



**1 Groundwater Maintains Lake Clusters: Groundwater pattern of**  
**2 the Songnen Basin from a Multi-source Remote Sensing**  
**3 Perspective**

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26



## 27 **Abstract**

28       Large-scale lake clusters serve as important freshwater resources in arid and semi-  
29 arid regions, but the groundwater recharge patterns sustaining these clusters remain  
30 poorly researched. The Songnen Basin, a semi-arid region in northeastern China,  
31 contains numerous shallow lakes most of which are not connected to rivers, showing  
32 complex interconnections with the groundwater recharge and storage. Here, this paper  
33 investigates the role of groundwater in sustaining the freshwater in the lake clusters of  
34 the Songnen Basin using remote sensing and isotope analysis, especially during the  
35 winter of Chagan Lake, the largest lake in this basin. Our results suggest that deep  
36 groundwater upwelling through fault zones is a significant recharge source for Chagan  
37 Lake, contributing to the frequent occurrence of stable ice-free areas. Isotopic tracers  
38 indicate that this deep groundwater does not originate from local precipitation but likely  
39 originates from external sources, potentially the Tibetan Plateau. A deep-circulation  
40 groundwater pattern is proposed, suggesting that water-conduiting channels exist under  
41 the deep lithosphere in arid and semi-arid regions. When these channels are destroyed  
42 by earthquakes, deep-circulating groundwater would rise through faults and recharges  
43 lake clusters.

44 **Keywords:** Remote sensing, Groundwater, Hydrogen-oxygen isotopes, Songnen Basin

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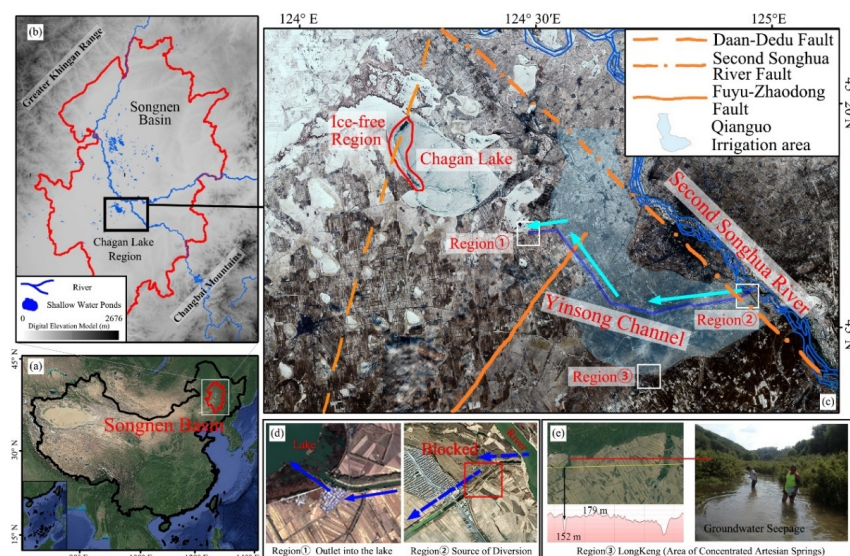
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## 1. Introduction

Currently, approximately 50% of global residential water and 43% of agricultural irrigation are supplied by groundwater, which irrigates 38% of the world's farmland (Zhang et al., 2021). Abundant groundwater resources are distributed in major plains, intermontane basins, deserts and piedmont plains of inland basins. Groundwater stored in sediment pores, rock fractures, and karst caves, has been a primary target for extraction (Roded et al., 2023; Schilling et al., 2023). Many large plains and basins exhibit artesian characteristics, with confined groundwater levels above the surface, such as the China's Tarim Basin, Qaidam Basin, Hexi Corridor, Ordos Basin, and North China Plain (Liao et al., 2022; Zhang et al., 2021; Li et al., 2024). The Great Artesian Basin in Australia, one of the world's largest artesian basins, supplies approximately 350 million m<sup>3</sup> groundwater annually through more than 2,000 boreholes (Habermehl, 2006). In the desert and semi-desert regions of Kazakhstan, nearly 70 artesian basins have been identified, covering a total area of 2 million km<sup>2</sup> with a groundwater volume of about 7000 km<sup>3</sup> (Abuduwaili et al., 2018). Rivers and lakes in these artesian basins are recharged by groundwater, serving as crucial water sources for local people (Jiang et al., 2020). However, there remains insufficient research on the recharge, runoff and discharge patterns of groundwater in these regions.

The Songnen Basin, located in northeastern China, is an artesian basin with ten thousands of isolated water bodies (Du et al., 2020). Within this basin, 6,397 water bodies exceeding 60 ha encompass a total area of 432,600 ha sustained by groundwater (Song et al., 2011) (Fig. 1a-b). Groundwater is essential for maintaining these water bodies in the semi-arid region, where evaporation greatly exceeds precipitation. When groundwater and runoff recharge decreased in the 1960s, Chagan Lake, the largest lake in this basin (Fig. 1c), shrunk by 70% (Wang et al., 2011; Currell et al., 2012) and its pH increased from 8.5 to 12.8 (Lu et al., 2007), threatening water and fish quality. In response to these environmental challenges, the local government initiated the Yinsong Project, constructing Yinsong Channel to connect the Songhua River and Chagan Lake. Unexpectedly, this channel does not transport water from the Songhua River after completion and its headwork has been blocked. Instead, continuous groundwater flows into the channel and has become a vital source for Chagan Lake (Fig. 1d).



