

Article



Contrasting Evolution Patterns of Endorheic and Exorheic Lakes on the Central Tibetan Plateau and Climate Cause Analysis during 1988–2017

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Abstract: The alpine lakes on the Tibetan Plateau (TP) are indicators of climate change. The assessment of lake dynamics on the TP is an important component of global climate change research. With a focus on lakes in the 33° N zone of the central TP, this study investigates the temporal evolution patterns of the lake areas of different types of lakes, i.e., non-glacier-fed endorheic lakes and nonglacier-fed exorheic lakes, during 1988-2017, and examines their relationship with changes in climatic factors. From 1988 to 2017, two endorheic lakes (Lake Yagenco and Lake Zhamcomagiong) in the study area expanded significantly, i.e., by more than 50%. Over the same period, two exorheic lakes within the study area also exhibited spatio-temporal variability: Lake Gaeencuonama increased by 5.48%, and the change in Lake Zhamuco was not significant. The 2000s was a period of rapid expansion of both the closed lakes (endorheic lakes) and open lakes (exorheic lakes) in the study area. However, the endorheic lakes maintained the increase in lake area after the period of rapid expansion, while the exorheic lakes decreased after significant expansion. During 1988–2017, the annual mean temperature significantly increased at a rate of 0.04 °C/a, while the annual precipitation slightly increased at a rate of 2.23 mm/a. Furthermore, the annual precipitation significantly increased at a rate of 14.28 mm/a during 1995–2008. The results of this study demonstrate that the change in precipitation was responsible for the observed changes in the lake areas of the two exorheic lakes within the study area, while the changes in the lake areas of the two endorheic lakes were more sensitive to the annual mean temperature between 1988 and 2017. Given the importance of lakes to the TP, these are not trivial issues, and we now need accelerated research based on long-term and continuous remote sensing data.

Keywords: evolution pattern; lake area changes; climate change; endorheic lakes; exorheic lakes; Tibetan Plateau; remote sensing monitoring

1. Introduction

Lakes are sensitive to climate change in terms of several aspects of hydrology, meteorology, biology, and limnology [1–6]. Lake area is one of the most important indicators of changes in the water resources, which play a pivotal role in the eco-environment and human society, especially for lakes in semi-arid regions and cold regions [5–7]. Although lake area records are available for some lakes, fieldwork is difficult for most lakes in remote regions [6]. Remote sensing has been widely used to monitor lake area changes on a large



Citation: Zhao, Z.; Zhang, Y.; Hu, Z.; Nie, X. Contrasting Evolution Patterns of Endorheic and Exorheic Lakes on the Central Tibetan Plateau and Climate Cause Analysis during 1988–2017. *Water* **2021**, *13*, 1962. https://doi.org/10.3390/w13141962

Academic Editor: Momcilo Markus

Received: 13 May 2021 Accepted: 15 July 2021 Published: 17 July 2021

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Copyright: © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). scale [8,9]. It can be used to depict lake dynamics and to evaluate the influences of climate change and human activities [9,10].

The Tibetan Plateau (TP) is known as the world's third pole [2,6] and as the Asian Water Tower [11]. The distribution of many lakes is a major feature of the TP, and its total lake area accounted for 59.14% of China's total lake area in 2015 [12,13]. Studies have reported that lake expansion since the late 1990s is one of the most outstanding environmental change events on the TP [14]. Moreover, the lake expansion has been accelerated in the 2000s, and has mainly occurred in the endorheic TP [14–17]. However, researches on whether the area changes of exorheic lakes have a period of rapid expansion in the 2000s on the TP, and contrasting the differences of evolution patterns between endorheic lakes and exorheic lakes are still lacking. Compared to lakes in other parts of the world, the lakes on the TP are relatively uninfluenced by anthropogenic activities. Thus, they are considered to be an indicator of climatic change [2,15,16,18]. Amplified climate changes of polar and cold climate environments, especially of the TP, are important components of global change research [19]. In recent years, precipitation and temperature have contributed to the lake change on the TP [14,16,17,20–22]. However, the differences of driving mechanisms of lake dynamics among endorheic lakes and exorheic lakes on the TP are still under debate.

