data Integration Towards Evaluation Of Water Resources MA\_v1101 and MA\_v1101\_EXR1 (APHRODITE) at a 0.25° spatial resolution for the period 1961-2015 in monsoon Asia (<http://aphrodite.st.hirosaki-u.ac.jp/product>). The gridded daily temperature data were taken from the APHRODITE MA\_1808\_TEMP (<http://aphrodite.st.hirosaki-u.ac.jp/product>) dataset at a spatial resolution of 0.25° for the period 1961-2015. Information about glacier outlines, elevations and areas was derived from the Randolph Glacier Inventory (version 6.0, [https://www.glims.org/RGI/rgi60\\_dl.html](https://www.glims.org/RGI/rgi60_dl.html)). We used the SRTM DEM with a resolution of ~100 m (version 4.1, <http://srtm.csi.cgiar.org>). We obtained river basin outlines as shape files from the Resource and Environment Science and Data Center of the Institute of Geographic Sciences and Natural Resources Research, Chinese Academy of Sciences (<http://www.resdc.cn/data.aspx?DATAID=278>). The glacier mass balance data were derived from Shean's estimations (Shean et al., 2020) (<https://zenodo.org/record/3600624>). The dataset of the spatial distribution of degree-day factors for



glaciers was obtained from the Science Data Bank (<http://www.sciencedb.cn/dataSet/handle/747>) at a spatial resolution of 0.5° in High Mountain Asia and contained snow-melt and ice-melt degree-day factor distributions. Oases information was obtained from Copernicus Global Land Service (CGLS) LC100 collection 3 at a spatial resolution of 100 m on Google Earth Engine (GEE) (<http://land.copernicus.eu/global/products/lc>).

## 2.2 Study Area

By using the ratio data of annual precipitation to annual evapotranspiration (aridity index, AI), the DAC was obtained relying on drought zoning supported by the United Environment Programme (UNEP), which erased the range of the Tibetan Plateau, which is discussed separately. There are seven glacier regions around the DAC, including the Qilian Shan, Eastern Kunlun, Western Kunlun, Eastern Tien Shan, Western Tien Shan, Karakoram, and Pamir, which include approximately 42,000 glaciers involving four provinces: Inner Mongolia, Xinjiang, Gansu and Qinghai. The 7 glaciers affect 22 tertiary watersheds in the DAC, including 6 drainage basins which all originated directly from glaciers and across arid and hyper-arid regions (hereafter, AH). 2 river basins were both completely in the arid zone while 11 drainage basins were in both semiarid and arid regions (hereafter, SA). The Datong River above the Hall basin was the single basin entirely in the semiarid zone, and the Qarqan Rivers Basin was across semiarid, arid and hyper-arid zones (hereafter SAH). As Table 1 shows, the area of OAAs in each watershed in the DAC reached a maximum of 21,699.18 km<sup>2</sup> (Middle Rivers basin), with an average of 6543.692 km<sup>2</sup>, while the precipitation in the DAC reached a maximum of 323.09 mm (Qinghai Lake Drainage System), with an average of 134.56 mm, which revealed that runoff in the DAC was extremely important, especially in some basins where runoff originated almost entirely from glaciers. The study area is shown in Fig. 1.



**Fig. 1. Locations of watersheds and oasis agriculture areas affected by glaciers in the dryland areas of China.** (Shades of colour indicate drought from subhumid – semiarid – arid – hyper-arid) and the tertiary watersheds in the dryland areas of China affected by the Qilian Shan, Western Tien Shan, Eastern Tien Shan, Western Kunlun, Eastern Kunlun, Karakoram and Pamir. Oasis agricultural areas exist along rivers that originate from glaciers, and cities are built around oases. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)) and the Chinese map was from Resource and Environment Science and Data Centre, Chinese Academy of Sciences (<https://www.resdc.cn/data.aspx?DATAID=205>).

**Table 1. Annual precipitation and area of OAA in each watershed.**

Watershed	Annual precipitation (mm)	Area of OAA (km <sup>2</sup> )
Pai Basin	93.06	1047.50
Shule River Basin	79.10	2913.70
Hami Basin	63.53	1585.64
Turpan Basin	75.94	2218.58
Kai-kong River Basin	103.92	10191.39
Hotan River Basin	39.04	4816.73
Western Qaidam Basin	~ 0	538.37



Eastern Qaidam Basin	~ 0	876.23
Kriya Rivers Basin	51.31	2308.90
Qarqan Rivers Basin	78.82	1362.69
Easter Rivers Basin	139.52	5487.35
Middle Rivers Basin	175.29	21699.18
Yarkand River Basin	99.87	13568.21
Kashgar River Basin	137.61	11027.69
Weigan River Basin	136.96	8632.32
Aksu River Basin	148.64	10276.95
Qinghai Lake Drainage System	323.09	1012.96
Ebinur Lake Drainage System	191.29	11366.95
Heihe River Basin	113.67	9273.28
Shiyang River Basin	198.63	9333.13
Ili River Basin	299.05	13332.06
Datong River Above Hall	410.38	1069.43

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## 120 2.3 Methods

### 121 2.3.1 Reconciling High-altitude Precipitation

122 We used geodetic mass balance estimates in the high-mountain Asia (HMA) between 2000 and 2018 by combining  
 123 reprocessing ASTER DEMs (hereafter Shean estimation (Shean et al., 2020)) to simulate high-altitude precipitation. The mass  
 124 balance,  $B_y(m)$ , is the sum of accumulation,  $A_c(m)$ , and ablation,  $A_b(m)$ , at a yearly time step following Eq. (1):

$$125 \quad B_y = A_b + A_c = \int_{t_1}^t (A_b + A_c) dt, \quad (1)$$



126 The yearly mass balance was obtained from the Shean estimation. A comparison of Shean estimation to mass balance estimates  
 127 was improved by Brun et al. (Brun et al., 2017) between 2000 and 2016 using ASTER DEMs (here after Brun estimation) and  
 128 trends based on NASA's Ice, Cloud and Land Elevation Satellite (ICESat-1) data for the period 2003-2008 (here after ICESat  
 129 data) (Immerzeel et al., 2015; Kaab et al., 2012; Srivastava et al., 2013), and the total HMA glacier mass loss was  $-0.19 \pm 0.03$   
 130 m w.e.  $a^{-1}$  from 2000 to 2018 (Shean estimation),  $-0.18 \pm 0.04$  m w.e.  $a^{-1}$  from 2000 to 2016 (Brun estimation) and  $-0.40 \pm$   
 131  $0.09$  m w.e.  $a^{-1}$  from 2003 to 2008 except in the region of Eastern Kunlun, Qilian Shan and Inner Tibet (ICESat data). While  
 132 the ICESat data did not reflect small glaciers, the data were used to calculate the elevation changes of glaciers larger than 5  
 133  $km^2$  in area and then to interpolate the elevation variations across the entire region, and the satellite no longer provided data in  
 134 2009. In view of the applicability of time range and spatial resolution, ICESat data were not described in this paper. Because  
 135 the algorithms of the Brun estimation and Shean estimation were analogous, this paper focused on comparing the Shean  
 136 estimation and Brun estimation to handle a more appropriate dataset. Based on the RGI 6.0, 6 glacier regions influence the  
 137 DAC. Mass changes in the Eastern Kunlun and Karakoram were  $-0.01 \pm 0.07$  m w.e.  $a^{-1}$  (Brun estimation) and  $-0.02 \pm 0.15$  m  
 138 w.e.  $a^{-1}$  (Shean estimation),  $-0.03 \pm 0.07$  m w.e.  $a^{-1}$  (Brun estimation) and  $-0.05 \pm 0.13$  m w.e.  $a^{-1}$  (Shean estimation), where  
 139 the Karakoram anomaly was consistent with the former studies. Both of the positive mass change estimations were in Western  
 140 Kunlun (Brun estimation was  $0.16 \pm 0.08$  m w.e.  $a^{-1}$  and Shean estimation was  $0.10 \pm 0.17$  m w.e.  $a^{-1}$ ). Both of the negative  
 141 mass change estimations were in Western and Eastern Tien Shan (Brun estimation was  $-0.20 \pm 0.08$  m w.e.  $a^{-1}$  and  $-0.40 \pm$   
 142  $0.20$  m w.e.  $a^{-1}$  while Shean estimation was  $-0.22 \pm 0.33$  m w.e.  $a^{-1}$  and  $-0.42 \pm 0.25$  m w.e.  $a^{-1}$ ). Mass changes in the Qilian  
 143 Shan were  $-0.29 \pm 0.08$  m w.e.  $a^{-1}$  (Brun estimation) and  $-0.29 \pm 0.25$  m w.e.  $a^{-1}$  (Shean estimation). The two estimates for  
 144 each region of the DAC were generally similar ( $-0.95$  m w.e.  $a^{-1}$  (Shean estimation) vs.  $-0.83$  m w.e.  $a^{-1}$  (Brun estimation))  
 145 with large differences between uncertainty ( $1.37$  m w.e.  $a^{-1}$  (Shean estimation) vs.  $0.65$  m w.e.  $a^{-1}$  (Brun estimation)). This  
 146 paper selected the Shean estimation to simulate mass balance for recording mass balance and uncertainty of each individual  
 147 glacier, multisource RGI v6.0 glacier inventory (while the Brun estimation used the single-source GAMDAM inventory) and  
 148 implemented robust approaches to estimate elevation change trends for each glacier.

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The degree-day factor (DDF) is an important parameter reflecting the amount of ice and snow melt generated by the unit positive accumulated temperature (Kaser et al., 2010; Kraaijenbrink et al., 2017). Previous studies have generally used 2 mm °C<sup>-1</sup> d<sup>-1</sup> as the DDF for snow melt (Azam et al., 2012; Immerzeel et al., 2015). The spatial variation in the DDF has a great influence on the accuracy of simulating the snow melt process. This paper used the spatial distribution of snow melt data with a resolution of 0.5° based on a formula built by investigations and observations of 40 different glaciers in the HMA, and the dataset verified the accuracy (Zhang et al., 2006). Considering that the spatial resolution of this paper was 100 m, monthly positive-degree days ( $PDD_m$ ) were chosen instead of absolute  $PDD$  (Braithwaite & Olesen, 1993), and they were the summed positive daily average temperatures. The monthly spatial distribution of ablation,  $A_{b,m}(m)$ , was calculated by the product of  $DDF$  and  $PDD_m$  when the sum of the twelve months was the yearly spatial distribution of ablation,  $A_{b,y}(m)$ . The accumulation at a daily step depends on temperature, while precipitation is separated into solid (snow,  $A_c(m)$ ) and liquid (rain) by temperature. The relationship between snowfall and temperature was as follows: the temperature at which all precipitation becomes liquid was assumed to be 4°C,  $T_1(°C)$ , the actual temperature,  $T_a(°C)$  and the daily corrected precipitation,  $P_{cor,d}(m)$  (Fujita & Nuimura, 2011; Sakai et al., 2015) following Eq. (2):

$$A_c = \begin{cases} P_{cor,d}, T_a \leq 0 \\ \left(1 - \frac{T_a}{T_1}\right) P_{cor,d}, 0 < T_a \leq T_1, \\ 0, T_a > T_1 \end{cases} \quad (2)$$

The maximum rainfall height and maximum elevation of glaciers around the DAC were obtained from RGI v6.0 and used as the basis for high-altitude precipitation estimation by calculating the vertical precipitation gradient (Immerzeel et al., 2015). We used the Shean estimation to optimize the precipitation gradient per glacier. At each glacier affecting the DAC, the corrected precipitation,  $P_{cor,d}(m)$ , was calculated as a function of original precipitation data from APHRODITE\_MA\_v1101\_EXR1,  $P_{rmd,d}(m)$ , the vertical precipitation gradient,  $PG(\% m^{-1})$ , at a daily time step with the maximum precipitation altitude,  $H_{map}(m)$ , maximum elevation,  $H_{max}(m)$ , and terrain elevation,  $H(m)$ , for each individual glacier, using the following Eq. (3) and Eq. (4):

$$\Delta H = H_{max} - H_{map}, \quad (3)$$

$$P_{cor,d} = P_{rmd,d} \cdot \{1 + [\Delta H + (H_{max} - H)] \cdot PG \cdot 0.01\}, \quad (4)$$



Each glacier from seven regions of glaciers around the arid area of China was simulated, and then the vertical precipitation gradients that were generated were interpolated to obtain a wide range of vertical precipitation gradients representing the change in precipitation with altitude. By using the nearest neighbor algorithm for aggregating (López-Granados et al., 2005), the vertical precipitation gradient at a spatial resolution of  $0.25^\circ$  was obtained.

### 2.3.2 Glacier Runoff

Glacier runoff is defined as the flow of meltwater from a glacier through ice, in and under ice and then into a river channel (Qin et al., 2021). Based on the definition of glacier runoff, the runoff includes two parts. One is the precipitation on glaciers stored in the non-melting season and released in the melting season, which is called delayed runoff (Kaser et al., 2010; Pritchard, 2019; Shean et al., 2020). The monthly delayed runoff during the ablation seasons,  $\Delta M_m(m)$ , was calculated by the difference in the proportion of total annual corrected precipitation,  $P_{cor,y}(m)$ , allocated to the ablation season runoff,  $M_m(m)$ , according to the proportion of monthly  $PDD$ ,  $PDD_m$  and yearly  $PDD$ ,  $PDD_y$ . The ablation season was defined as all months in which the monthly temperature was above  $T_a$ .  $M_m$  was calculated as the following Eq. (5):

$$M_m = P_{cor,y} \times PDD_m / PDD_y, \quad (5)$$

When the temperature was above  $T_a$ , freezing did not occur on the surfaces of the glaciers, and precipitation occurred as liquid rainfall on the glacier that flowed out of the glacier systems in the form of runoff. If the runoff allocated in the month,  $M_m(m)$ , was more than the corrected precipitation in the month,  $P_{cor,m}(m)$ , delayed runoff,  $\Delta M_m(m)$ , occurred while the glaciers stored the solid precipitation in the accumulation seasons and released it in the ablation seasons following Eq. (6):

$$\Delta M_m = M_m - P_{cor,m}, \quad (6)$$

The delayed runoff calculation method was proposed by Kaser et al. (Kaser et al., 2010) and improved by Pritchard (Pritchard, 2019) for regional calculations. This method, where the precipitation dataset is the most important component, provides the possibility of calculating the monthly delayed runoff for a long time series and on a regional scale.