**Fig. 1 A map of Chagan Lake region. (a) The Songnen Basin, a major physiographic unit among Northeast China's three principal plains, extends north-south and is narrow east-west. Its mean air temperature is about 5°C, varying from -18°C in January to 23°C in July. Annual precipitation and actual evaporation in the basin range from 300 to 600 mm and 1200 to 1800 mm, respectively. (b) Distribution of lake clusters. Chagan lake is the largest shallow lake in the Songnen. (c) Chagan Lake is recharged by Yinsong Channel, and ice-free regions appear on the lake during the winter. Three major irrigation regions are distributed around Chagan Lake, including Daan, Qianan, and Qianguo irrigation regions, encompassing a total area of 5,353.25 km<sup>2</sup>. Among them, the Qianguo irrigation region has the largest area, accounting for 50.36% of the total (d) The Yinsong Channel is an artificial channel extending 53.85 km in length and 50 m in width, connecting Chagan Lake and the Songhua River. After its completion in 1984, the channel has provided an annual water supply of 300 million m<sup>3</sup> to Chagan Lake. Landsat imagery reveals that the channels upstream section at the Songhua River confluence has been completely blocked since 1990. (e) The groundwater source of Longkeng region and the field photograph.**

The average age of groundwater in the Songnen Basin is only 46.1 years (Zhang et al., 2017), and the recharge, runoff, and discharge patterns of this renewing groundwater are controversial. Previous studies on the groundwater circulation in the Songnen Basin and similar artesian basins have been based on the hydrological water balance, under the assumption that surface water and groundwater within a basin are derived from internal precipitation or inter-basin river recharge, with no cross-basin groundwater recharge (Liu et al., 2017; Chen et al., 2011; Zhang et al., 2015). Notably, despite declining trends in surface runoff and precipitation (Wang et al., 2015), groundwater recharge showed an increasing trend in the Songnen Basin by 2010 (Ma et al., 2021a). In addition to traditional infiltration and lateral recharge, there is also a fault zone recharge mechanism for groundwater (Tan et al., 2021). The Songnen Basin is characterized by numerous fault zones, with lakes and rivers distributed along these



106 faults. Several studies have found that in the Songnen Basin, Changbai Mountains,  
107 Greater Khingan Range, and Sanjiang Plain in the Northeast China, the hydrogen-  
108 oxygen isotope tracers in groundwater show marked differences with respect to local  
109 precipitation, indicating an imbalance in water volume and signs of external  
110 groundwater recharge from distant sources to surface water (Zhan et al., 2017; Ma et al.,  
111 2021a).

112 However, the complex hydrological system poses significant challenges in  
113 studying groundwater circulation and flow processes in the Songnen Basin, especially  
114 when exploring the formation of artesian basins and lake clusters. The groundwater  
115 cycle in the basin is influenced by numerous natural and human factors such as  
116 precipitation, evaporation, seasonally frozen soil, snowmelt, agricultural irrigation and  
117 among others. To minimize the influence of these factors on the groundwater cycle,  
118 winter in the Songnen basin has become an ideal period to assess the contribution of  
119 external groundwater recharge to this basin. From November to February, seasonal  
120 permafrost and snowmelt have not yet begun recharging groundwater, and the total  
121 precipitation is only 33.5 mm. During this time, the average air temperature in the  
122 Songnen Basin is above -17°C, with ice on Chagan Lake reaching a thickness of up to  
123 1 meter in winter. However, there are some spots and strips shaped areas on the lake  
124 where water remains unfrozen or shows thinner ice, suggesting influence of  
125 underground springs reaching the surface. The water source of these springs remains  
126 unknown, whether it originates from groundwater entering the lake through fault zones  
127 or from surrounding phreatic water. The answer to this question is strategic for a  
128 sustainable management of the Songnen Basin and is key for a better understanding of  
129 the groundwater-surface interactions of semi-arid artesian basins.

130 Traditional field observations are limited by sparse monitoring networks, and  
131 remote sensing provides continuous spatiotemporal coverage. The integration of these  
132 two approaches establishes a comprehensive monitoring system for studying  
133 hydrological cycles (Fig. 2). Hence, this paper focuses on the winter of Chagan Lake  
134 region in the Songnen Basin to investigate the groundwater recharge patterns of artesian  
135 basins using multi-source remote sensing and isotope techniques. First, MODIS and  
136 Landsat imagery are fused to construct the formation processes of winter lake ice,  
137 identifying the relationships between spring water, fault zones, and water-conducting  
138 structures. Next, interferometric measurements and seismic data are employed to reveal  
139 potential groundwater recharge sources and water-conducting media. Finally, external

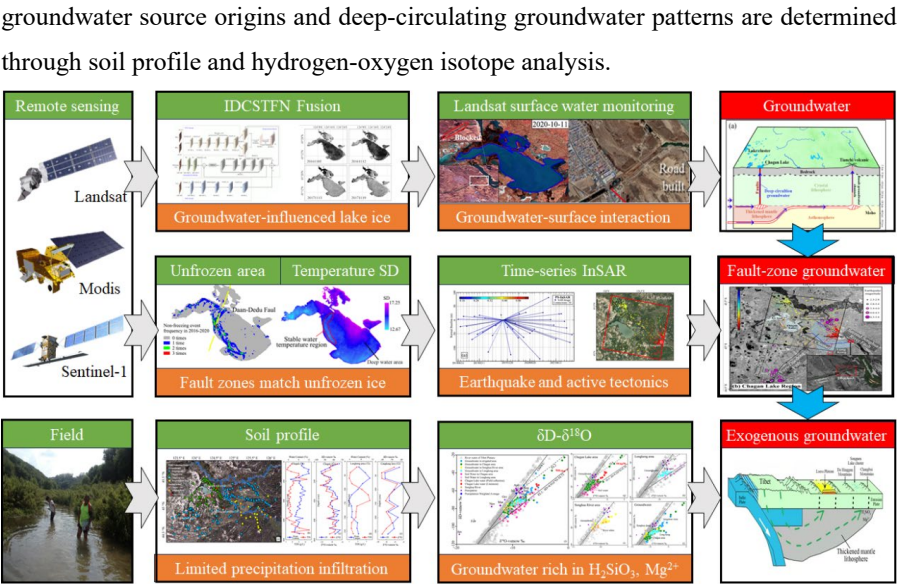


Fig. 2 Flow chart of the groundwater recharge study of Songnen Basin.

