



1 Change in Frozen Soils and its Effect on Regional Hydrology in the
2 Upper Heihe Basin, the Northeast Qinghai-Tibetan Plateau

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19 **ABSTRACT:**

20 Frozen ground has an important role in regional hydrological cycle and ecosystem,
21 especially on the Qinghai-Tibetan Plateau, which is characterized by high elevation and
22 a dry climate. This study modified a distributed physically-based hydrological model
23 and applied it to simulate the long-term (from 1961 to 2013) change of frozen ground
24 and its effect on hydrology in the upper Heihe basin located at Northeast Qinghai-
25 Tibetan Plateau. The model was validated carefully against data obtained from multiple
26 ground-based observations. The model results showed that the permafrost area shrank
27 by 9.5% (approximately 600 km²), especially in areas with elevation between 3500 m
28 and 3900 m. The maximum frozen depth of seasonally frozen ground decreased at a
29 rate of approximately 4.1cm/10yr, and the active layer depth over the permafrost
30 increased by about 2.2 cm/10yr. Runoff increased significantly during cold seasons
31 (November-March) due to the increase in liquid soil moisture caused by rising soil
32 temperature. Areas where permafrost changed into the seasonally frozen ground at high
33 elevation showed especially large changes in runoff. Annual runoff increased due to
34 increased precipitation, the base flow increased due to permafrost degradation, and the
35 actual evapotranspiration increased significantly due to increased precipitation and soil
36 warming. The groundwater storage showed an increasing trend, which indicated that
37 the groundwater recharge was enhanced due to the degradation of permafrost in the
38 study area.

39 **KEYWORDS:** permafrost; frozen ground; active layer, soil moisture; soil temperature;
40 runoff, distributed hydrological model



41 1. Introduction

42 Hydrological processes on the Qinghai-Tibetan Plateau, which is characterized by high
43 elevation and cold climate are greatly influenced by cryosphere processes. In recent
44 years, the runoff change in the Qinghai-Tibetan Plateau has received increasing
45 attentions due to its significant effect on water resources and the ecosystem (Cuo et al.,
46 2014). The change in frozen soils and its effect on hydrological processes is a key
47 scientific issue (Yang et al., 2010; Cheng and Jin, 2013). Frozen soils including
48 permafrost and seasonally frozen ground, have active interactions with land surface
49 hydrological processes. Changes in frozen soils alter land surface infiltration, soil
50 drainage, and subsurface water storage and influences the partition of direct surface
51 runoff and subsurface flow. Hydrological changes caused by frozen soils can greatly
52 impact land-atmosphere interactions and thus the water balance and energy balance of
53 the land surface. Understanding the changing frozen soil conditions and their impact on
54 hydrological processes is important for water resources management and ecosystem
55 protection on the Qinghai-Tibetan Plateau.

56 Several previous observation-based studies have examined long-term changes in
57 frozen soils and their impacts on hydrological processes. Some studies reported that
58 permafrost thawing might enhance base flow, especially runoff in winter in the Arctic
59 and the Subarctic (Walvoord et al., 2016; Jacques and Sauchyn, 2009; Ye et al., 2009)
60 and in Northeast China (Liu et al., 2003). A few studies argued that permafrost thawing
61 might reduce river runoff (Qiu, 2012). These studies used either in-situ observations in
62 experimental catchments or long-term meteorological observations. Field experiments



63 are usually at the plot scale for a short period, which might lose the spatial variability
64 and long-term trends, and the long-term meteorological observations do not provide
65 data on soil freezing and thawing processes (McClelland et al., 2004; Liu et al., 2003;
66 Niu et al., 2011). Previous observation-based studies focus either on runoff trends or
67 changes in frozen soils; few studies thoroughly discuss the relationship between runoff
68 trends and changes in frozen soils. The impact of the change in frozen soils on regional
69 hydrological processes is not fully understood based on the existing observations and it
70 is difficult to attribute the long-term trends of streamflow to the change in frozen soils
71 (Woo et al., 2008).

72 Hydrological models have been widely used to analyze the regional hydrological
73 changes under changing environmental conditions; however most hydrological models
74 do not consider the freezing-thawing processes in soil. Some studies incorporate simple
75 freezing-thawing schemes into the hydrological models (Rawlins et al., 2003; Chen et
76 al., 2008), but do not simulate the soil thermal fluxes. The SiB2 model (Sellers et al.,
77 1996), the modified VIC model (Cherkauer and Lettenmaier, 1999) and the CLM model
78 (Oleson et al., 2010) consider the land surface energy balance and soil heat transfer
79 processes, but do not represent the complex landscape at the catchment scale. The
80 GEOTop model simulates the three-dimensional water flux and vertical heat transfer in
81 soil, but it is difficult to apply at the regional scale. Wang et al. (2010) and Zhang et al.
82 (2013) incorporated frozen soil schemes in a distributed hydrological model and
83 showed improved performance in a small mountainous catchment. Rawlins et al. (2013)
84 analyzed the impact of future climate change at 4 sites in Alaska. Subin et al. (2013)



85 and Lawrence et al. (2015) used the CLM model to simulate the change in permafrost
86 at global scale. Cuo et al. (2015) simulated frozen soil degradation and its effects on
87 surface hydrology at the plot scale using the VIC model. The previous modelling
88 studies focused on simulations of the changes in frozen soils and the hydrological
89 impacts at either the small scale or global/continental scale. Regional modelling studies
90 linking the frozen soils changes and hydrological responses were inadequate.

91 The Qinghai-Tibetan Plateau is the Asian water tower, and water availability on the
92 plateau is very important for water supply and food security in the downstream regions
93 with large populations (Walter et al., 2010). Different from the Arctic and Subarctic,
94 the permafrost thickness on the Qinghai-Tibetan Plateau is relatively thin and warm,
95 and the frozen depth of the seasonally frozen soils is also shallow (Yang et al., 2010).
96 Therefore, frozen soil processes in the Qinghai-Tibetan Plateau are more sensitive to
97 rising air temperature (Yang et al., 2010). Due to the drier climate and warmer soil, the
98 frozen soil processes are more closely related to the hydrological processes on the
99 Qinghai-Tibetan Plateau than they are in the Arctic and Subarctic regions. There is also
100 higher spatial variability in topography and landscapes on the Qinghai-Tibetan Plateau
101 where the permafrost and seasonally frozen ground coexist.

102 An evident increase in the annual and seasonal air temperature has been observed
103 in the Qinghai-Tibetan Plateau (Li et al., 2005; Liu and Chen, 2000; Zhao et al., 2004).
104 Several studies have shown changes in frozen soils based on the long-term observations.
105 For example, Cheng and Wu (2007) analyzed the borehole observations of soil
106 temperature profiles on the Qinghai-Tibetan Plateau and found that the active layer



107 thickness of frozen soils increased by 0.15-0.50 m during the period of 1996-2001.
108 Zhao et al. (2004) found a decreasing trend of freezing depth in the seasonal frozen
109 soils using observations from 50 stations. Several studies analyzed the relationship
110 between the change in frozen soils and streamflow based on observed data (Zhang et
111 al., 2003; Jin et al., 2009; Niu et al., 2011). However, these studies have not addressed
112 the spatial and temporal variations of the frozen soils. The spatio-temporal
113 characteristics of the long-term change in frozen soils is not sufficiently clear. The
114 magnitude of the effect of frozen soils on regional hydrology remains unclear, and the
115 modelling studies on frozen soils changes and their hydrological impacts are
116 insufficient. Therefore, integrated study based on the long term simulation of soil
117 freezing/thawing processes and the hydrological responses is needed.

118 Through a comprehensive experiment (Li et al., 2013) in a major research plan
119 entitled “Integrated research on the ecohydrological processes of the Heihe basin”
120 funded by the National Natural Science Foundation of China (NSFC) (Cheng et al.,
121 2014), this study aims: (1) to develop a distributed hydrological model coupling the
122 cryosphere processes especially the soil freezing-thawing processes; (2) to simulate the
123 spatial and temporal changes in frozen soils and to analyze the effects of frozen soils
124 change on hydrological processes in the upper Heihe basin located on the Northeastern
125 Qinghai-Tibetan Plateau.

126 2. Study area and data

127 2.1 The Heihe River and upper Heihe basin

128 The Heihe River is one of the major inland basins in Northwest China. As shown in



Figure 1, the upper reaches of Heihe River are located on the Northeastern Qinghai-Tibetan Plateau at an elevation of 2200-5000 m and with a drainage area of 10009 km², it supplies most of the water resources to the middle and lower reach (Cheng et al., 2014). The annual precipitation in the upper Heihe basin ranges from 200 to 700 mm, and the annual mean air temperature ranges from -9 to 5°C. Permafrost dominates high elevation region above 3700 m (Wang et al., 2013) and seasonal frozen ground covers other parts of the study area. Glaciers are found at an elevation above 4000 m, covering approximately 0.8% of the upper Heihe basin. There are two tributaries (East and West Tributaries) in the upper Heihe basin, on which two hydrological stations are located, namely, Qilian (on the east tributary) and Zhamashike (on the west tributary). The outlet of the upper Heihe basin has a hydrological station, namely Yingluoxia (see Figure 1).

2.2 Data used in the study

(1) Input data of the model

The atmosphere forcing data used to drive the hydrological model include a 1-km resolution gridded dataset of daily precipitation, air temperature, sunshine hours, wind speed and relative humidity. The gridded daily precipitation is interpolated from observations at meteorological stations (see Figure 1) provided by the China Meteorological Administration (CMA) using the method developed by Shen and Xiong (2015). The other atmosphere forcing data are interpolated by observations at meteorological stations using the inverse distance weighted method. The interpolation of air temperature considers the temperature gradient with elevation which is provided by the HiWATER experiment (Li et al., 2013).