Because the lake dynamics could be associated with lake type, it is important to differentiate lake type when analyzing the lake change [23]. Here, we chose four non-glacier-fed lakes (Lake Yagenco, Lake Zhamcomaqiong, Lake Zhamuco, and Lake Gaeencuonama) in the 33° N zone of the central TP, and these lakes are located on the northern slope of the Tanggula Mountains. The first two lakes are located within the inland basin, and the last two lakes are located within the Yangtze River Basin [24]. These four lakes are in one of the 25 National Key Ecological Function Areas in China and are also in one of the key implementation areas of the ecological conservation and restoration project in the Three-River Source Region (TRSR) [25]. In this study, we investigated the patterns of the area changes of two endorheic lakes and two exorheic lakes at similar latitudes on the central TP, examined how climatic factors affect these patterns, and explored the differences of evolution patterns and driving mechanisms among these endorheic lakes and exorheic lakes. Following the Introduction, Section 2 introduces the study area, describes the materials used, and explains the methodology in detail. Section 3 presents the lake area dynamics and their influencing factors and analyzes the relationships between the lake area and climate factors. Section 4 presents a discussion of the changes in the TP's lakes and the influencing factors. The conclusions and further implications are presented in Section 5. As a case study, this research provides an improved understanding of lake area changes among endorheic lakes and exorheic lakes and promotes a better understanding of the environmental changes caused by global warming on the TP.

2. Materials and Methods

2.1. Study Area

The study area is located in the Tanggula Mountains on the central TP (Figure 1). The climate in the study area is a continental climate, with an annual mean temperature of -0.98 °C and an annual precipitation of 445.54 mm [15,26,27]. More than 70% of the total annual precipitation in the study area is concentrated from June to September (based on precipitation data from the China Meteorological Data Center for 1988–2017).

There are four non-glacier-fed lakes in the study area (Figure 1). Lake Yagenco (89°47.61′ E, 33°1.44′ N, 4869 m a.s.l), Lake Zhamcomaqiong (89°41.71′ E, 33°9.82′ N, 4889 m a.s.l), Lake Zhamuco (93°25.57′ E, 33°0.68′ N, 4691 m a.s.l), and Lake Gaeencuonama (93°32.42′ E, 32°57.82′ N, 4697 m a.s.l) had areas of 165.84 km², 30.64 km², 6.20 km², and 8.97 km² in 2017, respectively (calculated from Landsat images). Among the lakes, Lake Yagenco and Lake Zhamcomaqiong are endorheic lakes, while Lake Zhamuco and Lake Zhamcomaqiong is mainly influenced by the Westerlies, while that in



the area containing Lake Zhamuco and Lake Gaeencuonama is mainly influenced by the East Asian Monsoon [16,23,27].

Figure 1. Map of the study area showing the spatial distribution of the lakes and the surrounding topography of the central Tibetan Plateau.

2.2. Data and Processing

2.2.1. Remote Sensing (RS) Data

A total of 41 Landsat satellite (TM, ETM, and OLI) images were used to explore the patterns of the changes in the extents of the selected lakes (i.e., Lake Yagenco, Lake Zhamcomaqiong, Lake Zhamuco, and Lake Gaeencuonama) from 1988 to 2017 (downloaded from the United States Geological Survey website, http://glovis.usgs.gov, accessed on 1 June 2018). The information related to each image is presented in Table 1. The cloud cover was less than 30% on each of the 41 Landsat RS image scenes used for the lake interpretation.

To compare the lake extents at an inter-annual scale, we selected Landsat images with acquisition dates from September to December (Table 1) each year because the maximum rate of change in the extent was less than 2% during this period [28], which was the end of the wet season or just after (June–September) [23]. In cases where several images were available for this period for a particular year, we selected the image with the least cloud

cover to map the lake extent. Lake boundary extraction was not performed in cases where no high-quality images were available.