2 Results and Discussion

2.1 Chagan Lake region observed by remote sensing

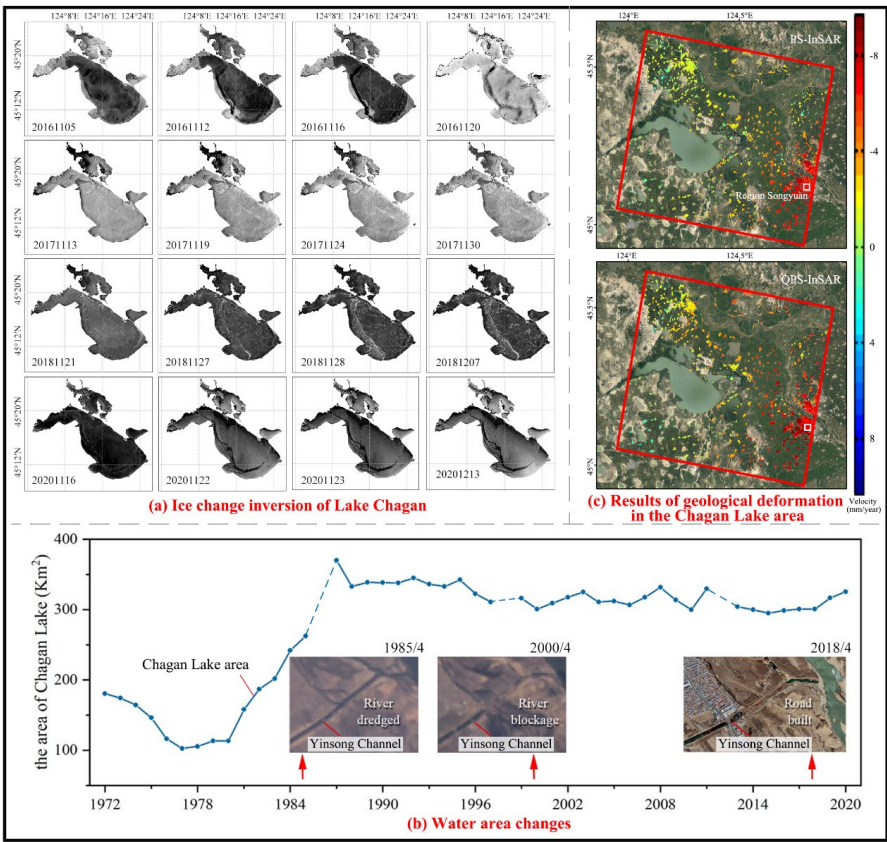
To investigate the groundwater recharge patterns, multi-source remote sensing technology was employed to the Chagan Lake region. We will report our main findings based on three aspects: lake ice formation, Chagan Lake and the Yinsong Channel evolution, and interferometric deformation measurements (Fig. 3).

**Partial Freezing of Chagan Lake:** The ice formation process of Chagan Lake was reconstructed from 2016 to 2020 using the blue band through IDCSTFN. Analysis of Fig. 3a reveals that Chagan Lake initiates its freezing process in mid-to-late November annually, typically with an unfrozen area appearing in the northwest region of the lake. As temperatures decrease, this unfrozen region shrinks, and a counterclockwise crack develops along the southwest shore. For example, large unfrozen areas emerged on the lakes western side during the initial ice formation phase in 2016. By mid-November (November 12 and 16), the majority of lake surface had undergone freezing, except for a northeast-southwest-oriented unfrozen area along the southwest shore. Following complete lake freezing on November 20, the pattern persisted with an unfrozen area in the northwest, accompanied by a narrow crack along the southwest shore. Similar cracks or ice ridges aligned with the shoreline appeared in 2018 and 2020. Although similar cracks were not detected in 2017, a large unfrozen





163 area remained evident in the northwest.



164

165 **Fig. 3 Changes in lake ice, water area, and surrounding deformation in the Chagan Lake**  
166 **observed by remote sensing. (a) The inversion process of lake ice formation in November for**  
167 **the years 2016, 2017, 2018, and 2020. MODIS and Landsat images were fused to determine**  
168 **the relationship between the springs feeding Chagan Lake and the surrounding water-**  
169 **conducting structures, based on the formation process and spatial distribution of winter lake**  
170 **ice. Landsat and Modis images were fused to reconstruct the lake ice formation from 2016 to**  
171 **2020, focusing on unfrozen areas (2019 images were missing due to cloud cover) (b) A time**  
172 **series of Chagan Lakes area from 1972 to 2020 was constructed, yielding an overall accuracy**  
173 **of 94.7% and a Kappa coefficient of 0.917. The Kappa coefficient is a statistical measure that**  
174 **evaluates the agreement between classified data and reference data. Due to flood events in 1986,**  
175 **1998, and 2012, these three years are excluded and are indicated with dashed lines. (c)**  
176 **Deformation measurements around Chagan Lake using PS-InSAR and QPS-InSAR. Synthetic**  
177 **Aperture Radar (SAR) interferometry 23, 24 was employed to analyze surface**  
178 **deformation, integrating earthquake data, water flow distribution, and isotopic**  
179 **characteristics so to identify potential recharge sources and water transmission mediums for**  
180 **groundwater in the Songnen Basin.**

181 **Chagan Lake Saved by the Yinsong Channel:** The extraction of water bodies  
182 was performed using the neural network and Yinsong Channels images were acquired  
183 from the corresponding period via Landsat from 1972 to 2020 (Fig. S1, Fig. 3b.).  
184 During the period 1972-1976, Chagan Lake gradually shrank from 181.9 km<sup>2</sup> to 118.1



185 km<sup>2</sup>. To halt this decline, the local government initiated the Yinsong Project, which  
186 constructed the Yinsong Channel between the upper Songhua River and Chagan Lake.  
187 Following the completion of the first phase in December 1977, water from the Second  
188 Songhua River began flowing into the Yinsong Channel. Consequently, the lake s area  
189 expanded from 104.9 km<sup>2</sup> to 246.7 km<sup>2</sup> during 1977-1984, representing a more than  
190 twofold expansion. The completion of the Yinsong Channel's headworks in the second  
191 project phase (1984) facilitated a subsequent expansion of Chagan Lake, reaching a  
192 total area of 373.9 km<sup>2</sup> in 1987. Interestingly, the channels head was blocked after 1989,  
193 preventing water from the Songhua River flowing into Chagan Lake through the  
194 Yinsong Channel (**Fig. 3b**). Nevertheless, a persistent hydrological input recharging  
195 Chagan Lake through the Yinsong Channel continues to exist, and the lakes area has  
196 remained above 300 km<sup>2</sup> since 1990.

197 **Subsidence in the Chagan Lake Region:** To investigate tectonic activity in the  
198 Chagan Lake region, 39 images from 2018 to 2021 were selected using PS-InSAR and  
199 QPS-InSAR through the SARProz tool (Bai et al., 2022; Perissin et al., 2012). The result  
200 identified 13,358 PS points through PS-InSAR and 13,739 points through QPS-InSAR,  
201 exhibiting overall coherence greater than 0.8 and similar deformation results In the  
202 Songnen region, characterized by densely distributed PS points, the cumulative  
203 subsidence measured by PS-InSAR and QPS-InSAR reached 27.44 mm and 25.71 mm  
204 (**Fig. S2**). The time-series measurements from both methods demonstrated a high  
205 correlation of 0.99, with a deformation error of 1.73 mm. Both methods indicated that  
206 subsidence is the primary ground movement in the Chagan Lake region along the line  
207 of sight direction (**Fig. 3c**). The subsidence pattern intensifies from west to east,  
208 particularly in the Songyuan City and Yinsong Channel region, where the subsidence  
209 rate exceeds 7 mm/a.