151 The land surface data used to build the model include land use, topography, leaf
152 area index, and soil parameters. The topography data are obtained from the SRTM
153 dataset (Jarvis et al., 2008) with a spatial resolution of 90 m. The land use/cover data
154 are provided by the Institute of Botany, Chinese Academy of Sciences (Zhou and Zheng,
155 2014). The leaf area index (LAI) data with 1-km resolution are obtained from the
156 dataset developed by Fan (2014). The soil water parameters and soil physical
157 parameters of each grid are obtained from the 1-km dataset developed by Song et al.
158 (2016), which includes the saturated hydraulic conductivity, residual soil moisture
159 content, saturated soil moisture content, soil sand matter content, soil clay matter
160 content and soil organic matter content.

161 (2) Data used for model calibration and validation

162 This study uses the observed daily river discharge data at the Yingluoxia, Qilian
163 and Zhamashike stations, the daily soil temperature of different depths at the Qilian
164 station and the daily frozen depths at the Qilian and Yeniugou stations for model
165 calibration and validation. Daily river discharge data are obtained from the Hydrology
166 and Water Resources Bureau of Gansu Province. Daily soil temperature data observed
167 at the Qilian station which is from January 1, 2004 to December 31, 2013 and daily
168 frozen depth data observed at the Qilian and Yeniugou station from January 1, 2002 to
169 December 31, 2013 are provided by CMA.

170 To investigate the spatial distribution of permafrost, boreholes were drilled during
171 the NSFC major research plan. Temperature observations at six boreholes, whose
172 location are shown in Figure 1, are provided by Wang et al. (2013). The borehole depth



173 is 100 m for T1, 69 m for T2, 50 m for T3 and 90 m for T4, and 20 m for T5 and T7.
174 Monthly actual evapotranspiration data with 1-km resolution during the period of 2002-
175 2012 estimated using remote sensing data (Wu et al., 2012; Wu, 2013) are used to
176 evaluate the model-simulated evapotranspiration. We also used field observations of
177 the hourly liquid soil moisture to validate the model simulation of frozen soils. The
178 HiWATER experiment (Li et al., 2013; Liu et al., 2011) provided the soil moisture data
179 observed at the A'rou Sunny Slope station (100.52 E, 38.09 N), which is available from
180 January 1, 2014 to December 31, 2014.

181 **3. Methodology**

182 **3.1 Brief introduction of the hydrological model**

183 This study used a distributed hydrological model GBEHM (geomorphology-based
184 ecohydrological model), which was developed in an integrated research project under
185 the major research plan of “Integrated research on the ecohydrological process of the
186 Heihe River Basin” (Yang et al., 2015; Gao et al., 2016). The GBEHM used 1-km grid
187 system to discretize the study catchment. Based on the 1-km digital elevation model
188 (DEM), the study catchment was divided into 251 sub-catchments. A sub-catchment
189 was further divided into flow-intervals along the main stream of the sub-catchment
190 (Yang et al., 2015). To capture the sub-grid topography, the grid was represented by a
191 number of hillslopes with an average length and gradient, but different aspect, which
192 were estimated from the 90-m DEM. The terrain properties of a hillslope include the
193 slope length and gradient, slope aspect, the soil type and vegetation type (Yang et al.,
194 2015).



195 The hillslope is the basic unit for the hydrological simulation, on which the water
 196 and heat transfer (both of conduction and convection) in the vegetation canopy, snow
 197 cover/glacier, soil layers are simulated. The canopy interception, radiation transfer in
 198 the canopy and the energy balance of the land surface are described using the methods
 199 developed in SIB2 (Sellers et al., 1985, 1996). The surface runoff on the hillslope is
 200 solved using the kinematic wave equation. The groundwater aquifer is considered an
 201 individual storage corresponding to each grid. Exchange between the groundwater and
 202 the river water is calculated using Darcy's law (Yang et al., 1998, 2002).

203 The model runs with a time step of 1 hour. Runoff generated from the grid is the
 204 lateral inflow into the river at the same flow interval in the corresponding sub-
 205 catchment. Flow routing in the river network is calculated using the kinematic wave
 206 equation following the sequence determined by the Horton-Strahler scheme (Yang et
 207 al., 1998, 2015).

208 **3.2 Simulation of cryospherical processes**

209 The simulation of cryosphere processes in GBEHM includes glacier ablation, snow
 210 melt, and soil freezing and thawing.

211 (1) Glacier ablation

212 Glacier ablation is simulated using an energy balance model (Oerlemans, 2001) as:

$$213 \quad Q_M = SW(1-\alpha) + LW_{in} - LW_{out} - Q_H - Q_L - Q_G + Q_R \quad (1)$$

214 where Q_M is the net energy absorbed by the surface of the glacier (W/m^2); SW is the
 215 incoming shortwave radiation (W/m^2); α is the surface albedo; LW_{in} is the incoming
 216 longwave radiation (W/m^2); LW_{out} is the outgoing longwave radiation (W/m^2); Q_H is



the sensible heat flux (W/m^2); Q_L is the latent heat flux (W/m^2); Q_R is the energy from rainfall (W/m^2); and Q_G is the penetrating shortwave radiation (W/m^2). The surface albedo is calculated as (Oerlemans and Knap, 1998):

$$\alpha = \alpha_{snow} + (\alpha_{ice} - \alpha_{snow})e^{-h/d^*} \quad (2)$$

where α_{snow} is the albedo of snow on the glacier surface; α_{ice} is the albedo of the ice surface; h is the snow depth on the glacier surface (m); d^* is a parameter of the snow depth effect on the albedo (m).

The amount of melt water is calculated as (Oerlemans, 2001):

$$M = \frac{Q_M}{L_f} dt \quad (3)$$

where dt is the time step used in the model (s) and L_f is the latent heat of fusion (J/kg).

(2) Snow melt

A multi-layer snow cover model is used to describe the mass and energy balance of snow cover. For each snow layer, temperature is solved using an energy balance approach (Bartelt and Lehnin, 2002):

$$C_s \frac{\partial T_s}{\partial t} - L_f \frac{\partial \rho_i \theta_i}{\partial t} = \frac{\partial}{\partial z} (K_s \frac{\partial T}{\partial z}) + \frac{\partial I_R}{\partial z} + Q_R \quad (4)$$

where C_s is the heat capacity of snow ($J m^{-3} K^{-1}$); T_s is the temperature of the snow layer (K); ρ_i is the density of the ice (kg/m^3); θ_i is the volumetric ice content; K_s is the thermal conductivity of snow ($W m^{-1} K^{-1}$); L_f is the latent heat of ice fusion (J/kg); I_R is the radiation transferred into the snow layer (W/m^2) and Q_R is the energy brought by rainfall (W/m^2) which is only considered for the top snow layer. The solar radiation transfer in the snow layers and the snow albedo are simulated using the SNICAR model which is solved using the method developed by Toon et al. (1989). Eq.



(4) is solved using a finite differential scheme.

The mass balance of the snow layer is described as (Bartelt and Lehnin, 2002):

$$\frac{\partial \rho_l \theta_l}{\partial t} + M_{iv} + M_{il} = 0 \quad (5)$$

$$\frac{\partial \rho_l \theta_l}{\partial t} + \frac{\partial U_l}{\partial z} + M_{lv} - M_{il} = 0 \quad (6)$$

where ρ_l is the density of the liquid water (kg/m^3); θ_l is the volumetric liquid water content; U_l is the liquid water flux ($\text{kg m}^{-2} \text{s}^{-1}$); M_{iv} is the mass of ice that is changed into vapor within a time step ($\text{kg m}^{-3} \text{s}^{-1}$); M_{il} is the mass of ice that is changed into liquid water within a time step ($\text{kg m}^{-3} \text{s}^{-1}$); and M_{lv} is the mass of liquid water that is changed into vapor within a time step ($\text{kg m}^{-3} \text{s}^{-1}$). The liquid water flux of the snow layer is calculated as (Jordan, 1991):

$$U_l = -\frac{K_l}{\mu_l} \rho_l^2 g \quad (7)$$

where K_l is the hydraulic permeability (m^2), μ_l is dynamic viscosity of water at 0°C ($1.787 \times 10^{-3} \text{ N s/m}^2$), ρ_l is the density of liquid water (kg/m^3) and g is gravitational acceleration (m/s^2). The water flux of the bottom snow layer is considered snowmelt runoff.

(3) Soil freezing and thawing

The energy balance of the soil layer is solved as (Flerchinger and Saxton, 1989):

$$C_s \frac{\partial T}{\partial t} - \rho_i L_f \frac{\partial \theta_i}{\partial t} - \frac{\partial}{\partial z} (\lambda_s \frac{\partial T}{\partial z}) + \rho_l c_l \frac{\partial q_l T}{\partial z} = 0 \quad (8)$$

where C_s is the volumetric soil heat capacity ($\text{J m}^{-3} \text{K}^{-1}$); T is the temperature (K) of the soil layers, z is the vertical depth of the soil (m); θ_i is the volume ice content; ρ_i is the density the ice (kg/m^3); λ_s is the thermal conductivity ($\text{W m}^{-1} \text{K}^{-1}$); ρ_l is the density of liquid water (kg/m^3); and c_l is the heat capacity of liquid water ($\text{J kg}^{-1} \text{K}^{-1}$).



261 In addition, q_l is the water flux between different soil layers (m/s) and is solved using
 262 the 1-D Richards equation. The unsaturated soil hydraulic conductivity is calculated
 263 using the modified van Genuchten's equation (Wang et al., 2010) as:

$$264 \quad K = f_{ice} K_{sat} \left(\frac{\theta_l - \theta_r}{\theta_s - \theta_r} \right)^{1/2} \left[1 - \left(\frac{\theta_l - \theta_r}{\theta_s - \theta_r} \right)^{-1/m} \right]^2 \quad (9)$$

265 where K is the unsaturated soil hydraulic conductivity (m/s); K_{sat} is the saturated soil
 266 hydraulic conductivity; θ_l is the volumetric liquid water content; θ_s is the saturated
 267 water content; θ_r is the residual water content; m is an empirical parameter in van
 268 Genuchten's equation and f_{ice} is an empirical hydraulic conductivity reduction factor
 269 which is calculated using soil temperature as (Wang et al., 2010):

$$270 \quad f_{ice} = \exp[-10(T_f - T_{soil})], \quad 0.05 \leq f_{ice} \leq 1 \quad (10)$$

271 where T_f is 273.15 K and T_{soil} is the soil temperature.