Based on the verification precipitation data (V2.0) (<http://data.cma.cn/>) provided by the China Meteorological Data Service Centre (CMDSC) from 1998 to 2016, Zhang (2020) generated a scatter plot and found that APHRODITE had the highest



determination coefficient (compared with TRMM, Tropical Rainfall Measuring Mission (https://gpm.nasa.gov/missions/trmm), and ITPCAS (China meteorological forcing dataset, (Jie & Kun, 2016)) and had the best applicability in Tien Shan of China. Han and Zhou (2012) found that the correlation coefficient between APHRODITE and ground gauge observed precipitation was more than 0.9, and APHRODITE explained spatial heterogeneity better (Yatagai et al., 2014) because it considered topography in the process of spatial interpolation (Yang et al., 2014). Li et al. showed that APHRODITE reflected the spatial and temporal distribution characteristics of precipitation in inland river basins and then compensated for the shortage of spatial precipitation data in the study area (Li et al., 2014). Tan et al. evaluated APHRODITE, CHIRPS (Climate Hazards Group InfraRed Precipitation with Station, https://data.chc.ucsb.edu/products/CHIRPS-2.0/), and PERSIANN-CDR (Precipitation Estimation from Remote Sensing Information using an Artificial Neural Network – Climate Data Record, https://climatedataguide.ucar.edu/climate-data/persiann-cdr-precipitation-estimation-remotely-sensed-information-using-artificial) on the Tibetan Plateau and its surrounding areas and found that APHRODITE performed best with the longest time span (> 50 years) and had a higher  $R^2$  with a lower MAE and RMSE than that of CHIRPS and PERSIANN-CDR (Tan et al., 2020). APHRODITE had the best performance in the DAC, including the Heihe River basin (Tang et al., 2017), Qinghai Lake drainage system (Zhang et al., 2014), Xinjiang (Wang, Sun, et al., 2020), upper reaches of the Yellow River (Guan et al., 2020) and other mountainous areas (Mishra et al., 2019). Therefore, we used APHRODITE, which has been verified many times and is one of the most accurate precipitation records in the DAC, in this paper.

The precipitation was corrected by the Shean estimation for high-altitude precipitation gradients in this paper for the glaciers affecting the DAC. Reconciling high-altitude precipitation and then recycling the former method to calculate the delayed runoff at a one-month time step for each glacier basin would be more persuasive without relying on the original products (Wortmann et al., 2018). Sakai et al. (Sakai et al., 2015) corrected the on-glacier precipitation by assuming that the average mass balance from 1979 to 2007 was equal to 0 at the ELA, referring to the median elevations of glaciers larger than 1 km<sup>2</sup> and the area-weighted average in each 0.5 grid using the glacier inventory (GGI) in High Mountain Asia on the basis of APHRODITE. The ELA is called the L-elevation, and the on-glacier precipitation was adjusted by one ratio at a resolution of 0.5°, while the ratios in the seven glacier regions affecting the DAC were 1-3 (Qilian Shan), 0-7 (Eastern Tien Shan), 0-4 (Western Tien Shan), 3-



7 (Western Kunlun), 0-4 (Eastern Kunlun) and 0-10 (Karakoram, with an extremely large ratio grid). The precipitation gradient factor with altitude was calculated based on the mass balance of each single glacier at a more accurate spatial resolution of 100 m in this paper.

The second type of glacier runoff was runoff from melting glaciers called excess meltwater runoff. Pritchard (Pritchard, 2019) calculated the excess flow of meltwater provided to the HMA river basins through a regional geodetic study of glacier volume changes from 2000 to 2016 by Brun (Brun et al., 2017), namely, the Brun estimation. Unlike delayed runoff due to precipitation, excess meltwater runoff is based on measured mass balance changes in glaciers rather than on average climate, so this runoff component is also called an unbalanced component, while the runoff caused by precipitation is called a balanced component (Rounce, Hock, et al., 2020; Rounce, Khurana, et al., 2020). With the Brun estimation, due to the time limit from 2000 to 2016, the contribution of unbalanced components to water input at the start of the 21<sup>st</sup> century compared with the balance components such as long-term precipitation could be obtained. Brun estimated that the excess water in the catchments controlled by the HMA, including the Yangtze, Mekong, Salween, Brahmaputra, Ganges, Indus, Amu Darya, Tarim, Syr Darya, Ili, and Inner Tibetan Plateau, was  $(-14.7 \pm 3.2) \text{ km}^3 \text{ a}^{-1}$  equivalent during 2000-2016 (Brun et al., 2017), which was approximately 70% of the balance component calculated above. The regional basin-scale imbalance uncertainty ranged from 26% to 77%. The Shean estimation estimated that the total excess water flow for all of the river basins originating from 2000 to 2018 was  $(-22.71 \pm 3.01) \text{ Gt}$  per year (Shean et al., 2020), where the additional basins considered included the Yellow River, Inner Tibetan Plateau Extended and Irrawaddy. The basin-scale imbalance uncertainty ranged from 12% to 52%. In conclusion, the yearly total glacier runoff,  $R_y(\text{m})$ , was calculated by the following Eq. (7):

$$R_y = M_y + B_y, \quad (7)$$

Both the Shean estimation and the Brun estimation calculated the average glacier meltwater over the corresponding periods of 2000 to 2018 and 2000 to 2016, respectively. We used the Shean estimation to calculate the precipitation gradient, and then the series of mass balances could be calculated according to Equation 1. Relying on the simulations of ablation and accumulation in reconciling high-altitude precipitation, the time series data of 1961-2015 could be obtained by using the APHRODITE temperature and precipitation data. This paper obtained the time series of meltwater from 1961 to 2015, rather



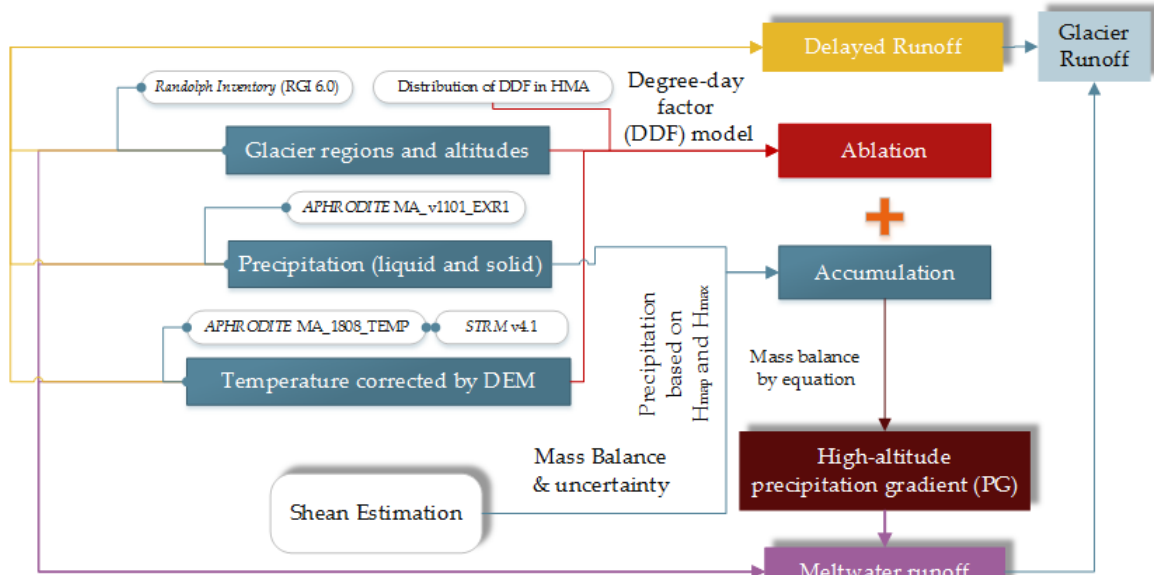
247 than the mean meltwater in a certain period of time (Pritchard, 2019; Shean et al., 2020). Time series data have unique  
248 advantages for studying the change trend and can also more clearly observe the change in meltwater within any required time  
249 period.

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251 We provide a method to predict future total glacier runoff relying on temperature, precipitation and elevation data, as both of  
252 the goals of the Representative Concentration Pathway (RCP) and the Coupled Model Intercomparison Project (CMIP) are  
253 keeping the increase in temperature within a certain range.  $PG$  in this paper was obtained by interpolation using the mass  
254 balance algorithm and geostatistics method. Glacier runoff was divided into delayed runoff and excess meltwater runoff.

### 255 2.3.3 Uncertainty Analysis

256 According to the individual glacier uncertainty (including random error and systematic error) calculated in the Shean  
257 estimation, the uncertainty range of glacier mass balance changes could be obtained. The maximum and minimum values of a  
258 single mass balance were calculated through the uncertainty interval. Referring to the  $H_{max}$  provided by the RGI and  $H_{map}$   
259 referred to previous studies and reasonable inference of  $H_{min}$  in the RGI, the  $PG$  of each single glacier around the DAC was  
260 obtained by geographical simulation. After using the DDF model and the glacier mass balance model, the corrected  
261 precipitation and meltwater were obtained, which were the bases of delayed runoff and meltwater runoff, respectively. The  
262 uncertainty of glacier runoff was the precipitation gradient in the range obtained from the uncertainty of glacier mass balance  
263 and was then calculated according to the relevant models. Calculations of delayed runoff and meltwater runoff and their  
264 uncertainties were shown in the Fig. 2 where shaded blocks were results with uncertainties. The uncertainties of delayed runoff  
265 and meltwater runoff value in this paper came from the uncertainties of mass balance in Shean estimation because obtaining  
266 from remote sensing observation accompanied by a large uncertainty value.



**Fig. 2. Conceptual framework of glacier runoff calculating.** Blocks represent module of the glacier runoff calculation in each category. Shading indicated results with uncertainties and different lines and blocks indicated the corresponding modules.

### 2.3.4 Trend Analysis

The Mann-Kendall test (MK test) was recommended as an effective method to distinguish whether a natural process is in a natural fluctuation or has a definite trend of change especially for hydro-meteorological data with non-normal distribution (Mann, 1945; Kendall, 1975). Given a time series  $x(t)$  of length  $n$  with statistical hypothesis that the unadjusted data series was an independent random variable with the same distribution composed of  $n$  elements.  $m_i$  represented the cumulative number of  $x(i)$  was greater than  $x(j)$ ,  $1 \leq j \leq i$ , and the statistic  $d_k$  was defined as following Eq. (8):

$$d_k = \sum_{i=1}^k m_i, 2 \leq k \leq n, \quad (8)$$

The mean  $E(d_k)$  and variance  $var(d_k)$  was calculated by the following Eq. (9) and Eq. (10):

$$E(d_k) = k(k-1)/4, \quad (9)$$

$$var(d_k) = k(k-1)(2k+5)/72, \quad (10)$$

After standardizing  $d_k$ ,  $UF_k$  and  $UB_k$  can be calculated as following Eq. (11) and Eq. (12):

$$UF_k = \frac{d_k - E(d_k)}{\sqrt{var(d_k)}}, \quad (11)$$



$$\begin{cases} UB_k = -UF_k \\ k = n + 1 - k, k = 1, 2, 3, \dots, n \end{cases} \quad (12)$$

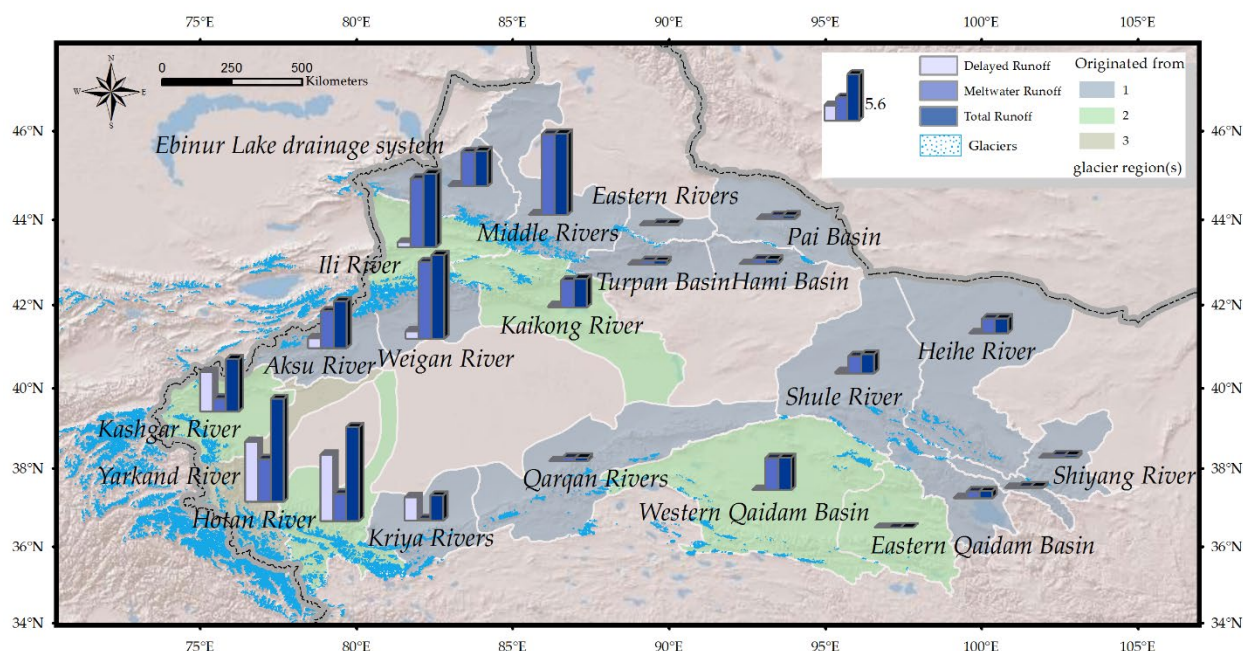
$UF_k$  formed a  $UF$  curve and  $UB_k$  formed a  $UB$  curve, while the intersection point of the former two curves in the confidence interval was determined as the turning point. While  $UF > 0$ , it indicated an increasing trend of the sequence, on the contrary, it indicated a declining trend while  $UF < 0$ .