## 210 **2.2 Chagan Lake is recharged by fault zone groundwater**

211 The stable ice-free regions of Chagan Lake provide a research target for exploring  
212 groundwater sources. The formation of lake ice is influenced by some factors, including  
213 temperature, wind, solar radiation, water depth (Dibike et al., 2011). It can be assumed  
214 that solar radiation is uniform across the whole Chagan Lake, considering its area only  
215 420 km<sup>2</sup>. Lakes normally begin to freeze at the edges near the land, then expand to the  
216 center. And the freezing time is linearly related to the lakes depth, with a delay of one  
217 day per meter increasing in depth (Kirillin et al., 2012). The extracted ice-free regions



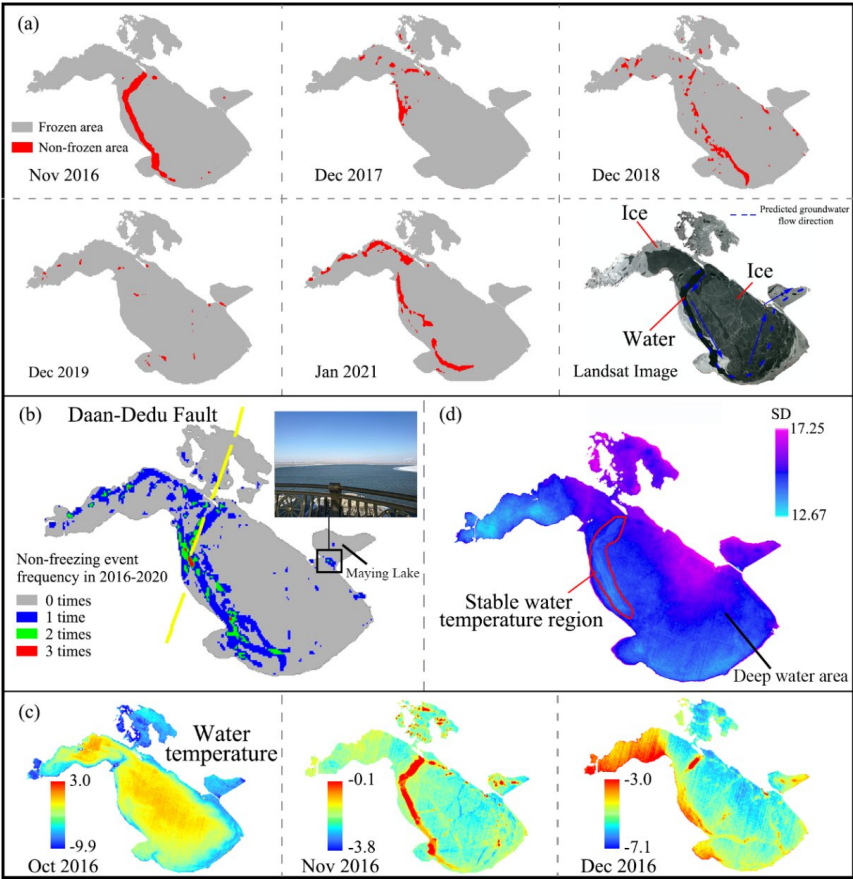


218 predominantly occur in the northwest and along the southwestern shore of Chagan Lake,  
219 while the deeper central regions typically freeze earlier (**Fig. 4a**), which contradicts the  
220 general pattern that deeper waters tend to freeze more slowly. The overlay of these  
221 extracted unfrozen regions indicates that the northwest side and southwestern shore are  
222 most likely to remain unfrozen (**Fig. 4b**). Notably, the western side of the lake  
223 consistently exhibits ice-free zones, with the same area remaining unfrozen on three  
224 occasions over a five-year period.

225 The annual temperature variations of Chagan Lakes surface also corroborate the  
226 anomalous distribution of lake ice. Landsat-derived water temperature data were  
227 employed to analyze temperature variations from August 2016 to July 2017 (**Fig. S3**).  
228 The Landsat images during this period were minimally affected by clouds, enabling a  
229 comprehensive depiction of the 12-month temperature variations. As temperatures  
230 begin to drop in October, the water temperature near the lakes edges becomes  
231 significantly lower than at its center. By early winter (November and December), the  
232 deeper southeastern part of the lake has already frozen, but the shallower southwestern  
233 shore and northwest side present higher water temperature (**Fig. 4c**). Due to the shallow  
234 penetration of optical imagery in water, the retrieved temperature only reflects the lakes  
235 surface temperature. As winter temperatures continue to drop, the lakes surface  
236 temperature becomes primarily influenced by external factors like air temperature and  
237 wind, making such phenomena unlikely to occur in other months.

238 Coincidentally, the areas with frequent ice formation and higher water temperature  
239 correspond to the location of the Daan-Dedu Fault (**Fig. 4b**). The Daan-Dedu Fault,  
240 which is the largest fault within the Songnen Basin, runs through Chagan Lake. The  
241 reverse fault-fold deformation mechanism of this fault zone exhibits both strike-slip  
242 and thrusting movements, providing channels for groundwater to discharge. The  
243 Standard Deviation (SD) of lake surface temperature, which has been used to trace  
244 groundwater discharge in previous studies ([Liao et al., 2022](#); [Mallast et al., 2014](#); [Wilson and Rocha, 2012](#)),  
245 was calculated from August 2016 to July 2017. An anomalous band-  
246 like pattern characterized by minimal temperature variations exists in the central area  
247 of Chagan Lake, away from the deep water zones (**Fig. 4d**). This stable water  
248 temperature region corresponds to the last frozen area, coinciding with the trend of the  
249 Daan-Dedu Fault.

250



**Fig. 4** Inversion results of lake ice and water temperature in Chagan Lake. (a) Extracted results on the non-freezing areas of lake ice from 2016 to 2020 and groundwater flow direction. (b) Frequency distribution of non-freezing events from 2016 to 2020. (c) Inversion results of water temperature from October to December 2016. (d) Standard deviation of water temperature.