272 Eq. (8) solves the soil temperature with the upper boundary condition as the heat flux
 273 into the top surface soil layer. When the ground is not covered by snow, the heat flux
 274 from the atmosphere into the top soil layer is expressed as (Oleson et al., 2010):

$$275 \quad h = S_g + L_g - H_g - \lambda E_g + Q_R \quad (11)$$

276 where h is the upper boundary heat flux into the soil layer (W m^{-2}); S_g is the solar
 277 radiation absorbed by the top soil layer (W m^{-2}); L_g is the net long wave radiation
 278 absorbed by the ground (W m^{-2}), H_g is the sensible heat flux from the ground (W m^{-2});
 279 λE_g is the latent heat flux from the ground (W m^{-2}); and Q_R is the energy brought by
 280 rainfall (W/m^2). When the ground is covered by snow, the heat flux into the top soil
 281 layer is calculated as:

$$282 \quad h = I_p + G \quad (12)$$



283 where I_p is the radiation that penetrates the snow cover, and G is the heat conduction
284 from the bottom snow layer to the top soil layer. Eq (8) is solved using a finite
285 differential scheme with an hourly time step.

286 To simulate the permafrost we consider an underground depth of 50 m and assume
287 the bottom boundary condition as zero heat flux exchange. The vertical soil column is
288 divided into 39 layers in the model. The topsoil of 1.7 m is subdivided into 9 layers.
289 The first layer is 5 cm and the soil layer thickness increases linearly from 5 cm to 30
290 cm up to the depths of 0.8 m and then decreases linearly to 10 cm up to the depths of
291 1.7 m. There are 12 soil layers from 1.7 m to 3.0 m with a constant thickness of 10 cm.
292 From the depth of 3 m to 50 m, there are 18 layers with thickness increasing
293 exponentially from 10 cm to 12 m. The liquid soil moisture, ice content, and soil
294 temperature of each layers are calculated at each time step. The soil heat capacity and
295 soil thermal conductivity are estimated using the method developed by Farouki (1981).

296 3.3 Model calibration

297 In this study, model simulation during the period of 1961-2001 was used to spin up
298 to specify the initial values of the hydrological variables (e.g., soil moisture, soil
299 temperature, soil ice content, groundwater table, etc.). The period of 2002-2006 was
300 used for model calibration and the period of 2008-2012 was for model validation. The
301 daily soil temperature at the Qilian station and the frozen depths at the Qilian and
302 Yeniugou stations were used to calibrate the soil reflectance according to vegetation
303 type. The other parameters such as groundwater conductivity were calibrated according
304 to the streamflow discharge in the winter season. We calibrated the surface retention



capacity and surface roughness to match the observed flood peaks, and calibrated the leaf reflectance, leaf transmittance and maximum Rubisco capacity of the top leaf based on the remote sensing evapotranspiration data. Table 1 shows the major parameters used in the model.

4. Results

4.1 Validation result

Figure 2 shows the comparison of the model-simulated and observed soil temperature profiles at six boreholes. The model successfully captured the vertical distribution of the soil temperature at T1, T2, T3 and T4 in the permafrost area, but there were some overestimations above 20 m. The errors in simulating the vertical temperature profile near the surface might be due to simplification of the 3-D topography. At T5 located in seasonally frozen ground, the simulated soil temperature profile from approximately 4 m to 20 m does not agree well with the observed one. This error might be related to the heterogeneity of soil properties especially the thermal conductivity and heat capacity, which might not be accurately described by the current data. The model simulation agrees well with the borehole observation at T7, which is located at the transition zone from permafrost to seasonally frozen ground. This implies that the model well identified the lower limit of permafrost.

We also validated model simulation of the freezing/thawing cycles based on long-term observations of soil temperature and frozen depth. Figure 3 compares the simulated soil temperature with the observed temperature at the Qilian station, which is located in the seasonally frozen ground (observed daily soil temperature data are



327 available since 2004). Generally, the model simulations accurately captured the changes
328 in soil temperature profile. Validation of the soil temperature at different depths (5 cm,
329 10 cm, 20 cm, 40 cm, 80 cm, 160 cm, and 320 cm) showed that the root mean square
330 errors decreases with increasing depth. The errors was approximately 3°C for the top
331 three depths (5 cm, 10 cm and 20 cm). The error for depths of 40 cm and 80 cm was
332 2.5°C and 1.9°C, respectively, and the error was 0.9°C at a depth of 3.2 m. We
333 compared the model-simulated daily frozen depth with in-situ observations at the Qilian
334 and Yeniugou Stations from 2002 to 2014, as shown in Figure 4. The model accurately
335 reproduced the daily variations in frozen depth although the depth was underestimated
336 by approximately 50 cm at the Yeniugou station. In general, the validation of soil
337 temperature and frozen depth indicates that the model well captured the freezing and
338 thawing processes in the upper Heihe basin.

339 The observed hourly liquid soil moisture at the A'rou Sunny Slope station was used
340 as an independent additional validation. Figure 5 shows the comparison between the
341 simulated and observed liquid soil moisture at different depths from January 1 to
342 December 31 in 2014. The model simulation agreed well with the observed liquid soil
343 moisture during the freezing and thawing processes at different depths. However,
344 relatively larger errors existed in the simulations at a depth of 4 cm, which might be
345 related to the heterogeneity along the soil column that was not fully addressed in the
346 model.

347 Figure 6 compares the model simulated and the observed daily streamflow discharge
348 at the Yingluoxia, Qilian and Zhamashike station. The model simulation agreed well



349 with the observations. The model simulation captured the flood peaks and the
350 magnitude of base flow in both of the calibration and validation periods. In the
351 calibration period, the Nash-Sutcliffe efficiency (NSE) coefficient was 0.64, 0.65 and
352 0.70 for the Yingluoxia, Qilian and Zhamashike stations, respectively. In the validation
353 period, the NSE value were 0.65, 0.60, and 0.75. The relative error (RE) was within 10%
354 for both the calibration and validation period (see Table 2). Figure 7 shows the
355 comparison of the model-simulated monthly actual evaporation and remote sensing-
356 based evaporation data for the entire calibration and validation periods. The GBEHM
357 simulation showed similar temporal variations in actual evapotranspiration compared
358 with the remote sensing based estimation, and the root mean square error (RMSE) of
359 the simulated monthly evapotranspiration was 8.0 mm in the calibration period and 6.3
360 mm in the validation period. These validation results indicate that the model accurately
361 simulates the cryosphere hydrological processes in the upper Heihe basin.

362 **4.2 Long-term changes in freezing-thawing processes and frozen soils**

363 The freezing-thawing and hydrological processes of the upper Heihe basin from 1961
364 to 2013 were simulated by GBEHM. A 50-year run which repeated the atmosphere
365 forcing in the period of 1961-1970 was used to obtain the initial conditions. The long-
366 term changes in frozen soils, runoff and soil moisture were analyzed based on the model
367 simulation.

368 In the upper Heihe basin, the ground surface starts freezing in November and thawing
369 in April (Wang et al., 2015a). From November to March, the ground surface
370 temperature is below 0°C in both the permafrost and seasonally frozen ground regions,



371 and precipitation mainly falls in the period from April to October. Therefore, a year is
372 subdivided into two seasons, i.e., the freezing season (November to March) and the
373 thawing season (April to October) to investigate the changes in frozen soils and their
374 hydrological impact. Increasing of precipitation and air temperature in the study area in
375 both seasons in the past 50 years was reported in a previous study (Wang et al., 2015b).

376 Figure 8 shows the changes in the basin-averaged soil temperature in the freezing
377 and thawing seasons. The soil temperature increased in all seasons especially in the past
378 30 years. The increasing trend of soil temperature was larger in the freezing season than
379 in the thawing seasons. In the freezing season (Figure 8(a)), the top layer soil
380 temperature was lower than the deep layer soil temperature. The linear trend of the top
381 layer (0-0.5 m) soil temperature was $0.31^{\circ}\text{C}/10\text{yr}$ and the trend of the deep layer (2.5-3
382 m) soil temperature was $0.22^{\circ}\text{C}/10\text{yr}$. The soil temperature in deep layer (2.5-3 m)
383 changed from -1.1°C in the 1960s to near 0°C in the most recent decade. In the thawing
384 season (see Figure 8(b)), the increasing trend of the top layer (0-0.5 m) soil temperature
385 ($0.17^{\circ}\text{C}/10\text{yr}$) was greater than the trend of the deep layer (2.5-3 m) soil temperature
386 ($0.10^{\circ}\text{C}/10\text{yr}$).

387 Permafrost is defined as ground with a temperature at or below 0°C for at least two
388 consecutive years (Woo, 2012). This study differentiated permafrost from seasonally
389 frozen areas based on the simulated vertical soil temperature profile. For each year, the
390 frozen soil condition was determined by searching the soil temperature profile within a
391 four-year window from the previous three years to the current year. Figure 9 shows the
392 area change of the permafrost during 1961-2013. As shown in Figure 9 (a), the



393 permafrost areas decreased approximately 9.5% (6445 km² in the 1970s and 5831 km²
394 in the 2000s), indicating evident degradation of the permafrost in the upper Heihe basin
395 in the past 50 years.

396 Figure 9 (b) shows the changes in the basin-averaged maximum frozen depth for the
397 seasonally frozen ground and active layer thickness over the permafrost. The basin-
398 averaged annual maximum frozen depth showed a significant decreasing trend (4.1
399 cm/10yr). In addition, the maximum frozen depth had a significantly negative
400 correlation with the annual mean air temperature ($r = -0.73$). In contrast, an increasing
401 trend of active layer thickness in the permafrost regions was observed (2.2 cm/10yr),
402 which had a significantly positive correlation with the annual mean air temperature.