## 3 Results

### 3.1 Glacier Runoff during 1961-2015

In this paper, we used the Shean estimation to correct the high-altitude precipitation gradient and the DDF model to calculate the total glacier runoff around the DAC during 1961-2015 with a spatial resolution of 100 m, and we overcame the difficulty of large-scale geodetic mass balance assessment. Glacier runoff included delayed runoff that was stored rainfall in the cold seasons and released rainfall in the ablation seasons, while meltwater runoff was caused by glacier mass balance, which was also called excessive meltwater runoff or the imbalanced part of glacial runoff, as shown in Fig. 3. The average glacier runoff in the DAC for the period was  $(98.52 \pm 67.37) \times 10^8 \text{ m}^3$ , where the meltwater runoff accounted for 64.71%. The drainage basins affected by the glaciers surrounding the DAC were largely controlled by meltwater runoff. The total glacier runoff in the Datong River above the Hall basin, Shiyang River basin, Heihe River basin and Eastern Rivers basin came from excessive meltwater. A total of 78.85% and 61.98% of the glacial runoff in the Aksu River basin and Kashgar River basin originated from glacier mass loss from Western Tien Shan and Pamir, respectively. The delayed runoff components of the Hotan River basin and Yarkand River basin, which originated from Western Kunlun, Karakoram and Pamir, were both larger than the mass balance component. The delayed runoff component of the Qarqan Rivers basin, which was controlled by Western Kunlun and Qilian Shan, reached 73.19%. The creeks of the Kriya Rivers basin were the most unique, with 93.67% of the components coming from delayed runoff; therefore, more attention should be paid to glacier disasters in this basin. Meltwater runoff accounted for 90% or more of the runoff in the remaining basins.





**Fig. 3. Map of total glacier runoff.** Distribution of total glacier runoff, including delayed runoff and meltwater runoff.

Shown are the average amount of runoff for every study basin in the DAC for the period 1961-2015. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)).

Total glacier runoff had an increasing trend after the 1970s that was significant after the 1990s, with a confidence of 95% in the whole study area. Except for the Datong River above Hall, Heihe River basin and Shiyang River basin, the runoff of the other basins showed continuous increasing trends in the past 50 years, where the times of arrival of significant increase were different. Trends in the Ebinur Lake Drainage System and Kai-kong River basin were significant after the 2000s, the Hotan River basin and Kashgar River basin were significant after the 1980s, and the Qinghai Lake Drainage System, Shule River basin and Aksu River basin showed gradual increasing trends with no significance until 2015. The amount of glacier runoff in the Datong River above Hall began to decrease after the 1990s, and in the Heihe River basin, it decreased after 1995 with no significance according to the Mann-Kendall (MK) test. Glacier runoff in the Shiyang River basin began to decline in 2000 and even showed a significant declining trend in approximately 2010, which was consistent with previous studies (Zhang et al., 2015). The time series of delayed runoff and meltwater runoff for all basins were illustrated in Extended Data Fig. 1, 2 and 3.





317

318   Glaciers stored, on average,  $(35.09 \pm 25.20) \times 10^8 \text{ m}^3$  of water during the period from 1961 to 2015 and released this water  
 319   during the ablation seasons. The flood lakes and natural hazards caused by this effect require attention. Due to the differences  
 320   in regional climate and topography, the temperatures and ablation seasons were also different. The total delayed runoff in the  
 321   study area increased continuously from 1970, and then it reached a turning point and became significant after 1991.

322

323   In many basins, such as the Heihe River basin, Turpan Basin, Shiyang River basin, Eastern Rivers basin, and Datong River  
 324   above Hall basin, the glacier runoff in the DAC was almost all excessive meltwater runoff. From 1961 to 2015, Glaciers in the  
 325   arid regions provided  $(63.43 \pm 42.17) \times 10^8 \text{ m}^3$  of glacial excess meltwater. While focusing on current climate change, whether  
 326   the glacier melt can be provided sustainably and affect the agriculture, livelihood and security of the downstream region needs  
 327   to be given more attention. The Western Tien Shan provided  $(9.78 \pm 8.29) \times 10^8 \text{ m}^3$  and  $(5.38 \pm 4.83) \times 10^8 \text{ m}^3$  of glacier  
 328   runoff to the Weigan River basin and Aksu River basin, respectively, while providing the Ili River basin and Kai-kong River  
 329   basin with  $(6.03 \pm 4.39) \times 10^8 \text{ m}^3$  and  $(1.22 \pm 0.83) \times 10^8 \text{ m}^3$ , respectively. The Eastern Tien Shan provided  $(2.03 \pm 1.56) \times$   
 330    $10^8 \text{ m}^3$  to the Ili River basin and  $(7.84 \pm 5.04) \times 10^8 \text{ m}^3$  to the Middle Rivers basin while supplying the Turpan basin and Hami  
 331   basin  $(0.36 \pm 0.21) \times 10^8 \text{ m}^3$  and  $(0.37 \pm 0.25) \times 10^8 \text{ m}^3$ , respectively. Western Kunlun provided  $(3.75 \pm 3.72) \times 10^8 \text{ m}^3$ , and  
 332   Karakoram provided  $(4.43 \pm 2.28) \times 10^8 \text{ m}^3$  to the Yarkand River basin. The Qilian Shan in the Hexi Corridor provided  $(1.98$   
 333    $\pm 1.21) \times 10^8 \text{ m}^3$  and  $(1.65 \pm 1.09) \times 10^8 \text{ m}^3$  of meltwater runoff to the Shule River basin and Heihe River basin, respectively.  
 334   However, neither the Eastern Kunlun nor the Qilian Shan provided less runoff to the Eastern Qaidam basin, totalling  
 335   approximately  $(0.04 \pm 0.04) \times 10^8 \text{ m}^3$ . The Kashgar River received  $(2.08 \pm 1.78) \times 10^8 \text{ m}^3$  of meltwater from Pamir, and the  
 336   Yarkand River basin received  $(0.21 \pm 0.21) \times 10^8 \text{ m}^3$ . The Western Qaidam Basin received a total of  $(3.76 \pm 2.65) \times 10^8 \text{ m}^3$  of  
 337   glacial meltwater. The MK value of delayed runoff and meltwater runoff for all basins were illustrated in Extended Data Fig.  
 338   4 and 5.

339



### 3.2 Glacier Runoff validation

Some studies (Barnett et al., 2005; Hussain et al., 2019; Li et al., 2018; Wang et al., 2015; Wu et al., 2018; Yang et al., 2015; Ye et al., 2017) simulated glacial runoff in the DAC by qualitative or semi-quantitative methods or by using models. This paper used these results to verify our estimations, although there were no data in any river basins or there were only trend studies in any river basins, as shown in Fig. 4.

The upstream inflow of the Heihe River was mainly influenced by annual precipitation and glacier meltwater runoff (Jin et al., 2015). The percentage of glacier runoff recharge calculated by the DDF model was between 5% and 15% based on the first Chinese inventory and monthly precipitation and temperature data from the National Meteorological Centre (Gao et al., 2010). Wang et al. used the standardized streamflow index (SSI) and standardized precipitation evapotranspiration index (SPEI) to estimate that the percentage of glacier runoff recharge was 5.2%. Obtaining the glacier runoff recharge by comparing observations of the Yingluoxia hydrological station out of the mountain and glacier runoff, the estimation in this paper was  $(8.75 \pm 5.83) \%$ , which was in line with previous studies from 2004 to 2015.

In the Shiyang River basin, a previous study estimated that the glacier runoff was  $0.61 \times 10^8 \text{ m}^3$  from 1961 to 2006 (Gao et al., 2010), while our estimation was  $(0.31 \pm 0.16) \times 10^8 \text{ m}^3$ , which was lower than the former. The peak glacier runoff in the Shiyang River basin occurred in the early 21st century where the proportion of meltwater runoff was close to 100% (Zhang et al., 2015). According to the MK test in this paper, the turning point of meltwater runoff in the Shiyang River basin appeared in 2000, and the meltwater runoff in the Shiyang River basin began to decline in 2000.

The Changmabao hydrological station stands out of the mountain pass in the Shule River. Li et al. calculated that glacier runoff in the Shule River basin accounted for 30.5% of the total runoff (Li et al., 2019). The average runoff growth rate of the Changmabao hydrological station in each decade from 1960 to 2015 was  $1.075 \times 10^8 \text{ m}^3 (10\text{a})^{-1}$  according to Li's calculation and  $0.91 \times 10^8 \text{ m}^3 (10\text{a})^{-1}$  according to Yang's calculation (Yang et al., 2017). In comparison, we found that the increase in glacier runoff in the Shule River basin was  $(0.66 \pm 0.56) \times 10^8 \text{ m}^3 (10\text{a})^{-1}$  in this paper. By comparing the hydrological data of



365 Changmabao hydrological station from 2004 to 2015, the recharge rate of glacier runoff obtained in this paper was  $(19.21 \pm$   
 366  $13.02) \%$ , which was slightly lower than Li's observations.

367

368 The runoff growth rate was  $2.01 \times 10^8 \text{ m}^3 (10\text{a})^{-1}$  from 1961 to 2015 based on the hydrological records of Kaqun hydrological  
 369 station of the Yarkand River. The precipitation in the upper reaches of the Yarkand River changed little since 1960, with values  
 370 of 640.7 mm from 1961 to 1990 and 651.9 mm from 1991 to 2006. Most of the increase was caused by glacier meltwater (Gao  
 371 et al., 2010). In this paper, the meltwater runoff growth rate of the Yarkand River was calculated to be  $(1.87 \pm 0.63) \times 10^8 \text{ m}^3$   
 372  $(10\text{a})^{-1}$ . Zhang et al. used the DDF model to obtain values of  $23.80 \times 10^8 \text{ m}^3$  from 1961 to 1990 and  $30.10 \times 10^8 \text{ m}^3$  from 1991  
 373 to 2006 (Zhang et al., 2012). In this paper, the calculated values were  $(14.40 \pm 4.79) \times 10^8 \text{ m}^3$  from 1961 to 1990 and  $(16.92$   
 374  $\pm 5.79) \times 10^8 \text{ m}^3$  from 1991 to 2006. The mass balance quantities were -89.5 mm and -301.2 mm, which were both large  
 375 compared with the Shean estimation  $(33.25 \pm 210.69) \text{ mm}$ . As the mass balance was much lower than Zhang et al., the  
 376 estimations were also lower.

377 Using hydrological datas from Ulurawati station and Tongguzilok station in the Hotan River, the MK test showed that the  
 378 runoff of the Hotan River increased at a rate of  $0.084 \times 10^8 \text{ m}^3 \text{ a}^{-1}$  from 1960 to 2016 (Liu, Long, et al., 2019). Based on  
 379 APHRODITE, this paper found that the average rainfall in the Hotan River basin from 1961 to 2015 was 78.82 mm with no  
 380 obvious change. Meanwhile, the growth rate of glacier runoff calculated in this paper was  $(0.078 \pm 0.059) \times 10^8 \text{ m}^3 \text{ a}^{-1}$ , which  
 381 was similar.

382

383 Based on the monthly runoff observation data and daily meteorological data of the Weigan River basin during 1960-2013, Qin  
 384 et al. studied the runoff variation of the Weigan River basin in the last 54 years and reported a value of  $1.8 \times 10^8 \text{ m}^3 (10\text{a})^{-1}$ , of  
 385 which approximately 75% was caused by glacier meltwater (Qin et al., 2016). We calculated that the growth rate of total  
 386 glacier runoff in the Weigan River basin during 1961-2015 was  $(0.911 \pm 0.671) \times 10^8 \text{ m}^3 (10\text{a})^{-1}$ . A similar calculation found  
 387 that the average glacier runoff in the Weigan River basin was  $16.66 \times 10^8 \text{ m}^3$ , while our estimate was  $(12.69 \pm 11.19) \times 10^8$   
 388  $\text{m}^3$  (Duan et al., 2010).