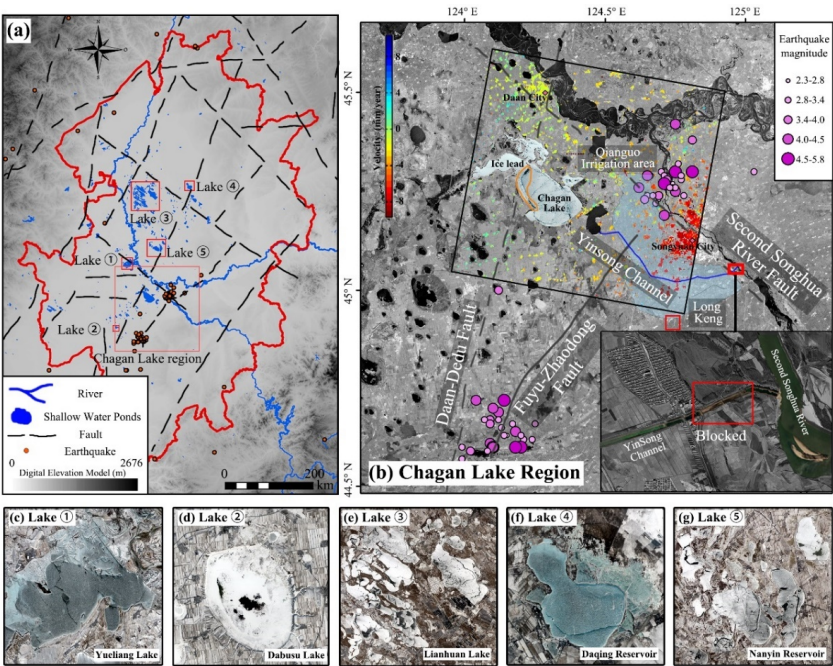
The distribution of ice-free areas, SD anomaly zones, and fault zones are consistent, suggesting that warmer deep groundwater likely upwells through the fault, leading to the spatial distribution of water temperature and lake ice. The groundwater from the fault flows west to east towards the Maying Lake, which is a drainage outlet at the northeastern side of Chagan Lake (Fig. 4b). Influenced by the Coriolis force, the upwelling groundwater shifts southward, forming a fracture along the southwestern shore of the Chagan Lake (Fig. 4a). Since the southeastern part of the lake is in a deep water area ( $> 4\text{m}$ ), the fracture terminates in that direction. Due to the influence of water flow, ice-free regions are observed in the shallower Maying Lake region, consistent with field observations (Fig. 4b). The distribution of these regions is also



uncertain due to multiple factors such as temperature and wind direction.

**2.3 Songnen Basin is widely recharged by fault zone groundwater**

Groundwater recharge through fault zones is similarly widespread in other areas of the Songnen Basin (**Fig. 5a**). For example, the Yinsong Channel continuously supplies water to Chagan Lake, even though its source has been blocked (**Fig. 5b**). The channel is primarily located within the Qianguo irrigation district, and traditional studies suggest that it is recharged by irrigation return flow from this region (Dong and Bao, 2009; Tang et al., 2021). The Yinsong Channel was under construction during the winter when the average temperature was above -17°C. The frozen soil layer, which was formed by the low temperature and exceeded 1 m in thickness, blocked both surface water infiltration and irrigation return flow. During the construction, rising springs and quicksand emerged in some sections after the exposure of a 1-meter-thick frozen soil layer. This indicates that besides precipitation infiltration and irrigation return flow, there are other recharge sources for the Yinsong Canal.



**Fig. 5** Distribution map of fault zones and lake clusters in the Songnen Basin. (a) Fault zones, lake clusters, and earthquakes distribution in the Songnen. (b) Deformation measurement results for the Chagan Lake region. The Daan-Dedu, Fuyu-Zhaodong, and Second Songhua River fault zones pass through the Chagan Lake region, with numerous earthquakes occurring on both sides of the fault zones. (c)-(g) are Yueliang Lake, Dubusu Lake, Lianhuan Lake, Daqing Reservoir and Nanyin Reservoir.

Moreover, the inconsistency between water volume fluctuations in the Yinsong



289 Channel and the irrigation district also suggests the existence of other recharge sources.  
290 The annual irrigation return flow in the Qianguo irrigation region was 130 million m<sup>3</sup>  
291 from 1975 to 1998, and decreased to 98 million m<sup>3</sup> by 2010, representing a 25%  
292 reduction due to water-saving measures(Dong and Hu, 2015). The restoration of  
293 Chagan Lake following the Yinsong Channel construction indicates that the channel  
294 serves as a vital water source (**Fig. 5b**), contributing 35% of the lakes volume (Zhu et  
295 al., 2012). A 25% decrease in irrigation return flow would inevitably affect the Yinsong  
296 Channel, potentially leading to the shrinkage of Chagan Lake. However, the Chagan  
297 Lake has maintained above 300 km<sup>2</sup>, with a recent trend of expansion since 2010.

298 These two phenomena indicate the Yinsong Channel has additional significant  
299 recharge sources besides precipitation and irrigation return flow. Similar to the fault  
300 distribution in the Chagan Lake, the north-south trending Fuyu-Zhaodong Fault  
301 intersects the Yinsong Channel, and the groundwater discharge from this fault zone  
302 becomes a potential recharge source (**Fig. 5b**). Time-series interferences reveal  
303 significant subsidence in the Yinsong Channel region at a rate of approximately 4 mm/a.  
304 Seismic activities have been concentrated on the eastern side of Chagan Lake since  
305 2013, which coincides with areas of severe subsidence (**Fig. 5b**). The southern section  
306 of the Fuyu-Zhaodong Fault is the most seismically active area in Northeast China, with  
307 most of the Songnen Basin's earthquakes concentrated near this fault in recent years  
308 (**Fig. 5a**).

309 The focal depths of these earthquakes range from 4 to 35 km. The largest recorded  
310 earthquake in Northeast China occurred in 1119 around the Fuyu-Zhaodong Fault Zone.  
311 The earthquake region was located in the Qianguo irrigation area, with a magnitude of  
312 6.75 (Shen et al., 2016). After this earthquake, a substantial volume of groundwater  
313 surged from the fault, washing over the overlying loess and formed the Longkeng Gully,  
314 located 10 km south of Yinsong Channel (Wu et al., 1988). This natural gully is now  
315 approximately 2,500m long, 300m wide and several meters deep (**Fig. 1e; Fig. 5**).  
316 Numerous rising springs emerge from the Longkeng Gully, forming streams with a  
317 stable flow rate of 2m<sup>3</sup>/s and a temperature of approximately 10°C. These springs have  
318 become a vital water source for the Songyuan city. The existence of Longkeng indicates  
319 that frequent seismic activity around the Fuyu-Zhaodong Fault can cause qualitative  
320 changes in groundwater movement. Large volumes of groundwater recharge the  
321 Yinsong Channel through the fault and eventually flowed into Chagan Lake as the strata  
322 subside.