403 Figure 10 shows the frozen soils distributions in the period of 1971-1980 and in the
404 period of 2001-2010. Comparing the frozen soils distributions in the two periods, major
405 changes in frozen soils were observed on the sunny slopes at elevation between 3500
406 and 3700 m, especially in the west tributary, where large areas of permafrost changed
407 into seasonally frozen ground.

408 Figure 11 shows the monthly mean soil temperature over the areas with elevation
409 between 3300 and 3500 m and over areas with elevation between 3500 and 3700 m in
410 the upper Heihe basin. In the areas with elevation between 3300 and 3500 m located in
411 the seasonally frozen ground region, as shown in Figure 11(a), the frozen depth
412 decreased and the soil temperature in the deep layer (with depth greater than 2 m)
413 increased. Figure 11(b) shows that the increase in soil temperature was larger in the
414 area with higher elevation (3500-3700 m). This figure shows that the thickness of the



415 permafrost layer decreased as soil temperature increased, and the permafrost changed
416 into seasonally frozen ground after 2000.

417 **4.3 Changes in the water balance and the hydrological processes**

418 Table 3 shows the decadal changes in the annual water balance from 1961 to 2010
419 based on the model simulation. The annual precipitation, annual runoff and annual
420 runoff ratio had the same decadal variation; however the annual evapotranspiration
421 maintained an increasing trend since the 1970s which was consistent with the rising air
422 temperature and soil warming. Although the actual evapotranspiration increased, the
423 runoff ratio remained stable during the 5 decades because of the increased precipitation.

424 The changes in runoff (both simulated and observed) in different seasons are shown
425 in Figure 12 and Table 4. The model-simulated and observed runoff both showed a
426 significant increasing trend in the freezing season and in the thawing season. This
427 indicates that the model simulation accurately reproduced the observed long-term
428 changes. In the freezing season, since there was no glacier melt and snow melt (see
429 Table 4), runoff was mainly the subsurface flow. In the thawing season, as shown in
430 Table 4, snowmelt runoff contributed approximately 16% of the total runoff and glacier
431 runoff contributed only a small fraction of total runoff (approximately 2.4%). Therefore,
432 rainfall runoff was the major component of total runoff in the thawing season, and the
433 runoff increasing in the thawing season was mainly due to increased rainfall runoff. As
434 shown in Figure 12, the actual evapotranspiration increased significantly in both
435 seasons due to increased precipitation and soil warming. The increasing trend of the
436 actual evapotranspiration was higher in the thawing season than in the freezing season,



437 which indicates that the actual evapotranspiration was limited by the water available in
438 this region.

439 Figure 13 shows the changes in the basin-averaged annual water storage in the top
440 0-3 m layer and the groundwater storage. The annual liquid water storage of the top 0-
441 3 m showed a significant increasing trend especially in the most recent 3 decades. This
442 long-term change in liquid water storage was similar to the runoff change in the freezing
443 season, as shown in Figure 12 (a), with a correlation coefficient of 0.80. The annual ice
444 water storage in the top 0-3 m soil showed significant decreasing trend due to frozen
445 soils changes. Annual groundwater storage showed a significantly increasing trend
446 especially in the most recent 3 decades, which indicates the groundwater recharge
447 increases with the frozen soil degradation.

448 5. Discussion

449 5.1 Impact of frozen soils changes on the soil moisture and runoff

450 Figure 14 shows the spatial-averaged liquid soil moisture changes in the region
451 covered by seasonally frozen ground with elevation between 3300 and 3500 m and in
452 the area with elevation between 3500 and 3700 m where the permafrost changed into
453 seasonally frozen ground. In the seasonally frozen ground with elevation of 3300-3500
454 m (Figure 14(a)), by comparing with the soil temperature shown in Figure 11 (a), we
455 can see that the liquid soil moisture increase was mainly caused by the decrease in the
456 frozen depth. The liquid soil moisture in the deep soil layer increased significantly since
457 1990s (see Figure 14(b)) in the area with elevation of 3500-3700 m where the
458 permafrost changed to seasonally frozen ground. Compared with the soil temperature



change shown in Figure 11 (b), the liquid soil moisture increases in this region was mainly caused by the change of permafrost to seasonally frozen ground, indicating that the frozen soils degradation caused a significant increase in liquid soil moisture. Therefore, the basin-averaged liquid soil moisture was highly correlated with the soil temperature in the freezing seasons as shown in Table 5. The liquid soil moisture was also highly correlated with soil temperature in the thawing season, because of the increase in the active layer thickness of the permafrost and degradation of the permafrost (i.e., the change from permafrost to seasonally frozen ground). This correlation was larger than the correlation between liquid soil moisture and precipitation because the liquid soil moisture increase caused by the permafrost degradation is more significant than the liquid soil moisture increase caused by increased precipitation in the thawing season.

In the freezing season, since the surface ground is frozen, runoff is mainly subsurface flow coming from seasonally frozen ground. Table 5 shows that runoff has the highest correlation with the liquid soil moisture in the freezing season, which indicates that the frozen soils change was the major cause of the increased liquid soil moisture, resulting in increased runoff in the freezing season. During the past 50 years, parts of the permafrost changed into seasonally frozen ground, and the thickness of the seasonally frozen ground decreased, which led to increased liquid soil moisture in the deep layers during the freezing season as shown in Figure 14. The increase in liquid soil moisture also increased the hydraulic conductivity which enhanced the subsurface flow.

In the thawing season from April to October, the thickness of the seasonally frozen



481 ground rapidly decreased to zero and the thaw depth of permafrost reached the
482 maximum. Runoff in the thawing season was mainly rainfall runoff as shown in Table
483 4. Table 5 shows that runoff was more strongly correlated with precipitation and
484 relatively more weakly correlated with liquid soil moisture, which illustrates that the
485 increased runoff mainly came from increased precipitation in the thawing season. The
486 correlation between runoff and liquid soil moisture in the thawing season was mainly
487 due to the high correlation between the liquid soil moisture and the precipitation.

488 Figure 15 shows the changes in areal mean runoff along the elevation for different
489 seasons. There was a large difference in runoff variation with the elevation during the
490 different seasons. In the freezing season, the runoff change from the 1970s to the 2000s
491 in the region of seasonally frozen ground (mainly located below 3500 m, see Figure 10)
492 was relatively small. Runoff in the areas with elevation of 3500-3900 m showed larger
493 change. This is due to the shift from permafrost to seasonally frozen ground in some
494 areas with elevation range of 3500-3900 m as simulated by the model, particularly for
495 the sunny hillslopes (see Figure 10). This illustrates that a change from the permafrost
496 to the seasonally frozen ground has a larger impact on the runoff than a change in frozen
497 depth in seasonally frozen ground. In the thawing season runoff increased with
498 elevation due to the increase in precipitation with increasing elevation, and the runoff
499 increase was mainly determined by increased precipitation (Gao et al., 2016).
500 Precipitation in the region with elevation below 3100 m was low but air temperature
501 was high. Runoff in this region decreased during 2001-2010 compared to 1971-1980
502 because of higher evapotranspiration.



503 **5.2 Comparison with the previous similar studies**

504 In this study, the model simulation showed that changes in frozen soils led to
505 increased freezing season runoff and base flow in the upper Heihe basin. This result is
506 consistent with previous findings based on the trend analysis of streamflow
507 observations in high latitude regions (Walvoord et al., 2016; Jacques and Sauchyn, 2009;
508 Ye et al., 2009) and in Northeast China (Liu et al., 2003). However, those studies lacked
509 of spatial variability. This study found that the impact of the change in frozen soils on
510 runoff had regional characteristics. In the upper Heihe basin (see Figure 15), a change
511 in frozen soils led to the increased runoff at higher elevations but led to decreased runoff
512 at lower elevation region during the freezing season. This implies that change of the
513 freezing season runoff was controlled by the permafrost degradation in higher elevation
514 region but by the evaporation increase in the lower elevation region due to the air
515 temperature rising. However, runoff at the basin scale mainly came from the higher
516 elevation regions.

517 This study also showed that the change in frozen soils increased the soil moisture in
518 the upper Heihe basin, which is consistent with the finding of Subin et al. (2013) using
519 the CLM model simulation in north latitude permafrost regions, and the findings of Cuo
520 et al. (2015) using VIC model simulation at 13 sites on the Tibetan Plateau. However,
521 Lawrence et al. (2015) found that permafrost thawing caused soil moisture drying based
522 on CLM model simulations for the global permafrost region. This might be related to
523 the uncertainties in the soil water parameters and the highly spatial heterogeneity of soil
524 properties, which are difficult to consider in a global-scale model. Subin et al. (2013)



525 and Lawrence et al. (2015) modelled the soil moisture changes in the active layer of
526 permafrost in large areas with coarse spatial resolution. This study revealed the spatio-
527 temporal variability of soil moisture with high spatial resolution and analyzed the
528 correlations with the change in frozen soils.

529 Wu and Zhang (2010) focused on the changes in the active layer thickness at 10 sites
530 in the permafrost region on the Tibetan Plateau and found a significant increasing trend
531 during the period of 1995-2007, which is consistent with the result of this study. Jin et
532 al. (2009) found decreased soil moisture and runoff due to the permafrost degradation
533 based on observation at the plot scale in the source areas in the Yellow River basin. This
534 result is different from the present study, possibly due to the difference of
535 hydrogeological structure and the soil hydraulic parameters in the source area of Yellow
536 River from those in the upper Heihe basin. Wang et al. (2015a) focused on the change
537 in the seasonally frozen ground in the Heihe River basin based on plot observations,
538 and the increasing trend of the maximum frozen depth was estimated as 4.0 cm/10yr
539 during 1972-2006, which is consistent with the GBEHM model simulation in this study.
540 The increase in groundwater storage illustrated in this study is also consistent with the
541 finding of Cao et al. (2012) based on the GRACE data which showed that groundwater
542 storage increased during the period of 2003~2008 in the upper Heihe basin.