389



390 Glacier runoff in the Ili River basin was calculated to be  $37.18 \times 10^8 \text{ m}^3$  (Li et al., 2010), while there was a prior different  
 391 result  $26.14 \times 10^8 \text{ m}^3$  (Liu, 1999; Yang et al., 1987). On the basis of the Soil Water and Assessment Tool (SWAT), glacier  
 392 runoff in Ili River basin were simulated to be  $8.4 \times 10^8$  during 1966-1975 and  $6.5 \times 10^8 \text{ m}^3$  during 2000-2008 (Xu et al., 2015).  
 393 The glacier runoff calculated in this paper was  $(9.16 \pm 7.33) \times 10^8 \text{ m}^3$  from 1966 to 1975 and  $(9.91 \pm 7.83) \times 10^8 \text{ m}^3$  from 2000  
 394 to 2008, which were in line with estimations by SWAT (Xu et al., 2015).

395

396 Using the formula of the general glacier melting model to calculate that the glacier runoff in Kai-kong River basin in the 1980s  
 397 accounted for 22.1% of the total value of  $33.80 \times 10^8 \text{ m}^3$ , namely,  $7.47 \times 10^8 \text{ m}^3$ , and in 2000, it accounted for 21.1% of the  
 398 total value of  $36.96 \times 10^8 \text{ m}^3$ , namely,  $7.8 \times 10^8 \text{ m}^3$  (Gao et al., 2008). This paper calculated that the glacial runoff in the Kai-  
 399 kong River basin in the 1980s was  $(2.82 \pm 1.92) \times 10^8 \text{ m}^3$  and that in 2000 was  $(4.05 \pm 2.75) \times 10^8 \text{ m}^3$ . The runoff supply rate  
 400 of glacier runoff in the Kai-kong River basin was 15.2%, and that at Dashankou hydrological station was  $32.94 \times 10^8 \text{ m}^3$  during  
 401 1956-1986 and  $36.96 \times 10^8 \text{ m}^3$  during 1987-2000 (Gao et al., 2008). The supply rates calculated in this paper were  $(8.40 \pm$   
 402  $5.23) \%$  and  $(8.81 \pm 3.58) \%$ . Similar to the Aksu River basin, Wang et al. showed that the observations at the Xiehela  
 403 hydrological station and Shaliguilanke hydrological station were  $45.70 \times 10^8 \text{ m}^3$  during 1961-1986 and  $52.60 \times 10^8 \text{ m}^3$  during  
 404 1987-2000. Wang et al. calculated that the recharge of glacier runoff in the Aksu River basin was 24.7%, while we calculated  
 405 that the recharges were  $(17.33 \pm 9.71) \%$  and  $(15.35 \pm 13.65) \%$  during 1961-1986 and 1987-2000, respectively. Su et al. (2016)  
 406 and Mardan et al. (2016) obtained a value of  $14.60 \times 10^8 \text{ m}^3$  for the mountainous Ebinur Drainage System in the 1980s, and  
 407 we estimated that the recharge of glacier runoff was  $(25.19 \pm 13.53) \%$ , which was in line with 24.4% of Wang et al. (2019).

408

409 Runoff changes in the Hami Basin (including the Toudagou Sub-Basin, Guxiang Sub-Basin, and Yushugou Sub-Basin)  
 410 originating in Eastern Tien Shan from 1979 to 2007 were found that in the Guxiang Sub-Basin and Sub-Yushugou Basin with  
 411 glaciers were relatively small (Wang et al., 2015), which was consistent with the trend of meltwater runoff in this paper. During  
 412 the period from 1979 to 2007, the meltwater runoff in the Hami Basin had a slight decreasing trend, the rainfall had a slight  
 413 increasing trend, and the overall runoff had a small change. The runoff in Western and Eastern Qaidam Basin has been  
 414 increasing in the past 60 years. Wang (2019) made use of the data from 28 meteorological stations in Qinghai Province from



415 the CMDSC and the runoff datasets of each hydrological station in Western and Eastern Qaidam Basin, combined with the  
416 MK test, and found that there was a sudden change in runoff in 2002. This result was similar to the turning point of meltwater  
417 runoff calculated in this paper (the turning point of Eastern Kunlun occurred in Western and Eastern Qaidam Basin in 2004  
418 and 2002, and the abrupt change points of the Qilian Shan both occurred in Western and Eastern Qaidam Basin in 2001). Wang  
419 noted that temperature had a greater effect on runoff, with a correlation coefficient of 0.6\*\*, which was similar to the increase  
420 in meltwater runoff caused by the accelerated melting of glaciers due to the increased temperature.

421

422 Our results were consistent with those of most studies. However, there was a large difference between the runoff of previous  
423 studies and that in the Yarand River basin. Because Zhang et al.'s estimation was based on glacier data with long-term  
424 observations of mass balance and obtained the mass balance trend of the whole region based on these data; however, this  
425 method was prone to cause large uncertainties. In view of the current qualitative or semi-quantitative analysis of the influence  
426 of glaciers on runoff, quantitative research on glacial meltwater is very scarce, which brings strong uncertainty to the future  
427 prediction of different basins. The model established in this paper could provide a new approach for the prediction of glacier  
428 runoff in the future. Of course, field observation is the most accurate method to study glaciers, and the establishment of  
429 observation systems and continuous hydrological monitoring based on different types and areas of glaciers could further and  
430 more accurately predict the evolution of glaciers and glacial water sources.

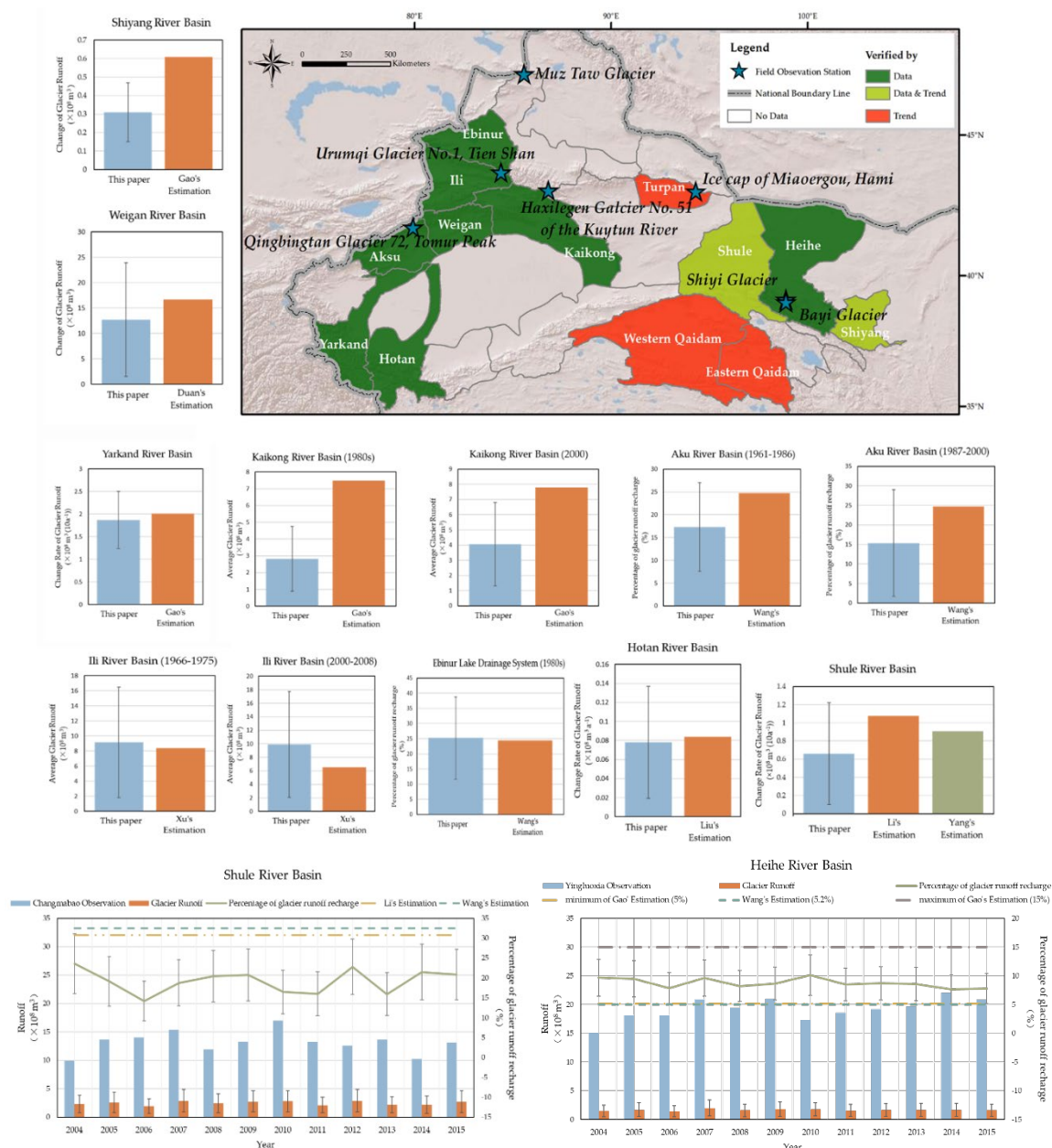
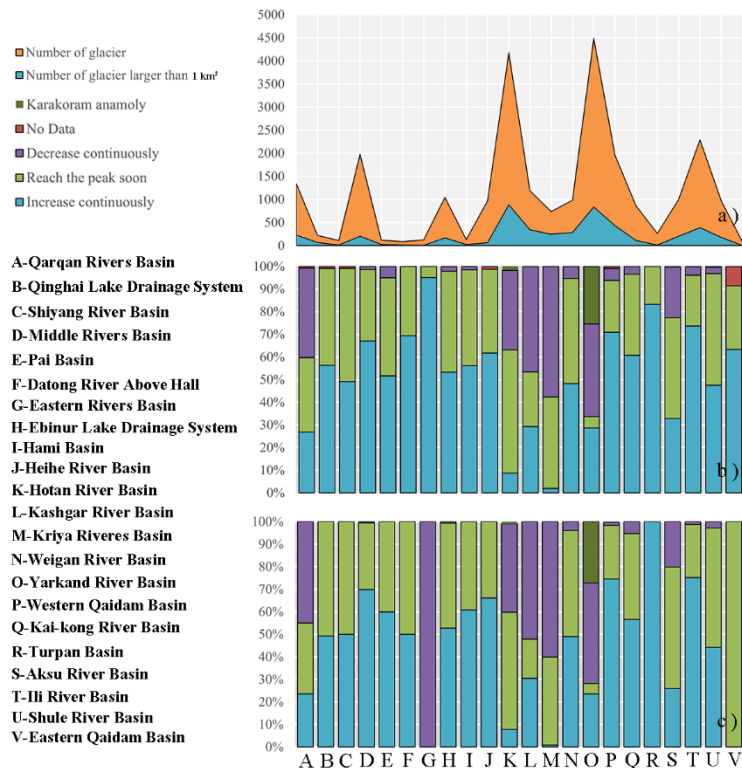


Fig. 4. Map of glacier runoff validation. Some basins had relevant data verification, some basins had both data and trend verification, some basins had only trend verification, and the areas without color lacked data. The study on glacier runoff in the DAC was unevenly distributed. The blue color in each chart was the glacier runoff calculated in this paper, and the other colors represented runoff obtained in different studies. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)).



3.2 Glacier Classification Based on Potential Climatic Risks



**Fig. 5. Statistical maps of different types and quantities of glaciers in each basin. a) Stacked area chart of the number of glaciers and glaciers larger than 1 km<sup>2</sup>. b) Stacked bar chart of different types of glaciers under future changes. c) Stacked bar chart of different types of glaciers larger than 1 km<sup>2</sup> under future changes.**

Based on the time series of glacier runoff, linear regression was used to predict the runoff of each glacier in DAC in the next decade as shown in Fig. 5. The Hotan River Basin, Yarkand River Basin and Ili River Basin in Xinjiang Province contained more than 2,000 glaciers according to RGI. Glaciers larger than 1 km<sup>2</sup> were more stable in the face of potential climate change risks while the number of glaciers larger than 1 km<sup>2</sup> was strongly consistent with the total number of glaciers contained in the basin. In the next ten years, the runoff of most basins would continue to increase, including the Qinghai Lake Drainage System, Eastern Rivers Basin, Turpan Basin and Eastern Qaidam Basin. Linking “Reach the peak soon” and “Decrease continuously”, the Hotan River Basin, and Kashgar River Basin and Kriya Rivers Basin where delayed runoff accounted for larger glacier





runoff were affected by potential climatic risks over the next decade. Qarqan Rivers Basin and Kai-kong River Basin would also reduce by potential climatic risks. Focusing on glaciers larger than  $1 \text{ km}^2$  revealed a reversal. In the Eastern Rivers Basin, the glaciers larger than  $1 \text{ km}^2$  would basically continue to decline in the next ten years, contrary to the overall trend of rising glacier meltwater runoff. Different from other continental glaciers, a significant area of glaciers in Karakoram remained relatively stable, which was called "Karakoram anomaly". Therefore, both larger than  $1 \text{ km}^2$  and other smaller glacier in the Yarkand River Basin would remain the anomalous relatively stable in the face of potential climate risks in the next decade.