323 In addition to the Daan-Dedu Fault and Fuyu-Zhaodong Fault, several large N-S  
324 and E-W trending fault zones are distributed in the Songnen Basin, including the  
325 Nenjiang Fault, Second Songhua River Fault, and Binzhou Fault (**Fig. 5a**). Lake  
326 clusters and rivers in the Songnen Basin are situated on a subsidence fault plain formed  
327 by these faults. Other lakes in the Songnen Basin, such as Yueliang, Dabusu, Huao,   
328 Xidaihai, and Lianhuan lakes, also exhibit unfrozen areas as observed in Landsat images  
329 (**Fig. 5c-g**). For example, the Lianhuan Lake region has been developed into a spring  
330 resort. These lakes are distributed along fault zones and generally recharged by deep  
331 groundwater (**Fig. 5a**). The Songhua and Nenjiang rivers are also aligned with fault  
332 zones, which exert a significant influence on the formation and hydrological control of  
333 these rivers and lakes.

334 The NE-SW, NW-SE, and E-W trending fault structures shape the spatial pattern  
335 of lake development, and define fault-controlled basins. As analysed by the Dabusu  
336 Lake profile near Chagan Lake, the sediments of lakes in the Songnen Basin primarily  
337 consist of aeolian deposits and biological remains. The average sedimentation rate of  
338 lakes in the Songnen Basin has been approximately 0.54 mm/a over the past 15000  
339 years (Shen et al., 1998). The Songnen Basin is seismically active, with the eastern  
340 region experiencing an average subsidence rate of 4 mm/a (Lingyun et al., 2014). The  
341 surface subsidence rate in the Songnen Basin is significantly higher than the lake  
342 sedimentation rate, suggesting that lake evolution is primarily influenced by tectonic  
343 displacement rather than sedimentation. Several caves exist within active geological  
344 structures, and their collapse leads to surface subsidence. These caves serve as conduits  
345 and storage spaces for groundwater. Under the influence of seismic and other geological  
346 activities, groundwater from fault zones rises to recharge these shallow lakes, thereby  
347 influencing the formation of lake ice.

## 348 **2.4 Limited local precipitation recharge of fault zone groundwater**

349 Lake clusters in the Songnen receive recharge from fault zone groundwater. And  
350 traditional water balance theory suggests that groundwater recharging shallow lakes is  
351 derived from precipitation infiltration in surrounding mountainous and plateau areas,  
352 or irrigation return flows. If precipitation or irrigation water indeed recharges  
353 groundwater through infiltration, it would inevitably lead to soil water saturation.  
354 Hence, soil drilling and hydrogen-oxygen isotope measurements were performed  
355 during 2017 and 2018 in the Songnen Basin to identify the groundwater sources,

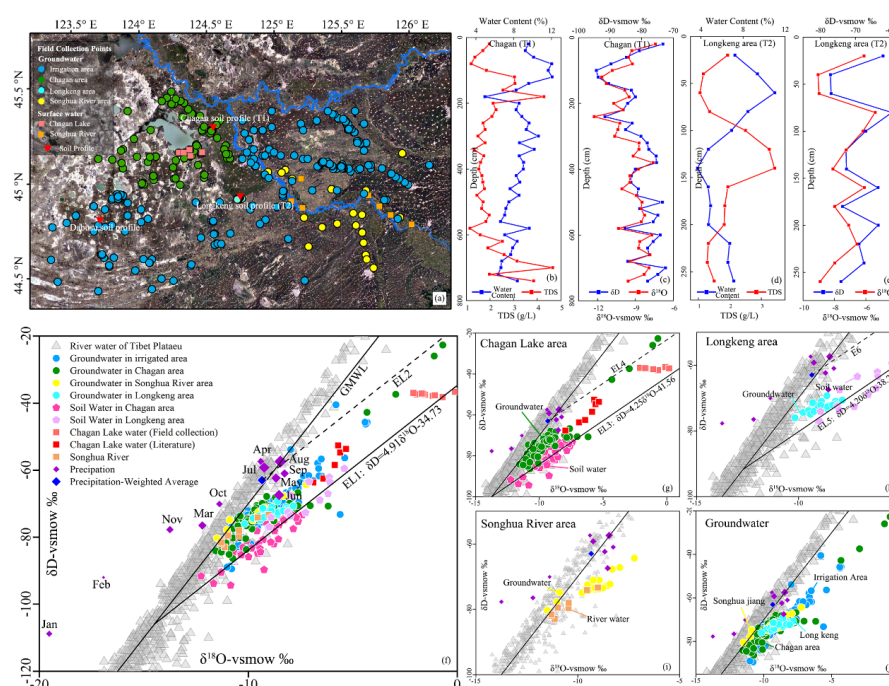




356 especially the Chagan Lake region.

357 The locations of the soil profiles includes the Chagan Lake surrounding region  
358 (T1), Longkeng region (T2), and Dabusu region (**Fig. 6a**). The maximum water holding  
359 capacity of the Dabuxun profile is 13.4% and 14% (**Fig. S4**). This result indicates that  
360 the maximum field soil-water holding capacity is  $\geq 14\%$  in the Chagan Lake region due  
361 to the relatively uniform granularity of loess. The maximum values of water contents  
362 in Profile T1 and T2 are only 12.02% at 120cm and 11.01% at 60 cm below the surface.  
363 These values are less than the maximum water holding capacity (14%), indicating a soil  
364 moisture deficit (**Fig. 6b-e**).