543 **5.3 Uncertainty in the frozen soil simulation**

544 Estimation of the change in permafrost area is a great challenge due to the complex
545 climatology, vegetation, geology. Different methods produce large differences in their
546 estimation results. Jorgenson et al. (2006) found a 4.4% decrease in the area of



547 permafrost in Arctic Alaska from 1982 to 2001 based on airphotos analysis. Wu et al.
548 (2005) reported that the permafrost area decreased by 12% from 1975 to 2002 in the
549 Xidatan basin, Qinghai-Tibetan Plateau based on a ground penetration radar survey. Jin
550 et al. (2006) found an area reduction of 35.6% in island permafrost in Liangdaohe,
551 which is located at the southern Qinghai-Tibet Highway, from 1975 to 1996. Chasmer
552 et al. (2010) found a 30% reduction of the discontinuous permafrost area in the
553 Northwest Territories, Canada from 1947 to 2008 based on remote sensing. This study
554 conducted an integrated simulation of permafrost change and regional hydrological
555 change. Compared with the site observation of Wang et al. (2013) shown in Figure 2,
556 this model slightly overestimated the soil temperature in permafrost areas, which might
557 lead to overestimation of the rate of permafrost area reduction.

558 There were two major uncertainties in the frozen soils simulation: uncertainty in the
559 land surface energy balance simulation and uncertainty in the simulation of the soil
560 heat-water transfer processes. Uncertainty in the land surface energy balance simulation
561 might result from the estimations of radiation and surface albedo due to the complex
562 topography, vegetation cover and soil moisture distribution, which may induce
563 uncertainties in the estimated ground temperature and thermal heat flux into the deep
564 layers. The uncertainty in simulation of soil heat-water transfer processes might result
565 from the soil water and heat parameters and the bottom boundary condition of heat flux.
566 Permafrost degradation is closely related to the thermal properties of rocks and soils,
567 geothermal flow and initial soil temperature and soil ice conditions. The lack of
568 observed initial condition data could also cause uncertainty in the permafrost change



569 estimation.

570 **6. Conclusion**

571 A distributed hydrological model coupled with cryospheric processes was developed
572 in the upper Heihe basin. The model was validated using available observations of soil
573 moisture, soil temperature, frozen depth, and streamflow discharge and was compared
574 with remote sensing based estimation of actual evapotranspiration. Based on the model
575 simulation from 1961 to 2013, the changes in frozen soils and the effect of the frozen
576 soils change on hydrological processes were examined. The conclusions derived in this
577 study are:

578 (1) The distributed hydrological model developed in this study accurately simulated
579 the cryosphere hydrological processes in the upper Heihe basin, and can be used to
580 analyze change in frozen soils and the impacts on hydrological processes on the high
581 and cold plateau.

582 (2) Significant degradation of frozen soils was found in the upper Heihe basin due to
583 the increasing air temperature over the last 50 years. The permafrost area decreased by
584 9.5% in the period of 1961-2013 and changed into seasonally frozen ground, especially
585 in areas at elevation between 3500 m and 3900 m. The annual maximum frozen depth
586 showed a significant decreasing trend of 4.1 cm/10yr in the seasonally frozen ground,
587 and the active layer thickness increased 2.2 cm/10yr in the permafrost regions.

588 (3) In the freezing season (November-March), runoff was mainly subsurface flow
589 which increased significantly in the higher elevation region due to the change in frozen
590 soils during the study period. In the thawing season (April-October), runoff mainly



591 came from rainfall and showed an increasing trend at the higher elevations due to the
592 increased precipitation. In both the freezing and thawing seasons, runoff decreased in
593 the lower elevation region due to increased evaporation caused by rising air temperature.
594 Since the runoff at the basin scale is mainly from the higher elevation regions, annual
595 runoff showed a significant increasing trend due to the increased precipitation, and the
596 base flow increased due to the degradation of frozen soils in the study period.

597 (4) Annual liquid water storage showed a significant increasing trend especially in
598 the most recent three decades, due to the change in frozen soils. Annual ice water
599 storage in the top 0-3 m of soil showed a significant decreasing trend due to soil
600 warming. Annual groundwater storage had an increasing trend, which indicated that
601 groundwater recharge was enhanced in the last 50 years.

602 (5) Regions where the permafrost changed into the seasonally frozen ground showed
603 larger changes in runoff and soil moisture than area covered by seasonally frozen
604 ground at low elevations.

605 There were uncertainties in the frozen soils and the hydrological processes
606 simulations that might be related to the soil properties, the high spatial heterogeneity,
607 the parameterization of the lower boundary of deep soils, which was important for
608 simulating the permafrost thawing process, and the other factors. In addition, the
609 interactions between the change in frozen soils, vegetation dynamics and hydrological
610 processes need to be investigated in the future study to better understand the change in
611 ecohydrological processes.

612



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778 **Figure caption:**

779 Figure 1. The Study area, hydrological stations, borehole observation and flux tower stations

780 Figure 2. Comparison of the simulated and the observed soil temperature at borehole observation

781 sites, and the observed data is provided by Wang et al. (2013)

782 Figure 3. Daily soil temperature at the Qilian station: (a) observation; (b) simulation; (c) Simulation-

783 Observation

784 Figure 4. Comparison of the simulated and observed daily frozen depths during the period of 2002-

785 2014 at: (a) the Qilian station, (b) the Yeniugou station

786 Figure 5. Comparison of the simulated and the observed hourly liquid soil moisture at the A'rou

787 Sunny Slope station

788 Figure 6. Comparison of the simulated and the observed daily river discharge at: (a) the Yingluoxia

789 Gauge, (b) the Qilian Gauge, and (c) the Zhamashike Gauge.

790 Figure 7. Comparison of the simulated and the remote sensing estimated actual evapotranspiration

791 in the period of 2002~2012

792 Figure 8. Changes of the mean soil temperature in different seasons: (a) the freezing season (from

793 November to March) (b) the thawing season (from April to October)

794 Figure 9. Change of the frozen soils in the upper Heihe basin: (a) areas of permafrost and basin

795 averaged annual air temperature; (b) the basin averaged annual maximum frozen depth of the

796 seasonally frozen ground and the annual maximum thaw depth of the permafrost

797 Figure 10. Distribution of permafrost and seasonally frozen ground: (a) distribution in

798 the period of 1971-1980; (b) distribution in the period of 2001-2010; (c) percentage of areas of

799 permafrost and seasonally frozen ground at sunny slope; (d) percentage of areas of permafrost and



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803 areas where permafrost changed to seasonally frozen ground with elevation between 3500-3700 m

804 Figure 12. Changes of the runoff and actual evapotranspiration: (a) in the freezing season; (b) in the

805 thawing season

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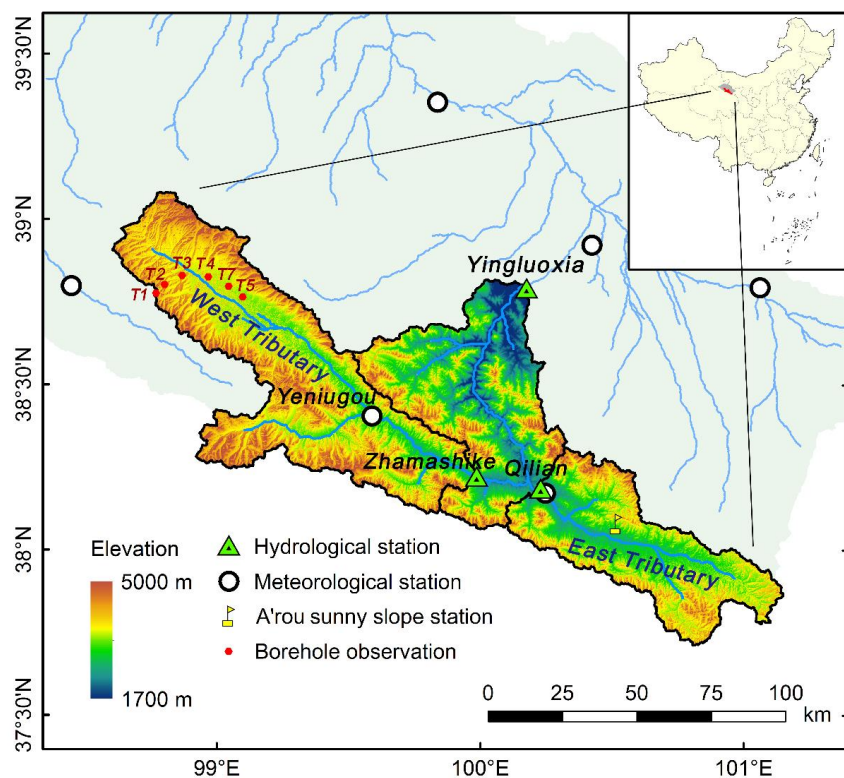
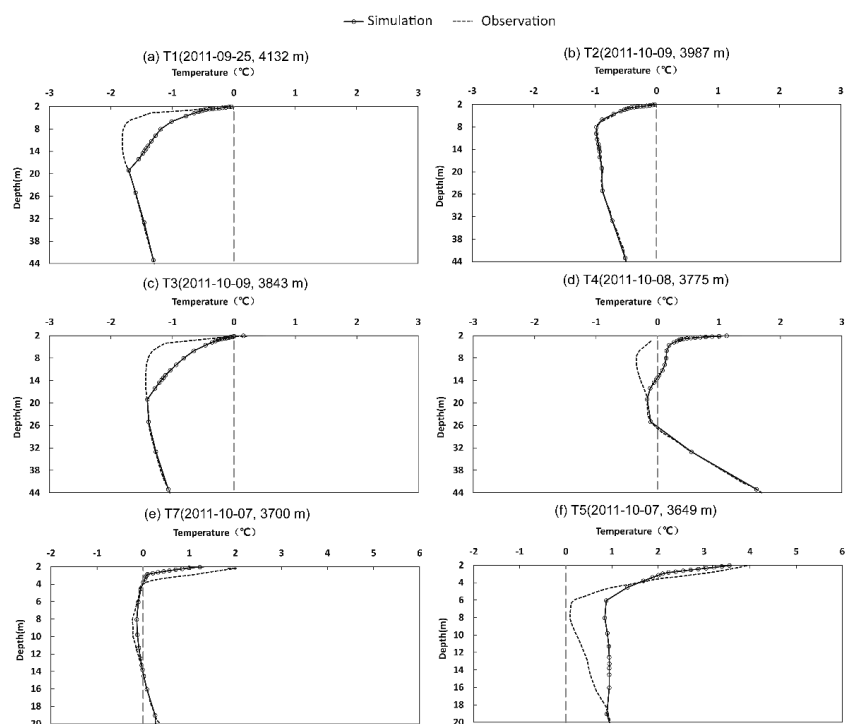