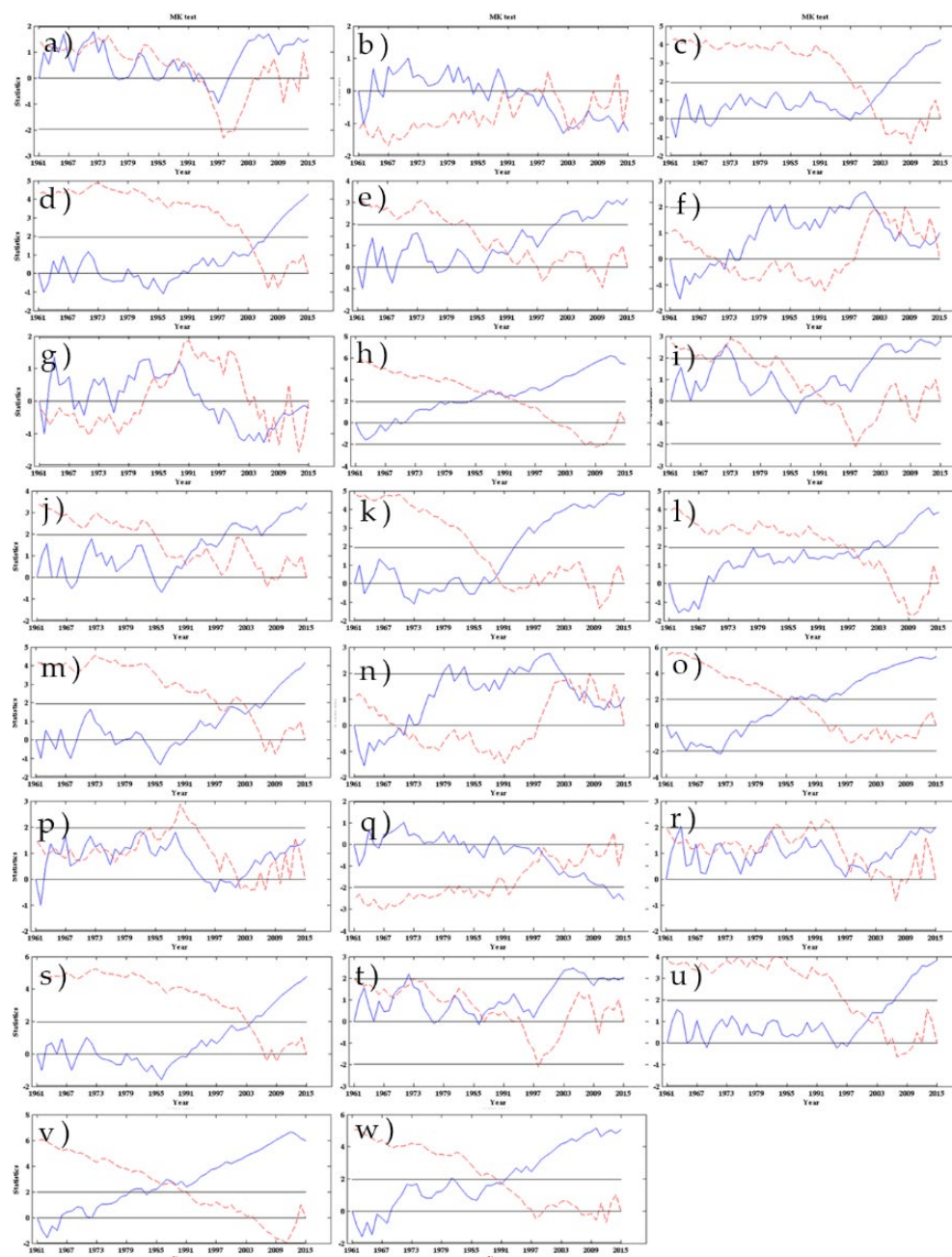
### 3.4 The Spatiotemporal Change in Glacier Runoff

MK test values of glacier runoff in all basins were shown in Fig. 6. The ratio called the change rate of the coefficient obtained by the least square linear regression to the mean value of glacier runoff in each basin during 1965-2015 was combined with the results of the MK test to determine the temporal change trend of glacier runoff in each basin, as shown in Fig. 7. According to the MK test value and the change rate, the glacier runoff in the Shiyang River basin showed a declining trend and decreased significantly in 2010, which made the basin the most unique among all the basins, while the MK test showed that glacier runoff in the Datong River above Hall was more likely to fluctuate. The trend of the change rate between 0 and 0.3 was determined as a weak fluctuation, i.e., there was no obvious trend of increase or decrease in regions including the Shule River basin, Qinghai Lake Drainage System, Pai Basin, Hami Basin, Weigan River basin and Aksu River basin, where change trends were also not significant. A change rate greater than 0.3 indicated a strong increasing trend. There was an abrupt change in the MK test value in the Middle Rivers basin, Eastern Rivers basin, Turpan Basin and Kashgar River basin in 2006, 2006, 2007 and 1990, respectively, rather than a stable increasing trend. Therefore, this paper listed the trend of these four basins as "fluctuated and increased" based on the MK tests, but the trends were not significant. Glacier runoff in basins such as the Hotan River basin, Yarkand River basin, Kriya Rivers basin, Qarqan Rivers basin, Western Qaidam Basin, Eastern Qaidam Basin, Ili River basin, Ebinur Lake Drainage System and Kai-kong River basin showed gradual increasing trends from 1961 to 2015, although the trends became significant at different times in different basins.



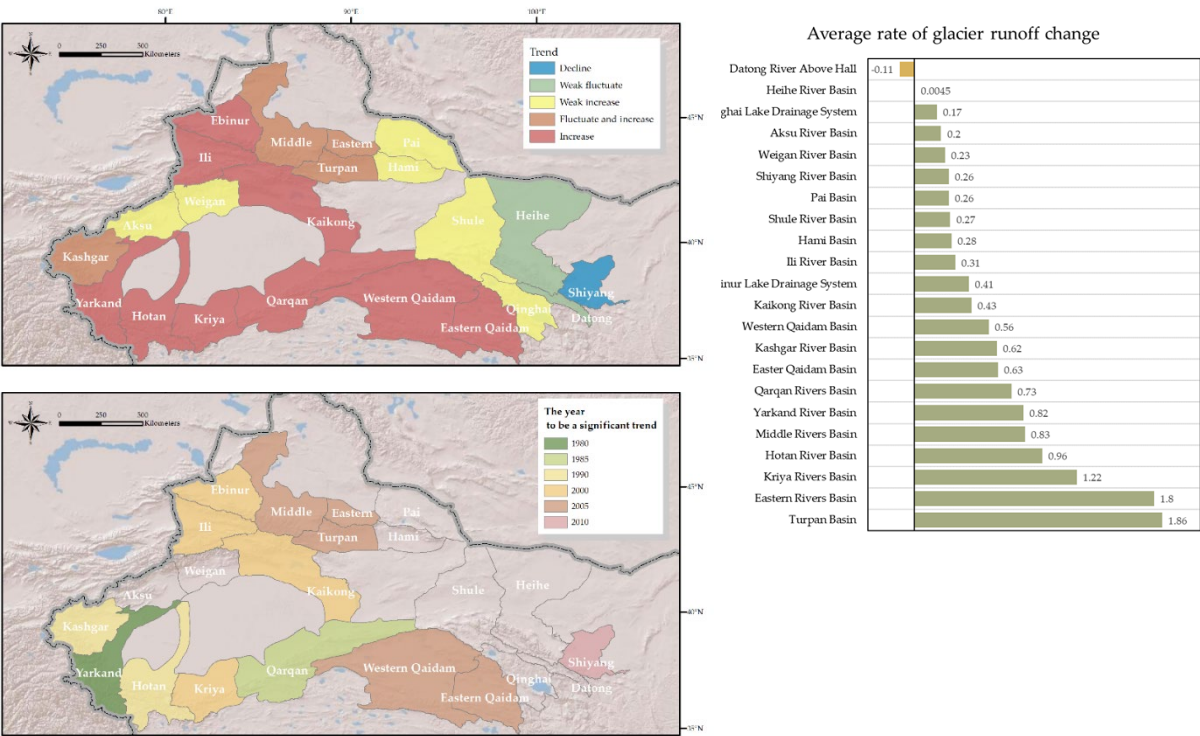


471 The average change rate in all basins affected by glaciers in the DAC was 0.48%. Although most of the river basins showed  
472 increasing trends and reached significance at different time points, the reasons for the sudden increase in the basins classified  
473 as “fluctuating and increasing” were not clear. The river basins originating from the Qilian Shan, such as the Shule River basin,  
474 Qinghai Lake Drainage System, Heihe River basin and Datong River above Hall, showed weak increasing or fluctuating trends,  
475 which indicated that the supply of glacier runoff in the Qilian Shan was relatively stable, while the decline in glacier runoff in  
476 the Shiyang River basin sounded an alarm. Persistently affected by climate change, it was difficult to determine how much  
477 glacier runoff could be provided in the next few years.



**Fig. 6. Mann-Kendall Test of total glacier runoff with a confidence of 95% in a)Aksu River Basin, b)Datong River Above Hall, c)Eastern Qaidam Basin, d)Eastern Rivers Basin, e)Ebinur Lake Drainage System, f)Hami Basin, g)Heihe River Basin, h)Hotan River Basin, i)Ili River Basin, j)Kai-kong River Basin, k)Kashgar River Basin, l)Kriya Rivers Basin, m)Middle Rivers Basin, n)Pai Basin, o)Qarqan Rivers Basin, p)Qinghai Lake Drainage System, q)Shiyang River Basin, r)Shiyang River Basin, s)Shiyang River Basin, t)Shiyang River Basin, u)Shiyang River Basin, v)Shiyang River Basin, w)Shiyang River Basin.**

Basin, r)Shule River Basin, s)Turpan Basin, t)Weigan River Basin, u)Western Qaidam Basin, v)Yarkand River Basin, w)Entire Basins. **Blue line referred to the UF curve and red line referred to the UB curve and the lines at  $\pm 2$  represented a 95% confidence interval.** While  $UF > 0$ , it indicated an increasing trend of the sequence, on the contrary, it indicated a declining trend while  $UF < 0$ . The year UF curve intersected the UB curve in the confidence interval was determined as the turning year.



**Fig. 7. Spatiotemporal regime of glacier runoff in the DAC. a) the trend of glacier runoff, b) the year with a significant trend, and c) the average rate of glacier runoff change.** The trends classified as “weak fluctuating” and “weak increase” had no significant time. Except for Shiyang River basin and Datong River above Hall, glacier runoff increased from 1961 to 2015. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)).



## 494 4 Discussion

### 495 4.1 Precipitation Correction at High-altitudes

496 Some glaciology studies believed that two maximum rainfall heights could appear on one high mountain. For example, the  
 497 Chinese Academy of Sciences (CAS) established eight rainfall observation points in the middle part of Tien Shan in 1959 and  
 498 observed that maximum rainfall heights occurred at two altitudes, 1850 m and 5339 m (Zhang, Tuerxunbai, et al., 2019; Zhao  
 499 et al., 2011). The same institute placed observation points in western Tien Shan in 1978 and found that the first maximum  
 500 rainfall height was 2400 m, and the second was 3200 m (Kou & Su, 1981). A study on the change in precipitation with altitude  
 501 in the Qilian Shan showed that the precipitation in coteau presented an "S" type distribution with increasing altitude (Tang,  
 502 1985). The second maximum rainfall height was believed to exist by studies on Tien Shan, North Slope of Karakoram, which  
 503 is located in the alpine glacier region (Shen & Liang, 2006).

504 **Table 2.  $H_{map}$  and  $H_{max}$  used in this paper.**  $H_{map}$  in Eastern Kunlun and Western Kunlun were speculated by five  
 505 other regions that had references about maximum rainfall height.  $H_{max}$  refers to the average of the maximum height of  
 506 each glacier in regions of RGI 6.0.

Region	$H_{map}$	$H_{max}$
Qilian Shan	4200 (et al., 2018; Wang et al., 2009)	5500
Eastern Tien Shan	3000 (Zhang, Tuerxunbai, et al., 2019)	5000
Western Tien Shan	3000 (Zhang, Tuerxunbai, et al., 2019)	6000
Eastern Kunlun	4500	6500
Western Kunlun	4000	6500
Karakoram	2500 (Immerzeel et al., 2012)	7500
Pamir	3000 (Hewitt, 2007)	6500

507 However, other meteorological studies believed that there was only one maximum rainfall height on one high mountain  
 508 because when the elevation was above the maximum rainfall height, the airflow continued to rise, but the water vapor rapidly  
 509 decreased and the precipitation could not increase again generally. Some research (Immerzeel et al., 2015) took the maximum



510 rainfall height as the reference height and believed that the average maximum rainfall height in the Indus River basin was 2500  
 511 m when calculating the precipitation on the glacier (Hewitt, 2007; Immerzeel, et al., 2012). Putkonen (2004) calculated that  
 512 the maximum rainfall height on the Southern Slope of the Himalayas was approximately 3000 m, while a subsequent calculated  
 513 that the maximum rainfall height zone on the July 1 glacier of the Qilian Shan was located at 4500-4700 m (Wang et al., 2009).

514

515 There has always been controversy over whether there is one or two maximum altitudes in the mountains. Even in the same  
 516 region, there are different results due to the limitations of the discipline, purpose, method, time or initial conditions of the  
 517 study. Zhao et al. (2011) thought there was only a maximum rainfall height in the Northern Slope of Tien Shan, and a  
 518 subsequent study which was by dividing the elevation zones by 100 m using TRMM, found that rainfall in Tien Shan peaked  
 519 at an annual level of 3500 m even though zones were divided into different geomorphic units (Bai et al., 2017). The results of  
 520 Bai et al. (2017) were different from those of the CAS in 1959 (3500 m vs. 1850 m and 5339 m). Additionally, observed at  
 521 Gongga Shan, Zhang found that there were two maximum rainfall heights, one at 3500-4000 m and the other at 5000 m (Zhang,  
 522 2012). However, Thomas observed that there was only one maximum rainfall height at Gongga Shan, which existed at 2900-  
 523 3200 m (Thomas, 1997).