Path	Row	Date	Name Sensor Source		Resolution (m)	Cloud Cover (%)
137	37	1988/9/14	LT51370371988258BJC01	Landsat TM	30	1.65
137	37	1989/9/17	LT51370371989260BJC00	Landsat TM	30	15.84
137	37	1990/9/4	LT51370371990247BJC00	Landsat TM	30	13.44
137	37	1991/10/9	LT51370371991282BJC00	Landsat TM	30	0.75
137	37	1992/11/12	LT51370371992317BJC00	Landsat TM	30	19.58
137	37	1993/11/15	LT51370371993319ISP00	Landsat TM	30	11.16
137	37	1994/10/1	LT51370371994274ISP00	Landsat TM	30	5.66
137	37	1995/9/2	LT51370371995245BJC00	Landsat TM	30	13.14
137	37	2000/10/1	LT51370372000275BJC00	Landsat TM	30	10.59
137	37	2001/10/12	LE71370372001285SGS01	Landsat ETM	30	8.52
137	37	2002/10/31	LE71370372002304SGS01	Landsat ETM	30	5.08
137	37	2005/10/15	LT51370372005288BKT02	Landsat TM	30	9.94
137	37	2006/12/5	LT51370372006339BKT00	Landsat TM	30	8.00
137	37	2007/9/19	LT51370372007262IKR00	Landsat TM	30	0.00
137	37	2009/10/26	LT51370372009299KHC00	Landsat TM	30	10.87
137	37	2011/9/14	LT51370372011257IKR00	Landsat TM	30	0.55
137	37	2013/12/8	LC81370372013342LGN01	Landsat OLI	30	7.57
137	37	2014/12/11	LC81370372014345LGN00	Landsat OLI	30	2.27
137	37	2015/12/14	LC81370372015348LGN00	Landsat OLI	30	1.93
137	37	2016/11/14	LC81370372016319LGN00	Landsat OLI	30	5.45
137	37	2017/12/19	LC81370372017353LGN00	Landsat OLI	30	0.60
139	37	1988/9/28	LT51390371988272BKT00	Landsat TM	30	1.53
139	37	1989/10/1	LT51390371989274BJC01	Landsat TM	30	1.99
139	37	1992/11/10	LT51390371992315ISP00	Landsat TM	30	11.46
139	37	1993/11/13	LT51390371993317ISP00	Landsat TM	30	2.02
139	37	1996/10/20	LT51390371996294ISP00	Landsat TM	30	17.15
139	37	1999/11/6	LE71390371999310SGS00	Landsat ETM	30	18.62
139	37	2000/10/7	LE71390372000281SGS00	Landsat ETM	30	1.03
139	37	2001/9/24	LE71390372001267SGS01	Landsat ETM	30	1.05
139	37	2002/12/16	LE71390372002350SGS00	Landsat ETM	30	3.08
139	37	2004/10/10	LT51390372004284BJC00	Landsat TM	30	10.73
139	37	2005/11/14	LT51390372005318BKT00	Landsat TM	30	15.00
139	37	2006/9/14	LT51390372006257IKR00	Landsat TM	30	20.00
139	37	2007/10/3	LT51390372007276IKR00	Landsat TM	30	0.00
139	37	2008/10/5	LT51390372008279BKT00	Landsat TM	30	2.46
139	37	2009/11/25	LT51390372009329KHC00	Landsat TM	30	24.66
139	37	2013/12/6	LC81390372013340LGN01	Landsat OLI	30	3.68

Table 1. RS data used to derive lake extents.

Path	h Row Date		Name	Sensor Source	Resolution (m)	Cloud Cover (%)
139	37	2014/12/9	LC81390372014343LGN00	Landsat OLI	30	2.58
139	37	2015/11/26	LC81390372015330LGN01	Landsat OLI	30	2.06
139	37	2016/9/9	LC81390372016253LGN00	Landsat OLI	30	0.67
139	37	2017/12/17	LC81390372017351LGN00	Landsat OLI	30	0.37

Table 1. Cont.

2.2.2. Meteorological Data

The meteorological data used in this study were downloaded from the China Meteorological Data Center (http://data.cma.gov.cn, accessed on 10 July 2018). The data used were the annual mean temperature and the annual precipitation records collected between 1988 and 2017 at seven weather stations (Zaduo, Naqu, Anduo, Suoxian, Wudaoliang, Qumalai, and Tuotuohe) within the vicinity of the selected lakes. The average values of the annual mean temperature and precipitation for each year across the weather stations were used in the same year for the entire study area.