365 The Total dissolved solids (TDS) in the Profile T1 around Chagan Lake exhibits  
366 two peaks: the first peak occurs at 1.8m with 4.2 g/L, and the second reaches 4.6 g/L at  
367 7.0m. These peaks represent the depth of previous precipitation infiltration. The first  
368 peak is influenced by precipitation infiltration, which has transported surface salts into  
369 the soil. The secondary peak is related to irrigation or surface water infiltration. This  
370 profile is located in a low-lying area where surface water converges, so this location  
371 serves as an optimal observation point if groundwater is recharged through soil  
372 infiltration. In the Chagan Lake region, the TDS of phreatic groundwater is 0.37-2.1  
373 g/L, with an average of 0.96 g/L. For confined water, TDS is 0.35-1.43 g/L, with an  
374 average of 0.6 g/L (Xu et al., 2020). The secondary peak demonstrates that the depth of  
375 soil infiltration reaches 7m, with soil water TDS ( $>4$  g/L) exceeding that of groundwater.  
376 This peak reflects the depth of surface water infiltration, suggesting limited potential  
377 for surface irrigation water to infiltrate into groundwater, even in pothole regions. In  
378 the Profile T2 at Longkeng region, the peak TDS occurs at 1.4m, measuring 4.65g/L,  
379 which exceeds the maximum TDS of groundwater. Therefore, the previous point that  
380 groundwater only originates from local precipitation, irrigation water, and river water  
381 infiltration is inconsistent with the sampling results in the Chagan Lake region.



**Fig. 6** Field sampling results in the Chagan Lake region. (a) Location map of hydrogen-oxygen isotope and soil profile sampling points. Surface water and groundwater are represented by circles and squares, respectively, and are distinguished by different colors based on the sampling regions. The sampling locations of Chagan, Longkeng, and Dabusu soil profiles are marked by inverted triangles. (b)–(e) TDS, water content, and hydrogen-oxygen isotope results from soil profiles around Chagan Lake (T1) and Longkeng (T2) regions. (f)–(j) Relationships between hydrogen-oxygen isotopes in surface water, soil water, and groundwater in the Chagan Lake region. Groundwater, soil water, surface water, and precipitation are represented by circles, pentagons, squares, and diamonds, respectively. River water from the Tibet Plateau is represented by gray triangles. The isotope characteristics of the collected lake water are almost parallel to the  $\delta^{18}\text{O}$  axis, because the sampling area in Chagan Lake is near the shore, where lake water has low mobility and high evaporation. MuRong Li et al conducted isotope measurements across the entire Chagan Lake in 2019–2022 (Li et al., 2023), and these results were added as literature. EL1–6 are evaporation lines. EL1 represents the evaporation line of soil water in the Chagan Lake and Longkeng regions, while EL3 and EL5 represent the evaporation lines of soil water in the Chagan Lake and Longkeng region, respectively. EL2, EL4, and EL6 are three other lines parallel to the precipitation-weighted average.

The hydrogen-oxygen isotope results also corroborate the conclusion that groundwater has other recharge sources, possibly from extra-basin water. Isotope points were established based on groundwater and surface water samples collected from Chagan Lake, Songhua River, Longkeng, and irrigation regions (Fig. 6f). Lake water exhibits greater isotopic enrichment compared to groundwater and soil water. The hydrogen-oxygen relationship points of soil water from Chagan Lake and Longkeng profiles plot along the evaporation line EL1, which differs significantly from local precipitation. Soil water is more depleted than local precipitation points and



precipitation that infiltrates the soil and undergoes evaporation should align with EL2. Therefore, the primary source of soil water is not precipitation. The isotopic characteristics of soil water fluctuate significantly with depth in the Longkeng profile. This profile was sampled in November 2017, after four irrigation events from spring to summer. The soil water enriches in isotope character due to evaporation and transmits deeper after each irrigation, consequently leading to isotope fluctuations. Moreover, the soil water is more enriched than groundwater overall in the Longkeng region, indicating that the soil water originates from groundwater irrigation. Soil water shows greater isotopic depletion relative to groundwater in the Chagan Lake region because it is further from the Global Meteoric Water Line (GMWL) and predominantly affected by evaporation. The irrigation with groundwater, combined with the evaporation-crystallization process, results in further depletion of the soil water.

The hydrogen-oxygen isotopic composition in groundwater, which recharges the soil water, shows more depleted than local precipitation. This isotopic signature indicates that groundwater recharge originates from external sources rather than soil water and local precipitation. The Second Songhua River follows the fault zone and flows through the Chagan Lake region. The isotopic results show that river water is generally more depleted than groundwater, making it a potential source of groundwater recharge (**Fig. 9i**). But topographical constraints preclude it from being a recharge source. The water level of Second Songhua River is 132m in the south and 121m in the north, while the elevation of Longkeng spring is 150m. This significant elevation difference, coupled with the fact that spring water flows into the Second Songhua River, demonstrates that the river water cannot recharge the Fuyu-Zhaodong fault through the Second Songhua River fault.

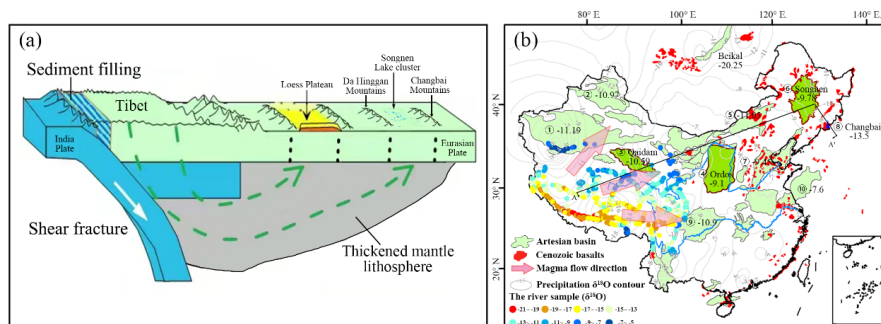
The Changbai Mountains and Greater Khingan Range, situated on the eastern and western sides of the Songnen Basin, have average elevations exceeding 1000m and significant hydraulic gradients, making them potential groundwater recharge areas for Songnen ([Jiang and Chen, 2015](#); [Ma et al., 2021b](#)). However, both regions exhibit water imbalances and receive external groundwater recharge themselves. The Changbai Mountains contribute an average runoff of  $3.1 \times 10^{10} \text{ m}^3$ , accounting for 87% of Jilin Province's total runoff. But water balance and isotopic analyses reveal that the Tianchi Lake in Changbai Mountain receives external groundwater recharge ( $\geq 0.8 \text{ m}^3/\text{s}$ ) ([Jiang and Chen, 2015](#)). In the Greater Khingan Range, deep groundwater discharges through the Erbugan fault and Xinlin-Xiguitu fault zones, resulting in unfrozen rivers in the



Huma River basin even at temperatures of  $-40^{\circ}\text{C}$  (**Fig. S5**). Similar to the Songnen Basin, the hydrogen-oxygen isotopes in groundwater from both the Changbai Mountains and Greater Khingan Range are more depleted compared to local precipitation, and the groundwater isotopic compositions of all three regions are similar to rivers in the Tibetan Plateau (**Fig. 6j**).