524 The maximum rainfall height was related to the data. In the Junggar Basin, APHRODITE showed a maximum rainfall height  
 525 at 4200 m, while IMAGE showed a maximum height at 2600 m. The two maximum rainfall heights of ITPCAS were at 2810  
 526 m and 4260 m. PERSIANN and TRMM showed two maximum rainfall heights, which were both at 2600 m and 4200 m. In  
 527 the Turpan Basin and Hami Basin, APHRODITE, TRMM and ITPCAS all showed two maximum rainfall heights, at 2740 m  
 528 and 3800 m. There were two precipitation heights of APHRODITE in the Northern Tarim Basin: 2400-3100 m and 3600-4500  
 529 m. However, there was only one maximum rainfall height using IMAGE, which was at 4000-4800 m (Zhang, 2020).

530

531 The maximum rainfall height was also related to the season. Previous research divided Xinjiang into different altitude zones  
 532 according to meteorological stations' elevations, obtaining the regional variation characteristics of precipitation change with  
 533 changing altitude; specifically, that in summer was 3900-4200 m, that in autumn was 3000-4000 m, and that in winter was less  
 534 than 2360 m. Bai et al. believed that the maximum rainfall height in summer on the Northern Slope of Tien Shan would be

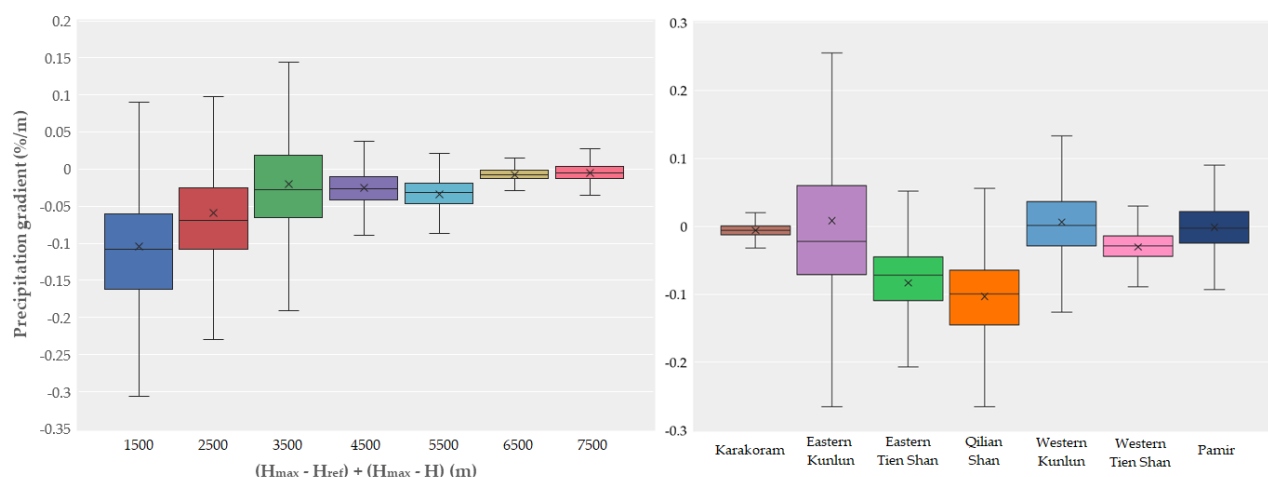


1900-2300 m, that in winter would be 900-1300 m, and the average rainfall height was approximately 3000 m (Zhang, Tuerxunbai, et al., 2019).

Fog, dew, frost and other weather phenomena are also known as horizontal precipitation, which can be seen year round in mountainous areas, especially at elevations greater than 3500 m. After condensation, this water vapor could be accepted only by the underlying surface but could not be captured by the common rain gauges commonly used for meteorological observations. Whether a rain gauge records precipitation in the high mountains correctly or not directly affects the correction of precipitation in mountainous areas. In this paper,  $PG$  was calculated according to the regional average  $H_{map}$ , so this paper used  $H_{map}$  as the standard for calculation. Both the  $H_{map}$  and the  $H_{max}$  are shown in Table 2.

#### 4.2 Distribution of High-altitude Precipitation Gradient

Our estimation revealed a strong heterogeneity of the median precipitation gradient in glaciers near the DAC, as shown in Fig 8. The median precipitation gradient for the seven glacier zones was  $-0.0347\% \text{ m}^{-1}$ , which meant that according to  $H_{max}$  and  $H_{ref}$ , precipitation decreased by  $0.0347\%$  for every 1 m increase in elevation. The median precipitation gradients in Karakoram, Eastern Kunlun, and Eastern Tien Shan ( $-0.0064\% \text{ m}^{-1}$ ,  $0.0011\% \text{ m}^{-1}$ , and  $-0.0062\% \text{ m}^{-1}$ , respectively) were obviously greater than the median precipitation gradients in Eastern Kunlun, Eastern Tien Shan, Qilian Shan, and Pamir ( $-0.0223\% \text{ m}^{-1}$ ,  $-0.0722\% \text{ m}^{-1}$ ,  $-0.0999\% \text{ m}^{-1}$ , and  $-0.0025\% \text{ m}^{-1}$ , respectively). We found that the median precipitation gradients of glaciers in the western part of the DAC were larger than those in the eastern part; for example, the median precipitation gradient of Western Kunlun was larger than that of Eastern Kunlun, similar to the relationship between Western Tien Shan and Eastern Tien Shan. Precipitation decreased by  $9.9\%$  for every 100 m increase in elevation from the maximum rainfall height in the Qilian Shan, and precipitation increased by  $0.11\%$  for the same increases in elevation in Eastern Kunlun.



**Fig. 8. Box plots of precipitation gradients for  $\Delta H + (H_{max} - H)$  (m) and each glacier region. Line: median; multiple sign: average number; box: 25–75% of the observations; whiskers: min and max non-outliers.**

To better understand the distribution of precipitation gradients of glaciers around the DAC, the relationship between precipitation and  $\Delta H$ , which is the difference between the maximum elevation and the maximum rainfall height, was analyzed in this paper.  $\Delta H$  had the largest number of glaciers between 3000 m and 4000 m, with a median  $PG$  of  $-0.0276\% \text{ m}^{-1}$  and a large range of maximum and minimum values. The  $\Delta H$  between 6000 m and 8000 m had the highest median  $PG$  ( $-0.0078\% \text{ m}^{-1}$  and  $-0.0055\% \text{ m}^{-1}$ ), which was consistent with the suggestions that the higher the tropospheric height was, the stronger the interaction between altitude and precipitation of this precipitation type was. The fewest glaciers were located in the ranges of 1000 m to 2000 m and 5000 m to 6000 m, with median  $PG$ s values of  $-0.1084\% \text{ m}^{-1}$  and  $-0.0319\% \text{ m}^{-1}$ , respectively. With the increase in  $\Delta H$ , the median  $PG$  had a significant increase range at elevations of 1000 m to 4000 m, and the median  $PG$  increased by  $0.0269\%$  for every 1000 m increase in elevation.

### 4.3 Impact Factors

Some results have shown that both temperature and precipitation have increased significantly in the last 60 years, while the increasing trends have even obviously intensified (Javed et al., 2021; Zhang et al., 2021). The long-term trends and interannual changes in temperature and precipitation dominated the climate humidification change. While continental glaciers are sensitive





to a combination of temperature (Wang et al., 2019), precipitation and snow/rain differentiation, temperature and precipitation were major factors of glacier runoff change. Changes in temperature and precipitation could change the glacier mass balance by affecting the displacement of the ELA, leading to changes in glacier areas and runoff. Previous studies have shown that the range of glacier change is larger in wetter mountains, such as Eastern Qilian Shan and the Western Tien Shan, while the range of glacier change decreases with the distance from a water vapor supply source. Most studies also showed that temperature played a leading role in hydrothermal conditions, while precipitation played a weaker role (Azam & Srivastava, 2020; Ban et al., 2020; Baojuan et al., 2020; Noel et al., 2020).

#### 4.4 Socio-economic Consequences

OAA in the DAC relied most on glacier delayed runoff and meltwater runoff to irrigate and maintain agriculture as well as to maintain soil moisture, vegetation growth and groundwater replenishment to maintain food security (Bury et al., 2013; Clouse et al., 2016; Rasul & Molden, 2019). The 22 glacier basins in the DAC have irrigated 143,939.24 km<sup>2</sup> of OAA, supplying a total of 14 million people in 19 regions. The primary industry gross domestic product (GDP) of these regions in 2015 was nearly 111.54 billion dollars, accounting for 14.1% of the total GDP of these regions, which was twice that of the primary industry, accounting for 7% of the national GDP. Since the total primary industry GDP of the entire north western DAC was 40.46 million dollars, OAAs constituted 79.86% of it. Increasing glacier runoff could provide more water for agriculture and animal husbandry to ensure food security and purvey water for residential and industrial use, but the trend could not be sustained (Wang et al., 2021).

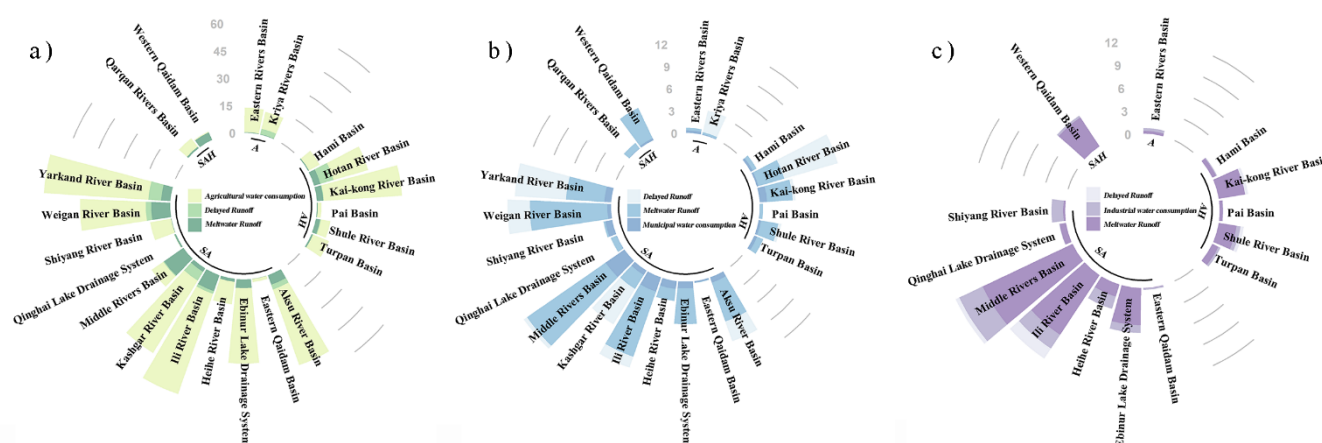
The proportion of glacier runoff in agricultural, industrial and municipal water consumption in each basin in the DAC was shown in Fig. 9. The agricultural water consumption at the watershed scale was obtained by averaging the agricultural water consumption statistical data to the land use types of agricultural land and then ranged regional statistics, which was the same with industrial and municipal water consumption. Compared with the industrial and municipal water consumption in each basin, the delayed runoff and meltwater runoff were both higher than the total industrial and municipal water consumption in this basin. Glacier runoff from the Middle Rivers Basin and Western Qaidam Basin could even provide the entire agricultural





595 water consumption over the entire basin. When the ELA was higher than the altitude of the glacier itself, glacier runoff began  
 596 to decrease, which might have adverse effects on downstream agriculture, animal husbandry, energy and livelihood. For  
 597 example, due to increased temperatures and reduced glacier runoff, California, in the United States, experienced a severe  
 598 drought from 2011 to 2015, where hydroelectric power generation decreased by two-thirds. The annual ecological service  
 599 value in Tien Shan was 60.2 billion yuan (~9.26 billion dollars) (Zhang, Liu, et al., 2019), and that in Qilian Shan was 24.354  
 600 billion yuan (~ 3.75 billion dollars) (Sun et al., 2020). Glaciers such as the Urumqi No. 1 Glacier and July 1 Glacier in Qilian  
 601 Shan have been developed as scenic plots to attract more tourists to the local area and increase the income of local residents.  
 602 However, with the rise of the ELA, to protect the Urumqi No. 1 Glacier, the tourist service had been cancelled. In the future,  
 603 glacier runoff will reach its peak when glacier tourism disappears (Warren & Lemmen, 2014). Even in some places, the water  
 604 shortage caused by the reduction of glacier runoff has caused the risk of water pollution and the production of water-borne  
 605 pathogens (Warren & Lemmen, 2014). In a study of the public perception of changes in the cryosphere in the Urumqi River  
 606 basin, 58.8% of the interviewees believed that as glacial runoff increased, income also increased (Deng et al., 2011). As  
 607 quantifying the economic and social impact of changes in the cryosphere is essential for making public policies and influencing  
 608 adaptation decisions, our estimations could support a quantified long-term time-series glacier runoff to be referred.

609



610

611 **Fig. 9. Proportion of delayed runoff and meltwater runoff to a) agricultural water consumption, b) municipal**  
 612 **water consumption and c) industrial water consumption.**



## 5 Conclusion

This paper overcame the shortcomings of large-scale geodetic quality assessments. We used the Shean estimation and calculated the precipitation gradient to quantitatively study the seven major glacier regions around the DAC, which consisted of nearly 42,000 glaciers. The spatiotemporal changes in glacier runoff (delayed runoff and meltwater runoff) in OAAs located in 22 glacier watersheds with a spatial resolution of 100 m from 1961 to 2015 were established.