2.2.3. Other Auxiliary Data

The auxiliary data used in this analysis included topographic maps, a digital elevation model (DEM), and boundary data for the TP and the relevant basins. The topographic maps were provided at 1:100,000 scale by the Institute of Geographic Sciences and Natural Resources Research, Chinese Academy of Sciences. These maps were used as a reference when geometrically correcting the Landsat images.

The DEM data used were downloaded from the Shuttle Radar Topography Mission (SRTM) website (http://srtm.csi.cgiar.org/, accessed on 12 July 2018), with a 30 m spatial resolution. The boundary of the TP used was from Zhang et al. [29]. The boundary between the Inland Basin and the Yangtze River Basin used was from Yang et al. and Zhao et al. [20,27]. These data were all used to draw Figure 1.

2.2.4. Data Preparation

The Geometric Correction/Registration/Registration: Image to Map tool in the ENVI 5.3 software was used for the geometric corrections. A topographic map was used as the base image, while Landsat provided warped images. A total of 48 ground control points were then selected within the base image and within each warped image. The polynomial method was used for the geometric correction calculations of the model, and a cubic convolution was used for the resampling. Then, the Landsat images were geometrically corrected within a root-mean-square error (RMSE) of one pixel. The Radiometric Correction/Radiometric Calibration and Radiometric Correction/Atmospheric Correction Module/FLAASH Atmospheric Correction tools in the ENVI 5.3 software were then applied for the radiometric calibration and atmospheric correction, respectively.

Based on the data preprocessing described above, the Landsat images used for the extraction of data on lakes during 1988–2017 were acquired. Then, we delineated the boundaries of the lakes manually through visual interpretation. Finally, we extracted the extents of Lake Yagenco, Lake Zhamcomaqiong, Lake Zhamuco, and Lake Gaeencuonama. A Confusion Matrix was used to assess the classification accuracy of our delineated lake boundaries [12]. In this study, a total of 179 test sample plots, from two field surveys and measurements carried out in 2015 and 2016, were used for accuracy assessment. On the whole, user accuracy of the lakes was 99.84%, producer accuracy of the lakes was 98.10%, the overall accuracy of classification was 98.64%, and the kappa statistic was 0.97, which is acceptable for lake change analysis.

2.2.5. Data Analysis

The equations used to calculate the changes in the lake area are as follows [9,30].

$$\alpha = \frac{S_{next} - S_{previous}}{S_{previous}} \times 100\% \tag{1}$$

$$\beta = \frac{S_{next} - S_{previous}}{S_{previous}} \times \frac{1}{T} \times 100\%$$
⁽²⁾

In Equations (1) and (2), α (%) is the proportional change in the lake area; and β (%) is the annual rate of change. In other words, β (%) is the average rate of change in the lake area over a given period. *S*_{previous} (km²) is the lake area in the previous period; *S*_{next} (km²) is the lake area in the next time slot; and *T* (*a*) is the entire time period of the study.

Then, the Pearson's correlation coefficients of the relationships between the various factors and lake areas were calculated. The statistical significance levels were set at 0.01, 0.05, and 0.1 for the different years.

We used the least squares method to detect the trends in the lake area changes and to perform their piecewise linear fitting. This approach has been used in previous studies to identify overall trends and to identify the breakpoints between the periods with significantly different tendencies [31,32]. We applied the statistical procedure and operation code outlined by Tomé and Miranda [31] in this study using the ENVI/IDL software to identify the trend change points in the lake-area time series. These points divided the lake-area time series in this study into several sub-periods, which were used to identify the characteristics of the stages in the different sub-periods.

3. Results

3.1. Pattern of Lake-Area Change

From 1988 to 2017, the two endorheic lakes in the study area expanded significantly, with a proportional change, α (%), of 60.73% (r = 0.923, p < 0.01) (Figure 2a,b). Over the same period, the area of Lake Yagenco significantly increased, with a proportional change, α (%), of 59.16% (r = 0.925, p < 0.01). This means that the annual rate of change in the lake area, β (%), was 1.97%/a. During 1988–1996, the area of Lake Yagenco decreased, with a β (%) of -1.57%/a (r = -0.953, p < 0.01). During 1997–2017, the area of Lake Yagenco increased, with a β (%) of 4.06%/a (r = 0.952, p < 0.01). During 1988–2017, the area of Lake Yagenco increased, with a β (%) of 2.33%/a. During 1988–2009, the area of Lake Zhamcomaqiong increased, with a β (%) of 2.49%/a (r = 0.925, p < 0.01). During 2010–2017, the change in the area of Lake Zhamcomaqiong was not significant (r = -0.388, p > 0.1).