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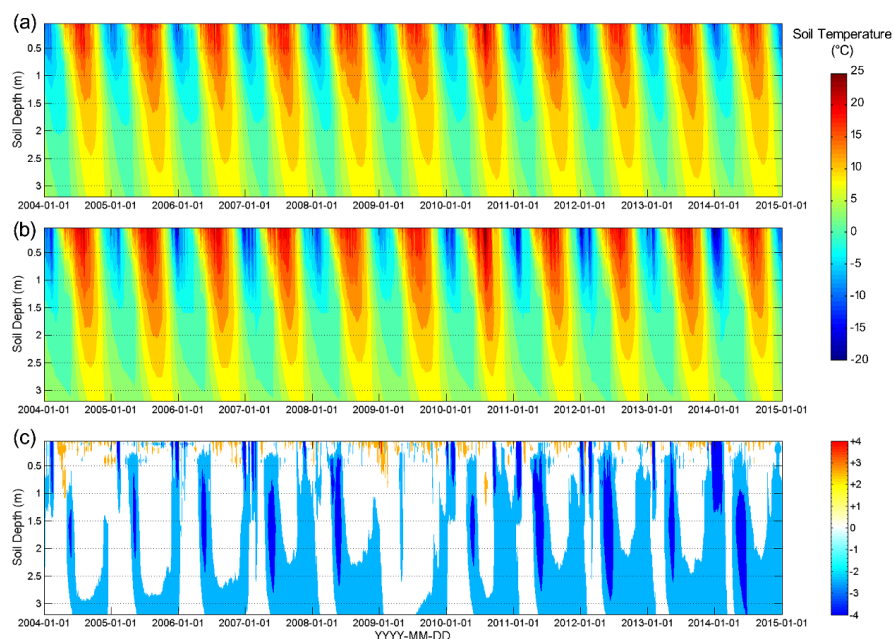
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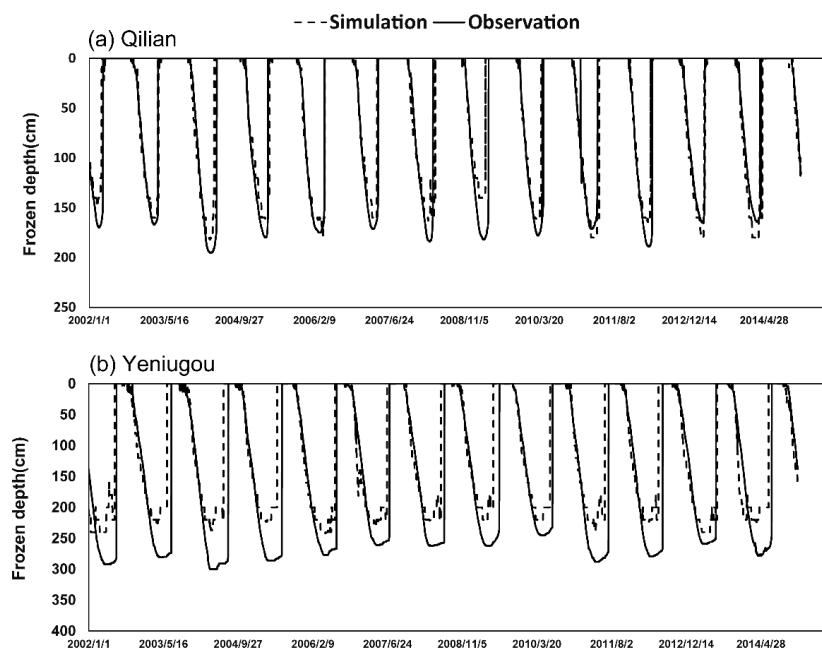
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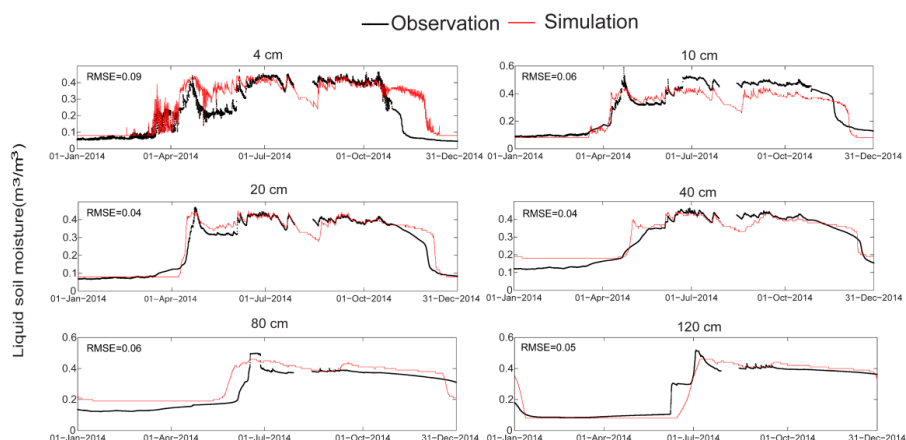
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(c) Simulation-Observation