1. This paper used the mass balance of the Shean estimation to obtain a high-altitude precipitation gradient with uncertainties and then calculated the long-term time series of glacier runoff, including delayed runoff and meltwater runoff, while the average total glacier runoff in the DAC was  $(98.52 \pm 67.37) \times 10^8 \text{ m}^3$ . The average meltwater runoff was  $(63.43 \pm 42.17) \times 10^8 \text{ m}^3$ , and the delayed runoff was  $(35.09 \pm 25.20) \times 10^8 \text{ m}^3$ .

2. Among all glacier watersheds, the Shiyang River basin was the most unique, which suggested a declining trend from 1961 to 2015. The Datong River above Hall and the Heihe Basin showed fluctuating trends, while the others showed different growth trends. Based on the time series of glacier runoff, linear regression was used to predict the runoff of each glacier in DAC in the next ten years which indicated the potential climatic risks.

3. As a continental glacier, the glacier runoff studied in this paper was mainly regulated by hydrothermal regulation, in which temperature was the dominant factor, followed by precipitation. Since the water source of the oases in the DAC was mostly glaciers and the total GDP of the OAAs accounted for 76.92% of that of the north western DAC, glacier runoff had a greater impact on local agriculture, animal husbandry, and economy. In the future, it is necessary to quantify the impact of each change in the cryosphere on social production factors more precisely.

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945 **Table**

946 **Table 1**

947 *Annual precipitation and area of OAA in each watershed*

Watershed	Annual precipitation (mm)	Area of OAA (km <sup>2</sup> )
Pai Basin	93.06	1047.50
Shule River Basin	79.10	2913.70
Hami Basin	63.53	1585.64
Turpan Basin	75.94	2218.58
Kai-kong River Basin	103.92	10191.39
Hotan River Basin	39.04	4816.73
Western Qaidam Basin	~ 0	538.37
Eastern Qaidam Basin	~ 0	876.23
Kriya Rivers Basin	51.31	2308.90
Qarqan Rivers Basin	78.82	1362.69
Easter Rivers Basin	139.52	5487.35
Middle Rivers Basin	175.29	21699.18
Yarkand River Basin	99.87	13568.21
Kashgar River Basin	137.61	11027.69
Weigan River Basin	136.96	8632.32
Aksu River Basin	148.64	10276.95
Qinghai Lake Drainage System	323.09	1012.96



Ebinur Lake Drainage System	191.29	11366.95
Heihe River Basin	113.67	9273.28
Shiyang River Basin	198.63	9333.13
Ili River Basin	299.05	13332.06
Datong River Above Hall	410.38	1069.43

948

949 **Table 2**

950  **$H_{map}$  and  $H_{max}$  used in this paper.**  $H_{map}$  in Eastern Kunlun and Western Kunlun were speculated by five other regions that  
 951 had references about maximum rainfall height.  $H_{max}$  refers to the average of the maximum height of each glacier in regions  
 952 of RGI 6.0.

Region	$H_{map}$	$H_{max}$
Qilian Shan	4200 (Chen et al., 2018; Wang et al., 2009)	5500
Eastern Tien Shan	3000 (Zhang, Tuerxunbai, et al., 2019)	5000
Western Tien Shan	3000 (Zhang, Tuerxunbai, et al., 2019)	6000
Eastern Kunlun	4500	6500
Western Kunlun	4000	6500
Karakoram	2500 (Immerzeel et al., 2012)	7500
Pamir	3000 (Hewitt, 2007)	6500

953

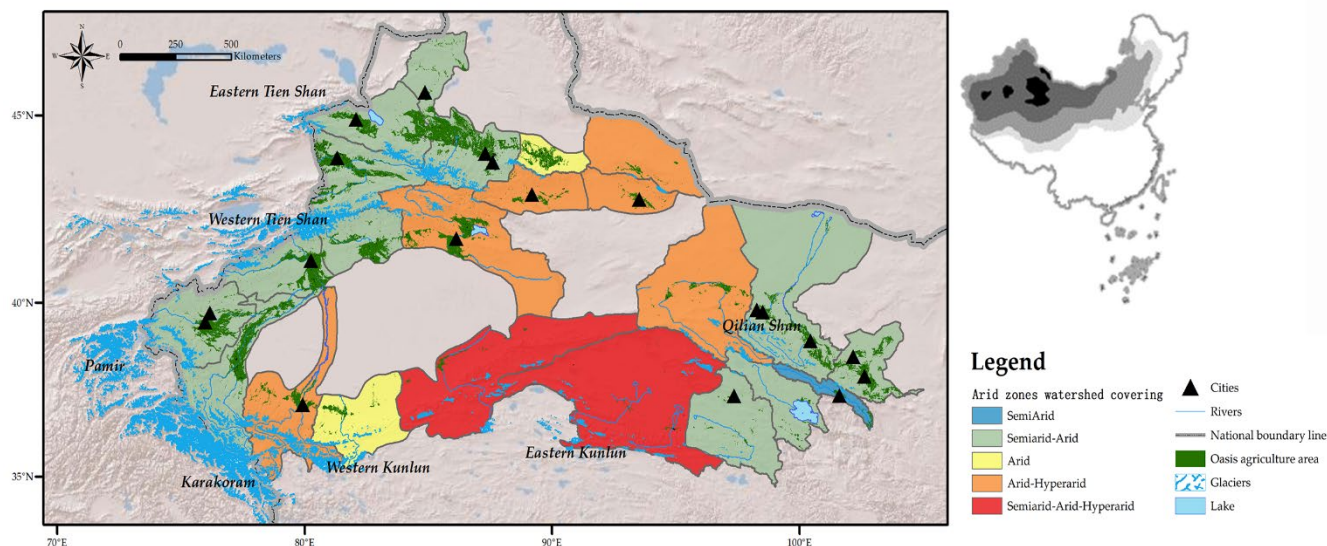
954 **Figure**

955 **Figure 1**





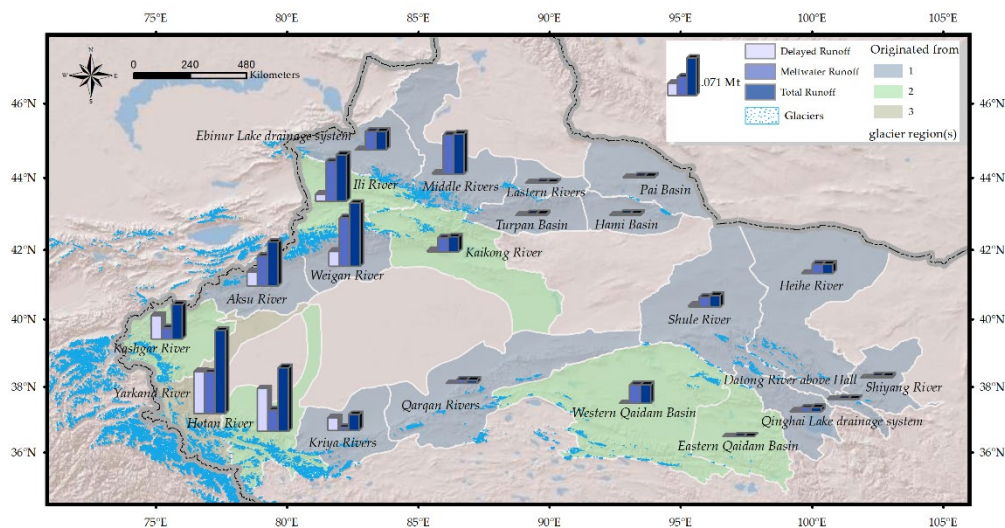
956 *Locations of watersheds and oasis agriculture areas affected by glaciers in the dryland areas of China.*



957 *Note.* (Shades of color indicate drought from subhumid – semiarid – arid – hyper-arid) and the tertiary watersheds in the  
958 dryland areas of China affected by the Qilian Shan, Western Tien Shan, Eastern Tien Shan, Western Kunlun, Eastern  
959 Kunlun, Karakoram and Pamir. Oasis agricultural areas exist along rivers that originate from glaciers, and cities are built  
960 around oases. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)) and the  
961 Chinese map was from Resource and Environment Science and Data Centre, Chinese Academy of Sciences  
962 (<https://www.resdc.cn/data.aspx?DATAID=205>)

963 **Figure 2**

964 *Map of total glacier runoff.*



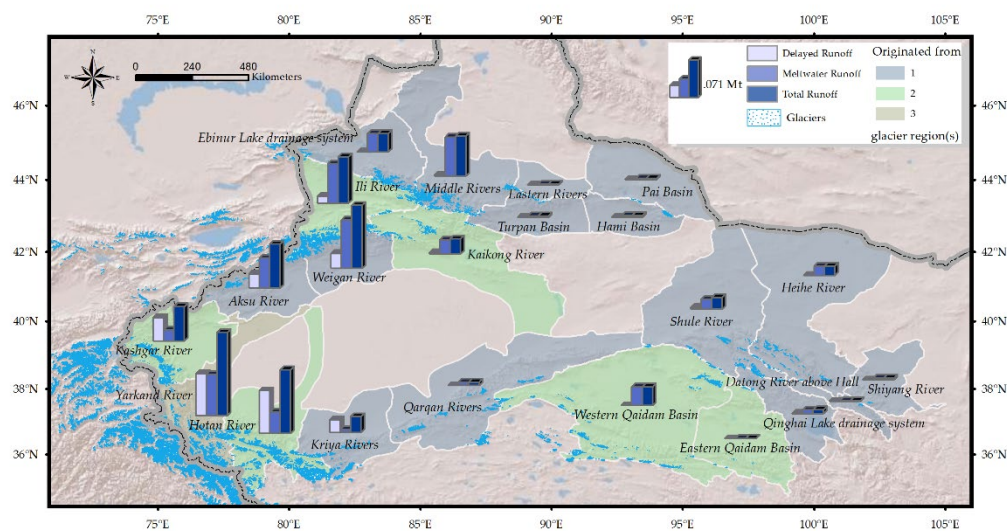


965 *Note.* Distribution of total glacier runoff, including delayed runoff and meltwater runoff. Shown are the average amount of  
 966 runoff for every study basin in the DAC for the period 1961-2015.

967

968 **Figure 2**

969 *Map of total glacier runoff.*



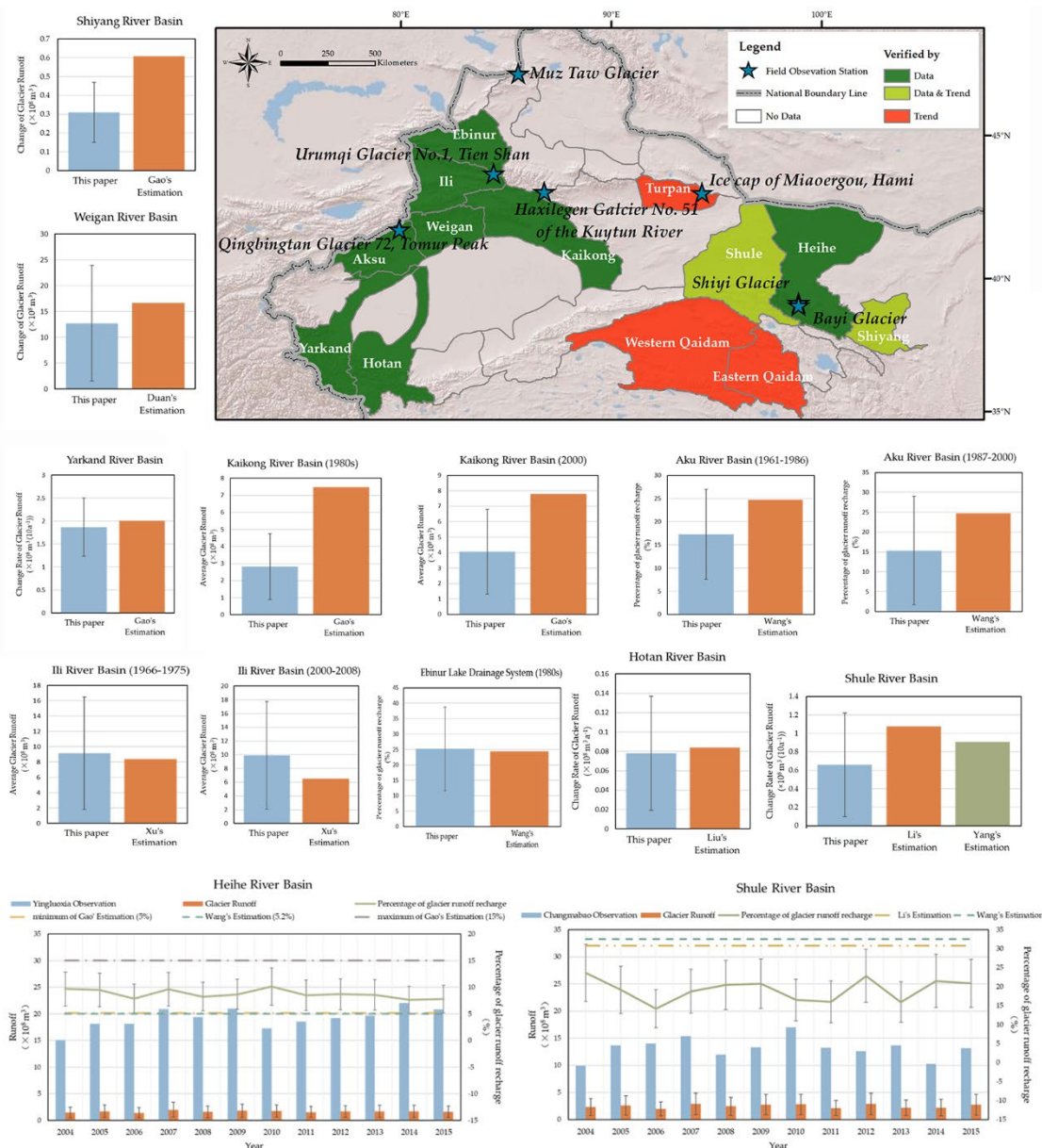
970 *Note.* Distribution of total glacier runoff, including delayed runoff and meltwater runoff. Shown are the average amount of  
 971 runoff for every study basin in the DAC for the period 1961-2015. World Shaded Relief provided by Esri  
 972 ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)).