The lake area changes of the two exorheic lakes (Lake Zhamuco and Lake Gaeencuonama) in the study area between 1988 and 2017 were detected (Figure 2c,d). Over the same period, the change in the area of Lake Zhamuco was not significant, with an α (%) of -9.54% (r = -0.175, p > 0.1) and a β (%) of -0.32%/a. During 1988–1992, the area of Lake Zhamuco decreased, with a β (%) of -2.31%/a (r = -0.879, p < 0.05). During 1993–2009, the area of Lake Zhamuco increased, with a β (%) of 0.99%/a (r = 0.788, p < 0.01). During 2010–2017, the area of Lake Zhamuco decreased, with a β (%) of -1.55%/a (r = -0.645, p < 0.1). During 1988–2017, the area of Lake Gaeencuonama slightly increased, with an α (%) of 5.48% (r = 0.689, p < 0.01) and a β (%) of 0.18%/a. During 1988–2002, the change in the area of Lake Gaeencuonama was not significant, with a β (%) of 0.07%/a (r = 0.085, p > 0.1). During 2003–2009, the area of Lake Gaeencuonama significantly increased, with a β (%) of 3.34%/a (r = 0.980, p < 0.05). During 2010–2017, the area of Lake Gaeencuonama decreased, with a β (%) of -1.92%/a (r = -0.926, p < 0.01).



Figure 2. Changes of area in Lake Yagenco (**a**); Lake Zhamcomaqiong (**b**); Lake Zhamuco (**c**) and Lake Gaeencuonama (**d**) during 1988–2017.

Figure 2 shows that there was a period of rapid expansion after 2000, with area changes in both the closed lakes and the open lakes in the study area. For instance, the areas of Lake Yagenco and Lake Zhamcomaqiong increased the most in 2004–2005 and 2001–2002, i.e., by 21.26% (Figure 2a) and 24.97% (Figure 2b), respectively. The most rapid expansions in the areas of Lake Zhamuco and Lake Gaeencuonama occurred in 2002–2007 and 2002–2009, i.e., by 16.02% (Figure 2c) and 23.35% (Figure 2d), respectively. The differences in the area changes of the lakes in the study area were that the endorheic lakes maintained the increase in lake area after the period of rapid expansion, while the exorheic lakes decreased after their significant increases. For example, the areas of Lake Yagenco and Lake Zhamcomaqiong increased by 17.23% and 19.79% during 2006–2017 and 2003–2017, respectively; whereas, the areas of Lake Zhamuco and Lake Gaeencuonama decreased by 15.20% and 15.39% during 2008–2017 and 2010–2017, respectively.

3.2. Changes in Temperature and Precipitation

The annual mean temperature increased at a rate of 0.04 °C/a (r = 0.766, p < 0.01) (Figure 3). The annual mean temperature was -1.14 °C in 1988 and rose to -0.05 °C in 2017. The average annual mean temperature was -0.98 °C throughout this period. From 1988 to 2017, the highest annual mean temperature occurred in 2014 (0.74 °C). Furthermore, the change in the temperature was not significant from 1988 to 1997 (r = -0.408, p > 0.1). During 1998–2012, the temperature rose significantly at a rate of 0.23 °C/a (r = 0.752, p < 0.01). During 2013–2017, the change in the annual mean temperature was also not significant (r = -0.203, p > 0.1).

The annual precipitation slightly increased at a rate of 2.23 mm/a (r = 0.345, p < 0.05) (Figure 3). The annual precipitation was 432.81 mm in 1988 and increased to 499.60 mm in 2017. The average annual precipitation was 445.54 mm throughout this period. From 1988 to 2017, the highest annual precipitation occurred in 2008 (546.63 mm). Furthermore, the precipitation decreased from 1988 to 1994 at a rate of -14.34 mm/a (r = -0.587, p < 0.1). During 1995–2008, the precipitation increased significantly at a rate of 14.28 mm/a (r = -0.605, p < 0.01). During 2009–2017, the change in annual precipitation was not significant (r = -0.424, p > 0.1).