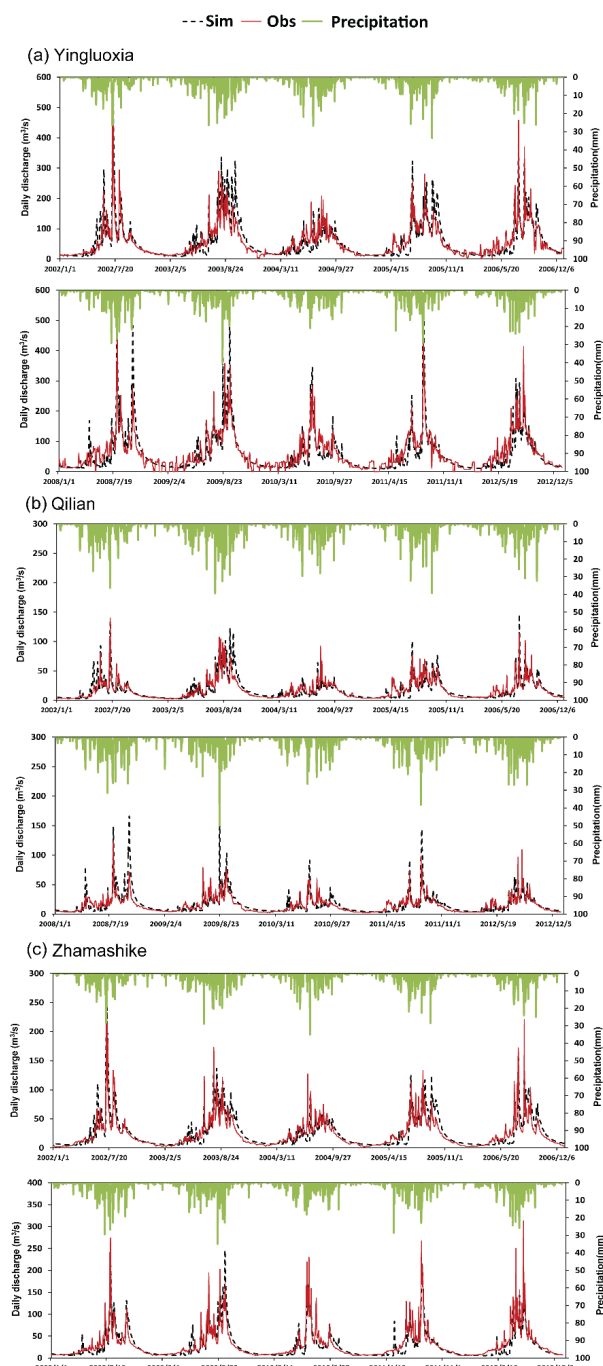
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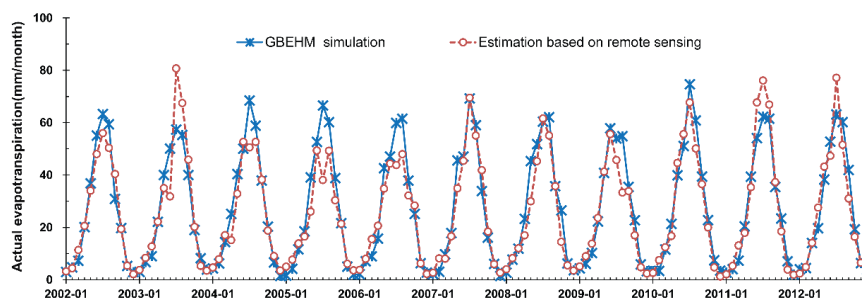
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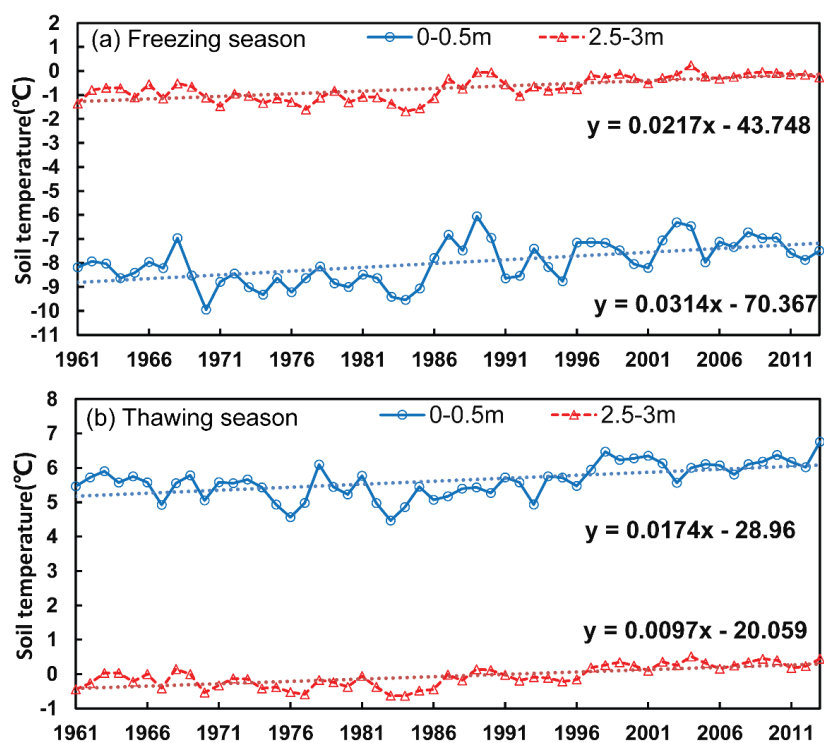
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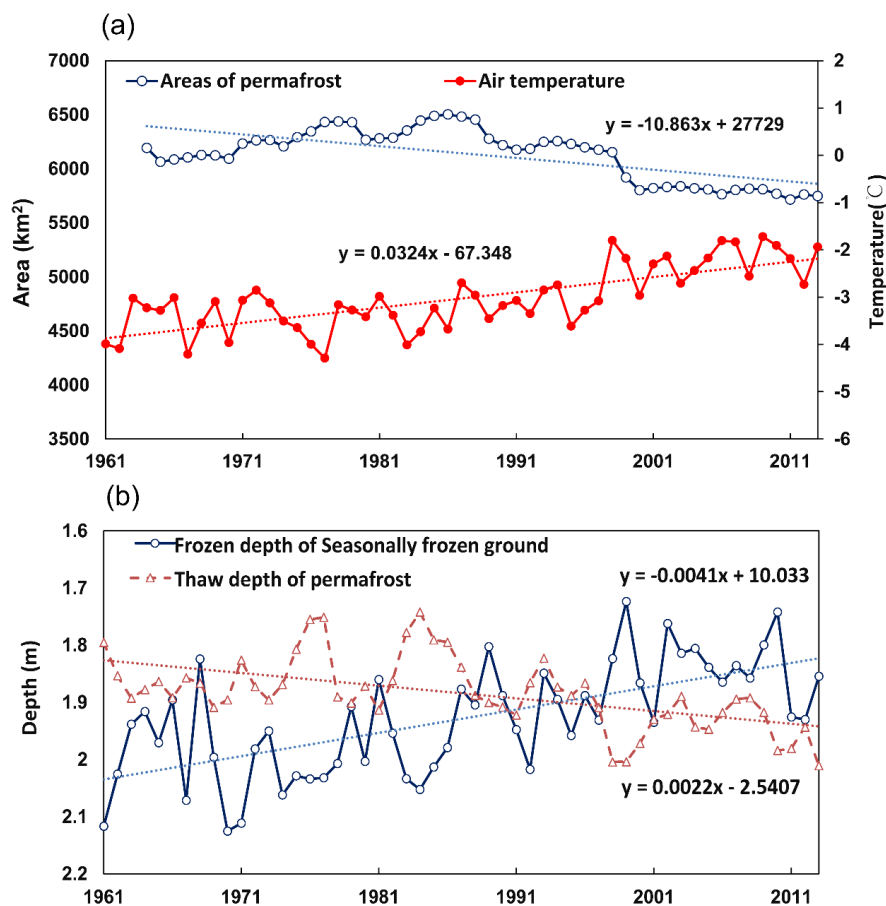


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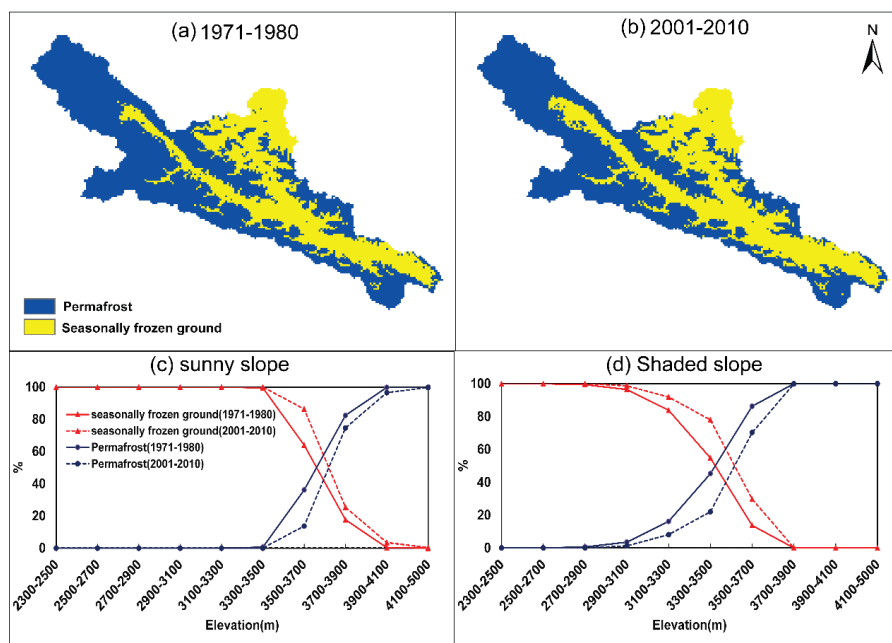


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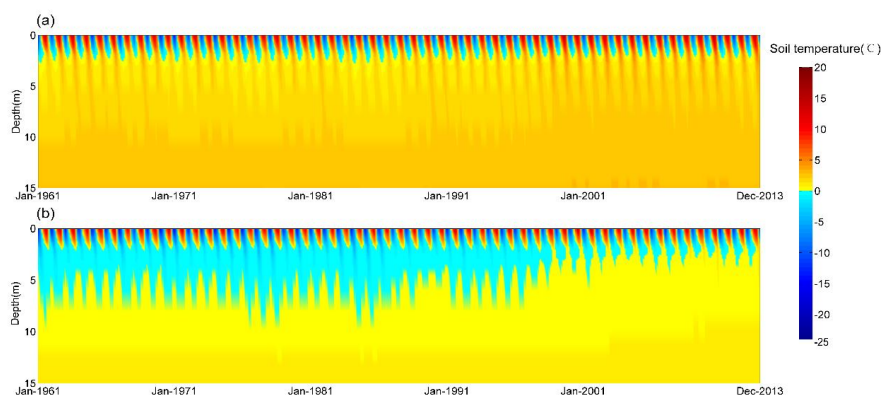