973





Figure 3  
 Map of glacier runoff validation.

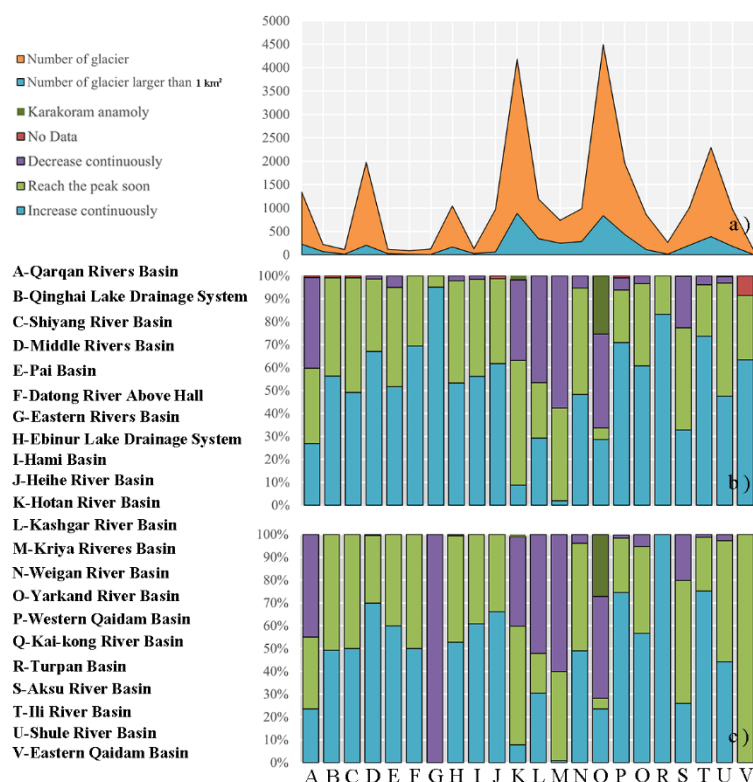


Note. Some basins had relevant data verification, some basins had both data and trend verification, some basins had only trend verification, and the areas without color lacked data. The study on glacier runoff in the DAC was unevenly distributed. The blue color in each chart was the glacier runoff calculated in this paper, and the other colors represented runoff obtained in different studies. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)).



# Figure 4

Statistical maps of different types and quantities of glaciers in each basin.

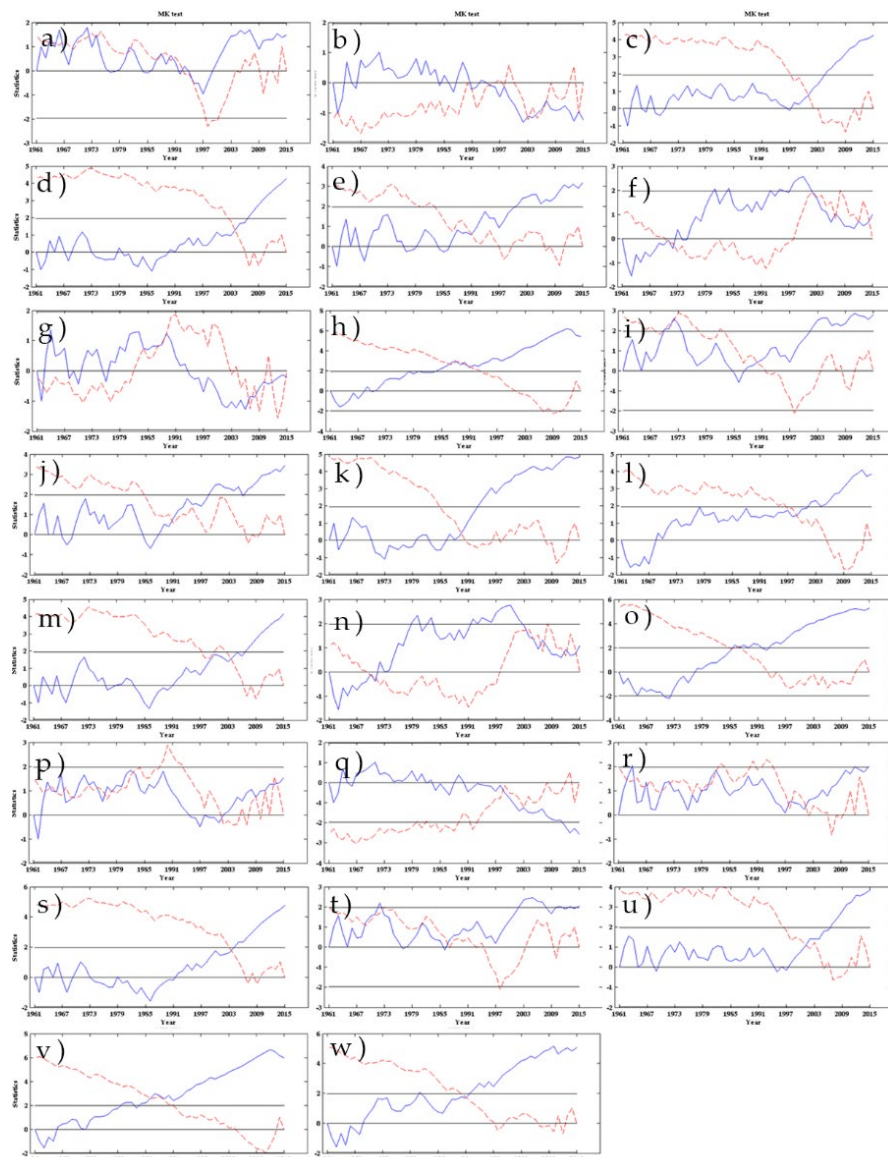


Note. a) Stacked area chart of the number of glaciers and glaciers larger than 1 km<sup>2</sup>. b) Stacked bar chart of different types of glaciers under future changes. c) Stacked bar chart of different types of glaciers larger than 1 km<sup>2</sup> under future changes.



989 **Figure 5**

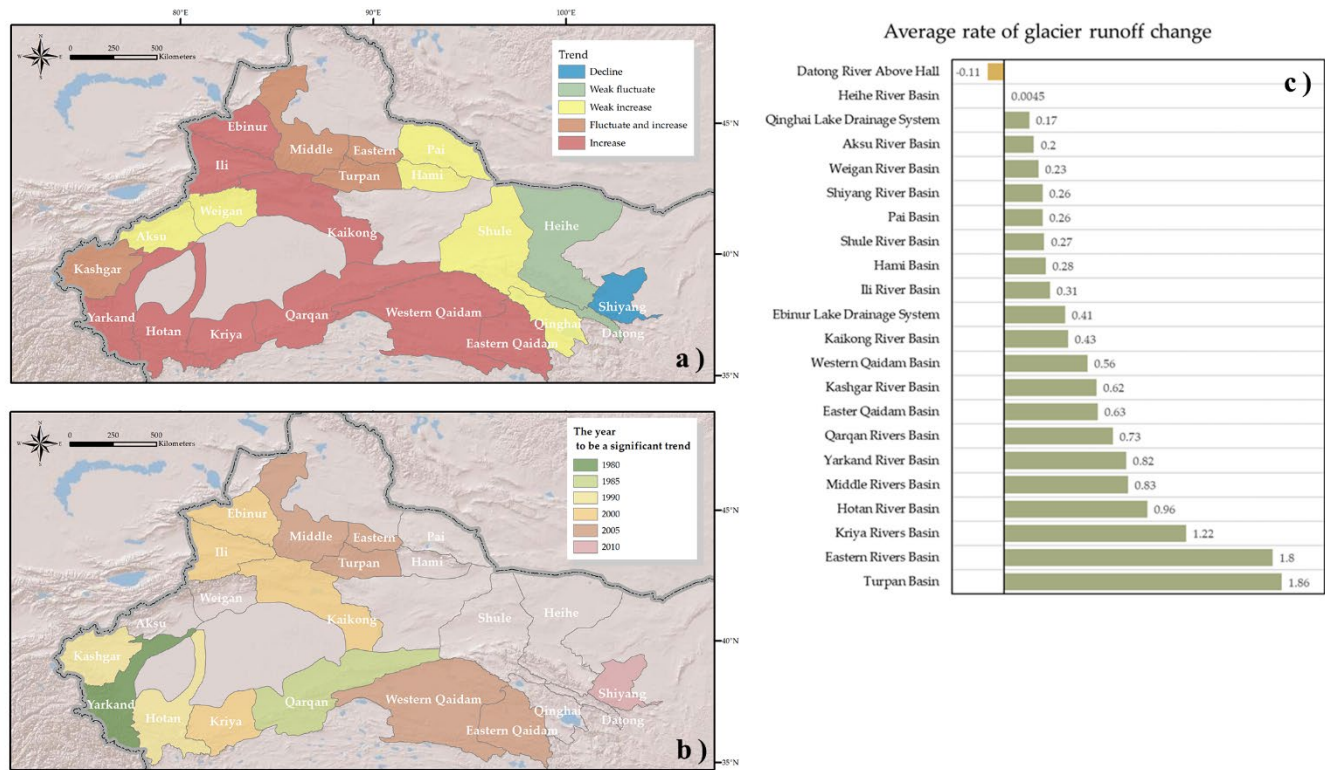
990 Mann-Kendall Test of total glacier runoff with a confidence of 95%.



991 *Note.* in a) Aksu River Basin, b) Datong River Above Hall, c) Eastern Qaidam Basin, d) Eastern Rivers Basin, e) Ebinur  
 992 Lake Drainage System, f) Hami Basin, g) Heihe River Basin, h) Hotan River Basin, i) Ili River Basin, j) Kai-kong River  
 993 Basin, k) Kashgar River Basin, l) Kriya Rivers Basin, m) Middle Rivers Basin, n) Pai Basin, o) Qarqan Rivers Basin,  
 994 p) Qinghai Lake Drainage System, q) Shiyang River Basin, r) Shule River Basin, s) Turpan Basin, t) Weigan River Basin,  
 995 u) Western Qaidam Basin, v) Yarkand River Basin, w) Entire Basins. **Blue line referred to the UF curve and red line**  
 996 **referred to the UB curve.**



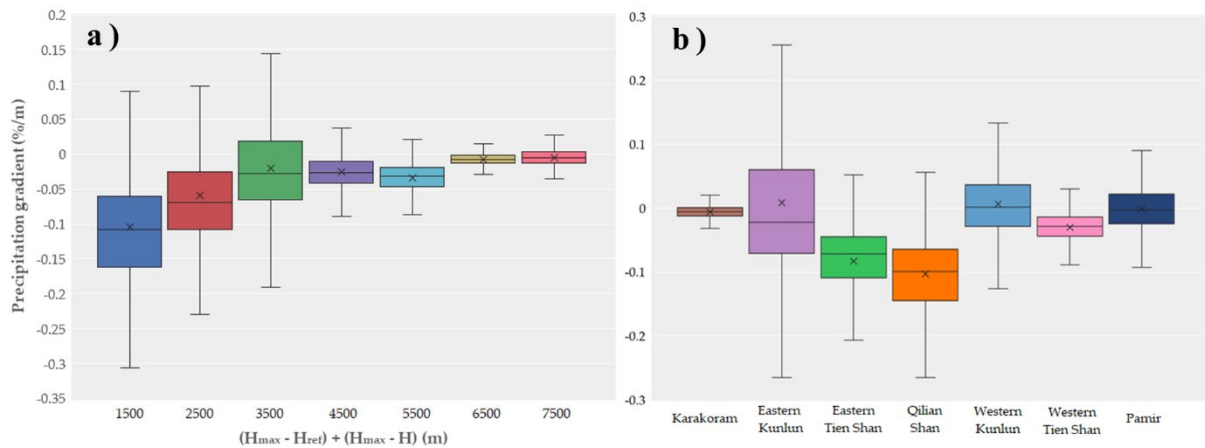
**Figure 6**  
Spatiotemporal regime of glacier runoff in the DAC. a) the trend of glacier runoff, b) the year with a significant trend, and c) the average rate of glacier runoff change.



**Note.** The trends classified as “weak fluctuating” and “weak increase” had no significant time. Except for Shiyang River basin and Datong River above Hall, glacier runoff increased from 1961 to 2015. World Shaded Relief provided by Esri ([http://goto.arcgisonline.com/maps/World\\_Shaded\\_Relief](http://goto.arcgisonline.com/maps/World_Shaded_Relief)).



**Figure 7**  
Box plots of precipitation gradients for  $\Delta H + (H_{max} - H)$  (m) and each glacier region.



Note. Line: median; multiple sign: average number; box: 25–75% of the observations; whiskers: min and max non-outliers.

**Figure 8**  
Proportion of delayed runoff and meltwater runoff to a) agricultural water consumption, b) municipal water consumption and c) industrial water consumption.