3.3. Relationships between Lake-Area Change and Annual Mean Temperature and Annual Precipitation

We performed a correlation analysis on the precipitation and temperature values for each year versus the lake area values. These analyses revealed that the precipitation was positively correlated with the areas of the two exorheic lakes (Lake Zhamuco and Lake Gaeencuonama) (Table 2). Increased precipitation equates to greater hydrological lake recharge. Therefore, precipitation was responsible for the observed changes in the lake areas of the two exorheic lakes within the study area.





Table 2.	The Pearson's	s correlation	coefficients for	lake-area and	precipitation	/temperature values.
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Period	Lake	Annual Mean Temperature	Annual Precipitation			
1988–2017	Yagenco	0.845 **	0.226			
1988–2017	Zhamcomaqiong	0.745 **	-0.081			
1988–2017	Zhamuco	0.040	0.529 **			
1988–2017	Gaeencuonama	0.705 **	0.349 *			

Notes: ** *p* < 0.01, * *p* < 0.05.

The analysis results also revealed positive correlations between the temperature and areas of the two endorheic lakes, reaching the 99% confidence level (Lake Yagenco and Lake Zhamcomaqiong) (Table 2). A similar relationship between the lake area and temperature occurred for Lake Gaeencuonama. The relatively higher correlation between the lake area and temperature implies that the temperature was a likely contributor to the area changes

of Lake Yagenco, Lake Zhamcomaqiong, and Lake Gaeencuonama. Furthermore, these lakes are non-glacier-fed lakes, and they are located in permafrost regions [23,27,33]. It seems that permafrost thawing increased the meltwater supply during the significant warming trend in the study area [23,34], and thus, these three lakes received an increased water supply from permafrost melting.

4. Discussion

Lakes are important indicators of the Earth's hydrological cycle and are referred to as sentinels of climate change [15,21]. Monitoring lake dynamics is of vital importance for understanding climatic change [3,20]. The alpine lakes on the TP exhibited strong spatio-temporal changes during the 1960s–2019 [14,23,35–39]. Since the late 1990s, the lake area on the TP has increased significantly, and about three-quarters of the alpine lakes have dramatically expanded [6,15,38]. Lake expansion has become one of the most outstanding environmental change events on the TP [14,39]. Rapid expansion occurred in glacier-fed lakes, non-glacier-fed lakes, endorheic lakes, and exorheic lakes [20,23,35]. The changes in endorheic lakes and glacier-fed lakes accounted for >90% and >80% of the substantial increase in the lake area on the TP over the past three decades, respectively [20,35,36]. In this study, we found that non-glacier-fed exorheic lakes expand dramatically in the 2000s within the 33° N zone of the central TP, while the non-glacier-fed endorheic lakes showed substantial increase in the lake area within the same region and time period. The non-glacier-fed lakes on the central TP exhibited an obvious expansion in 2002, 2005, and 2011 [23]. We also found that Lake Yagenco and Lake Zhamcomagiong expanded most significantly in 2004–2005 and 2001–2002, respectively. On the central TP, 12 lakes exhibited the same remarkable growth between 2000 and 2005 [9,14,27,35]. We also found that Lake Zhamuco and Lake Gaeencuonama experienced a period of expansion from 2002 to 2007. Our results concerning the changes in the lake areas are consistent with the findings of previous studies of lakes on the central TP.