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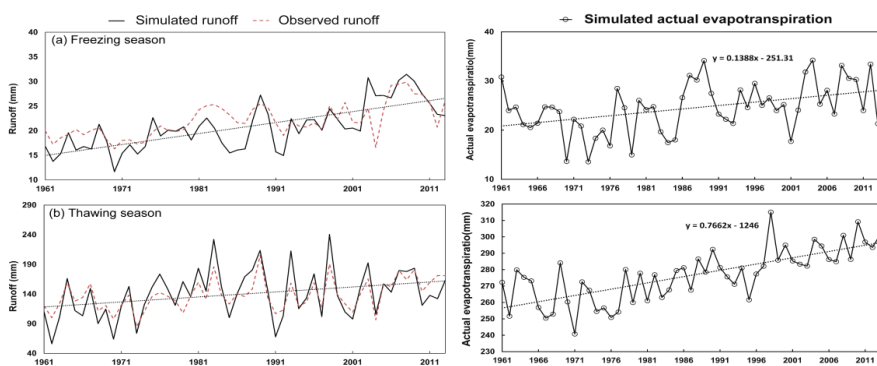
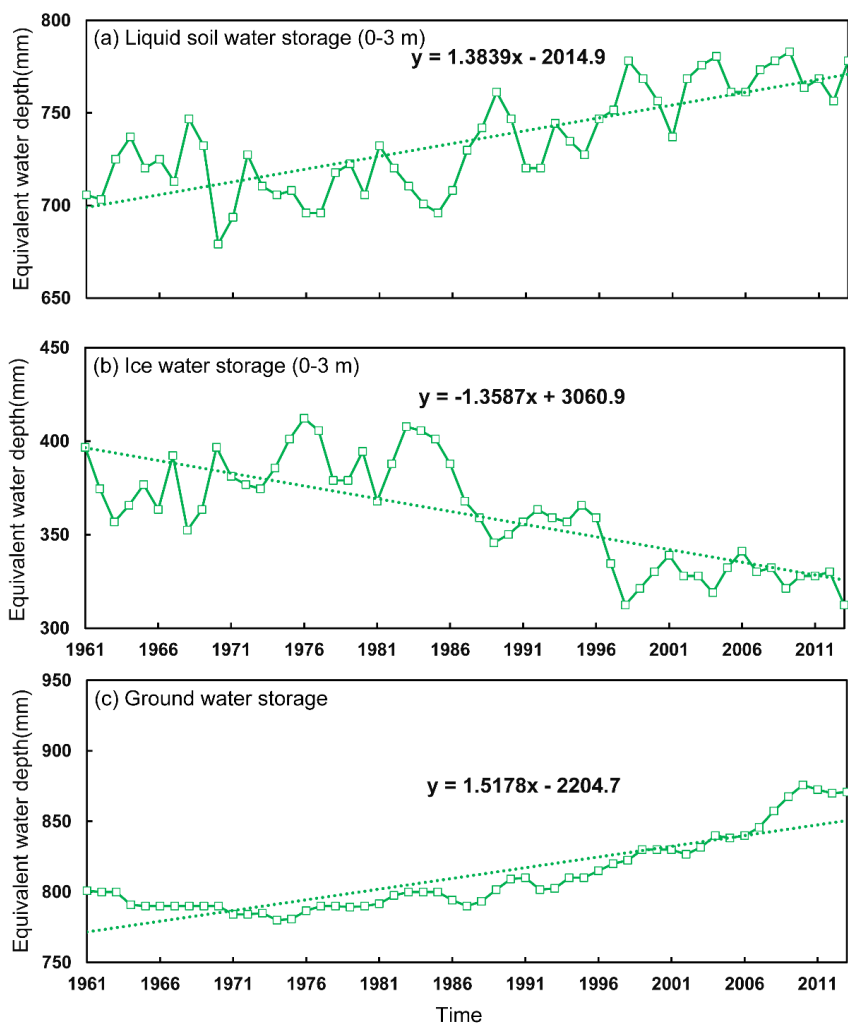
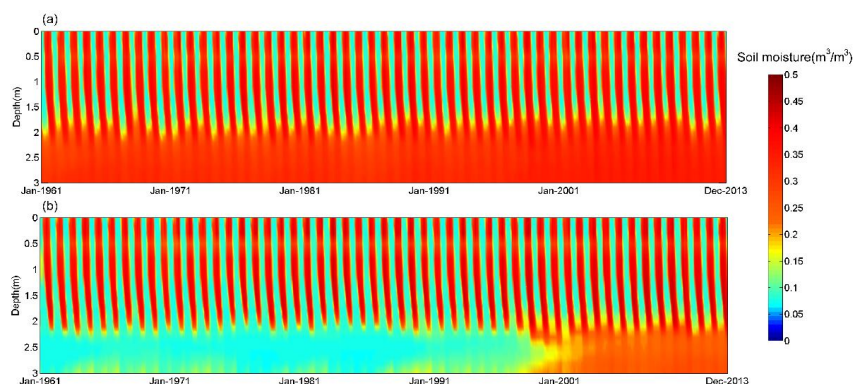


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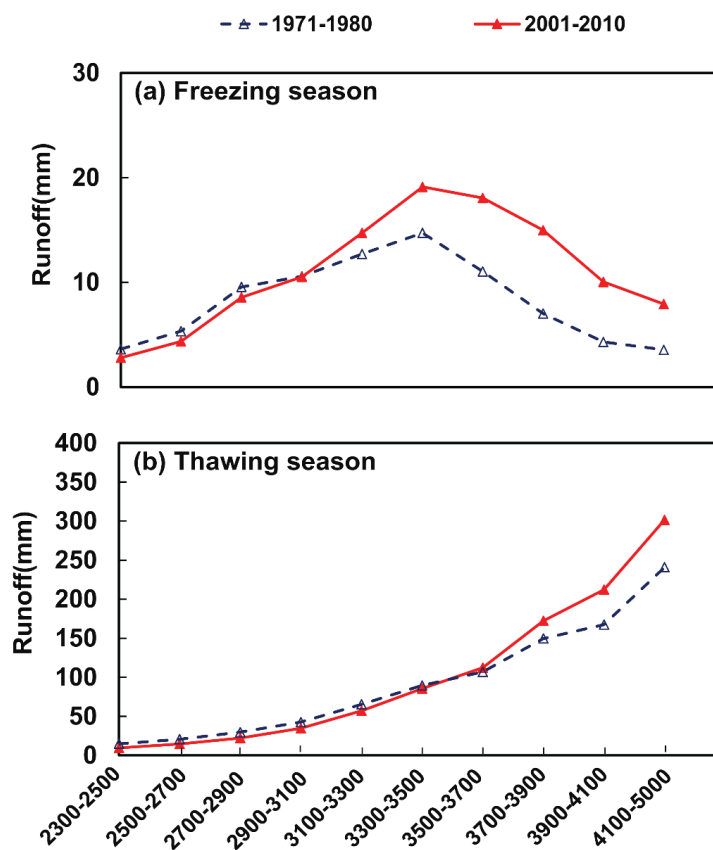


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892 **Table list:**

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898



899 Table 1 Major parameters of the GBEHM model

| Parameters | Coniferous Forest | Shrub | Steppe | Alpine Meadow | Alpine Sparse Vegetation | Desert |
|--|-------------------|-------|--------|---------------|--------------------------|--------|
| Surface retention capacity (mm) | 30.0 | 25.0 | 10.0 | 15.0 | 15.0 | 5.0 |
| Surface roughness (Manning coefficient) | 0.5 | 0.3 | 0.1 | 0.1 | 0.1 | 1.0 |
| Soil reflectance to visible light | 0.20 | 0.20 | 0.20 | 0.28 | 0.14 | 0.11 |
| Soil reflectance to near-infrared radiation | 0.225 | 0.225 | 0.225 | 0.28 | 0.225 | 0.225 |
| Leaf reflectance to visible light | 0.105 | 0.105 | 0.105 | 0.105 | 0.105 | — |
| Leaf reflectance to near-infrared radiation | 0.35 | 0.58 | 0.58 | 0.58 | 0.58 | — |
| Leaf transmittance to visible light | 0.05 | 0.07 | 0.07 | 0.07 | 0.07 | — |
| Leaf transmittance to near-infrared radiation | 0.10 | 0.25 | 0.25 | 0.25 | 0.25 | — |
| Maximum Rubisco capacity of top leaf ($10^{-5} \text{ mol m}^{-2} \text{ s}^{-1}$) | 6.0 | 6.0 | 3.3 | 3.3 | 3.0 | — |
| Plant root depth (m) | 2.0 | 1.0 | 0.40 | 0.40 | 0.1 | 0.0 |
| Intrinsic quantum efficiency (mol mol^{-1}) | 0.08 | 0.08 | 0.05 | 0.05 | 0.05 | — |
| Canopy top height (m) | 9.0 | 1.9 | 0.3 | 0.3 | 0.2 | — |
| Leaf length (m) | 0.055 | 0.055 | 0.3 | 0.3 | 0.04 | — |
| Leaf width (m) | 0.001 | 0.001 | 0.005 | 0.005 | 0.001 | — |
| Stem area index | 0.08 | 0.08 | 0.05 | 0.05 | 0.08 | — |

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903 Table 2 Model performance of the daily streamflow simulation

| Station | Calibration period (2002~2006) | | Validation period (2008~2012) | |
|------------|--------------------------------|--------|-------------------------------|--------|
| | NSE | RE (%) | NSE | RE (%) |
| Yingluoxia | 0.64 | 3.8 | 0.65 | -5.6 |
| Qilian | 0.65 | 1.5 | 0.60 | 9.3 |
| Zhamashike | 0.70 | 9.9 | 0.75 | -7.0 |

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906 Table 3 Changes in basin water balance

| Decade | Precipitation (mm/yr) | Actual evaporation (mm/yr) | Simulated runoff (mm/yr) | Observed runoff (mm/yr) | Runoff ratio(observed) | Runoff ratio (simulated) |
|-----------|--------------------------|----------------------------------|--------------------------------|-------------------------------|---------------------------|-----------------------------|
| 1961-1970 | 405.7 | 288.8 | 133.3 | 144.1 | 0.36 | 0.33 |
| 1971-1980 | 439.1 | 280.8 | 154.5 | 143.8 | 0.33 | 0.35 |
| 1981-1990 | 492.8 | 300.0 | 186.2 | 174.1 | 0.35 | 0.38 |
| 1991-2000 | 471.0 | 306.1 | 160.1 | 157.4 | 0.33 | 0.34 |
| 2001-2010 | 504.3 | 317.4 | 177.9 | 174.3 | 0.35 | 0.35 |

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911 Table 4 Changes in runoff components in different seasons

| Freezing season (from November to March) | | | |
|--|-------------------|---------------------|----------------------|
| | Total runoff (mm) | Glacier runoff (mm) | Snowmelt runoff (mm) |
| 1961-1970 | 16.5 | 0.0 | 0.0 |
| 1971-1980 | 18.5 | 0.0 | 0.0 |
| 1981-1990 | 20.2 | 0.0 | 0.0 |
| 1991-2000 | 20.4 | 0.0 | 0.0 |
| 2001-2010 | 27.2 | 0.0 | 0.0 |
| Thawing season (from April to October) | | | |
| | Total runoff (mm) | Glacier runoff (mm) | Snowmelt runoff (mm) |
| 1961-1970 | 116.8 | 3.0 | 26.2 |
| 1971-1980 | 136.0 | 3.5 | 13.5 |
| 1981-1990 | 166.1 | 3.1 | 28.2 |
| 1991-2000 | 139.7 | 3.8 | 19.2 |
| 2001-2010 | 150.7 | 3.7 | 25.8 |

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923 Table 5 Correlation between runoff/soil moisture and precipitation/soil temperature

| | Freezing season | | | Thawing season | | |
|--------|-----------------|-------|------|----------------|-------|------|
| | P | Tsoil | LSM | P | Tsoil | LSM |
| LSM | 0.26 | 0.89 | - | 0.61 | 0.85 | - |
| Runoff | 0.30 | 0.66 | 0.82 | 0.93 | 0.06 | 0.43 |

924 Note: P is the precipitation, Tsoil is the mean soil temperature of 0-3 m, LSM is the mean liquid soil
 925 moisture of 0-3 m.

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