From the 1960s to 2019, the TP experienced significant warming and wetting trends [15,38], and the climate factors were the major cause of the lake area changes on the TP during this period [3,6,16,17,20–22]. We also found that the annual mean temperature and annual precipitation significantly increased in the study area during 1988–2017. In particular, after 2000, temperature in most regions of the TP increased significantly [15]. We also found that the temperature rose significantly in our study area after 1998. In previous studies, precipitation, temperature, evaporation, glacial meltwater, and permafrost degradation acted as the driving factors of lake expansion on the TP [3,6,9,14,15,23,34–39]. However, scholars have various viewpoints on the primary contributors to the lake area changes on the TP, including the following. Precipitation acted as the primary contributor to recent lake area variations on the TP over the past 60 years [14,20,21,35]. Temperature and evaporation were likely the major contributors to the changes in the lake area on the TP [3,36,38,39]. Moreover, the lakes on the Chiangtang Plateau were more sensitive to the annual mean temperature [9,38], while the lakes in the river source region were sensitive to the annual precipitation [38]. In this study, we found that climate driving factors contributing to area changes for endorheic and exorheic lakes in the 33° N zone of the central TP are different: Lake Yagenco and Lake Zhamcomagiong on the Chiangtang Plateau were sensitive to the annual mean temperature, while Lake Zhamuco and Lake Gaeencuonama in the river source region were sensitive to the annual precipitation. Around the 33° N of the central TP, a warmer and wetter tendency in recent decades has been confirmed, and the warming-triggered glacier meltwater supply encouraged the precipitation-driven lake expansions in the 2000s [16]. In this study, we found that the temperature was a likely contributor to the area changes of three non-glacier-fed lakes in the 33° N zone of the central TP, and the water supply from the warming-triggered permafrost melting may augment the lake expansion in these areas. In addition, the glacial meltwater supply caused by warming and the precipitation may have equally contributed to the lake expansion on the TP [15,23,36], and precipitation and glacier melting were the most important contributors

to the increase in lake area [2,36,37]. However, rapid expansion occurred in both glacier-fed and non-glacier-fed lakes, implying that deglaciation alone cannot fully explain the lake area changes on the TP [20,35]. Some scholars have speculated that the warming-triggered permafrost degradation is the main driver of lake evolution on the TP [34]. In the past three decades, about one-tenth of the permafrost in the TP has thawed, and there seems to be a good agreement between the spatial patterns of the permafrost degradation and lake expansion [9,34,40]. However, further investigation is required to obtain direct evidence of the impact of permafrost change on lake area change [34]. Based on the previous studies mentioned above, scholars have suggested that the lakes will probably keep expanding in the near future under the influences of continued warming and wetting [35]. Understanding the mechanisms of lake change on the TP will require comprehensive and in-depth efforts in the future [20].

5. Conclusions

On the basis of remote sensing monitoring and fieldwork, we investigated the patterns of the lake area changes of two endorheic lakes and two exorheic lakes on the central TP during 1988–2017 using Landsat image data, and we examined the relationships between these patterns and climatic factors. From 1988 to 2017, the areas of the two endorheic lakes in the study area significantly expanded. Lake Yagenco and Lake Zhamcomaqiong increased by 59.16% and 69.79%, respectively. Over the same period, the change in the area of one of the two exorheic lakes was not significant and that of the other lake slightly increased. Lake Gaeencuonama increased by 5.48%, while the change in Lake Zhamuco was not significant. The 2000s were a period of rapid expansion for both the closed lakes and open lakes in the study area. However, the endorheic lakes maintained the increase in lake area after the period of rapid expansion, while the exorheic lakes decreased after the period of significant expansion.

The annual mean temperature has been increasing since 1988 at a rate of 0.04 °C/a, while the annual precipitation slightly increased during 1988–2017 at a rate of 2.23 mm/a. Furthermore, the annual precipitation significantly increased at a rate of 14.28 mm/a from 1995 to 2008. The data presented in this study indicate that precipitation was responsible for the observed changes in the lake areas of the two exorheic lakes within the study area, while the changes in the lake areas of the two endorheic lakes were more sensitive to the annual mean temperature between 1988 and 2017. These findings provide important insights into the responses of endorheic lakes and exorheic lakes to climate changes. Research on the evolution patterns of the endorheic lakes and exorheic lakes on the TP requires continued comprehensive and in-depth efforts in the near future.

Author Contributions: Z.Z. and Z.H. conceived and designed the research; Z.H. contributed to the ideas; Z.Z. and Y.Z. contributed to the data analysis, interpretation and manuscript writing; and X.N. contributed to the discussion and paper revision. All authors have read and agreed to the published version of the manuscript.

Funding: This research was funded by the Major Program of National Social Science Foundation of China, grant number 17ZDA158".

Data Availability Statement: Not Applicable.

Acknowledgments: We extend our sincere thanks to the editors and anonymous reviewers for their valuable time.

Conflicts of Interest: The authors declare no conflict of interest.

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