## 2.5 Groundwater pattern of artesian basins

The Songnen Basin is characterized by extensive Cenozoic basalts. Recent studies have revealed the existence of a deep-circulation groundwater pattern in areas dominated by Cenozoic basalts. The endorheic region in the Tibetan Plateau loses approximately  $540 \times 10^8 \text{ m}^3$  water annually, equivalent to the Yellow Rivers annual flow (Yong et al., 2021). This water is transported to eastern China in the form of deep-circulating groundwater through seepage channels within north-south trending rift valleys of the Tibetan Plateau (Liu et al., 2023). These channels originated as contraction joints formed during the cooling of basaltic magmatic rocks. Numerous artesian basins are situated in the arid and semi-arid regions surrounding the Tibetan Plateau, including the Tarim, Qaidam, Ordos, North China Plain, and Songnen Basin (Ma et al., 2021a; Liu et al., 2024; Chen et al., 2012). There has been considerable attention on whether a potential relationship exists between the Tibetan Plateau's lost water and artesian basins' external groundwater. If these artesian basins receive groundwater recharge from Tibetan Plateau seepage, cooling contraction joints from past magmatic activity must exist between the plateau and these basins. This indicates that since the Cenozoic era, these basins experienced magmatic activity originating from Tibet's asthenospheric mantle.



**Fig. 7 Conceptual model and distribution of deep circulation groundwater recharge. (a) Conceptual diagram of deep circulating groundwater recharge to lakes and volcanic crater lakes through fault zones (Wang et al., 2025). (b) Distribution of artesian basins, Cenozoic basalts and  $\delta^{18}\text{O}$  isotopes (Zhang et al., 2025). ①–⑩ correspond to Tarim, Junggar, Qaidam,**



470 **Ordos, Erenhot, Songnen, North China Plain, Changbai Mountain, Sichuan, and Subei Basin,**  
471 **respectively.**

472 An estimated 500,000 km<sup>3</sup> of freshwater and low-salinity water exists beneath the  
473 continental shelves near Australia, China, North America, and South Africa (Post et al.,  
474 2013). Traditional groundwater circulation theory suggests this water originated from  
475 glacial-period precipitation when sea levels were substantially lower. However, the  
476 origin of freshwater and low-salinity water in continental shelf aquifers remains debated,  
477 particularly due to the artesian characteristics of submarine freshwater aquifers.  
478 Groundwater discharge in the South Atlantic Bay coastal areas amounts to  
479 approximately 40% of river discharge, analyzed using 226Ra data from brackish  
480 groundwater and coastal water residence time (Moore, 1996). Similarly, substantial  
481 freshwater discharge occurs through submarine groundwater along Chinas coastline  
482 (Wang et al., 2021). Since glacial-period paleowaters trapped in aquifers lack sustained  
483 artesian characteristics, its inferred that continental shelf freshwater originates from  
484 deep-circulating groundwater. This is supported by widespread volcanic activity in  
485 eastern China during the Cenozoic era, where magmatic flows caused by the subduction  
486 of the Indian plate flowed and erupted in three directions: northeast, east, and southeast  
487 (Fig. 7b). These magmatic flows created water-conducting channels, forming  
488 groundwater networks.

489 Research shows that the Qaidam Basin, adjacent to eastern Tibetan Plateau,  
490 receives external water recharge from Tibets endorheic region, and this water upwells  
491 to lake clusters through basement fault zones in the basin (Liu et al., 2024). In the  
492 eastern Ordos artesian basin, on the top of Lvliang Mountain (2783m), there exists  
493 rising springs and lake clusters, which are derived from Tibetan seepage water as  
494 measured by hydrogen-oxygen isotope (Zhang et al., 2025). Deep-circulation  
495 groundwater from Tibetan recharges the Loess Plateau, where the groundwater  
496 penetrating through the lithosphere facilitates the formation of red clay layer (Wang et  
497 al., 2025). Based on previous deep circulation groundwater models, this paper  
498 constructed a deep-circulating groundwater model for arid and semi-arid regions (Fig.  
499 7a). The Indian Ocean plate subducts beneath the Eurasian plate, causing high-pressure  
500 in the mantle and triggering volcanic eruptions and magmatic activity. Following the  
501 cessation of volcanic eruptions and transition to extinction, the magmatic activity in the  
502 mantle ceases, and the magma crystallizes into solid rock masses through thermal  
503 equilibration with the adjacent country rocks. The low SiO<sub>2</sub> content in basaltic





504 magmatic rocks results in reduced magma viscosity, leading to the formation of  
505 continuous cooling-contraction fractures along the flow orientation within the basaltic  
506 unit. These fractures serve as preferential pathways for rapid groundwater transport  
507 between recharge zones and artesian basins (Wang et al., 2024).

508 Research has revealed that groundwater contributes approximately 65% of the  
509 water in the Changbai Mountain Tianchi (Jiang and Chen, 2015). Given Tianchi Lakes  
510 elevation of 2,189.7 m, hydraulic and isotopic analyses indicate that Tianchi receives  
511 seepage water from Tibet, and there exists water-conducting channels between Tibet  
512 and Changbai Mountain. If deep-circulating groundwater recharge reaches the  
513 Changbai Mountain, some water-conducting channels must have passed through the  
514 Songnen Basin, which is situated between the Tibetan Plateau and Changbai Mountain.  
515 Due to seismic activity in Songyuan and its surrounding areas, groundwater upwells  
516 through fault zones after the disruption of some water conduits and overflows as springs  
517 to form shallow lakes. In these shallow lakes such as Chagan Lake, unfrozen regions  
518 during winter are the spring outflow points. An increasing number of studies have  
519 revealed that artesian basins in arid and semi-arid regions exists similar groundwater  
520 recharge pattern, including the Tarim Basin, Zhangye Basin, Badanjilin Desert, Erenhot  
521 Basin, and Hulun Lake Basin (Fig. S6). Similar cross-basin recharge exists between  
522 numerous sub-basins in the United States, and lateral groundwater recharge distances  
523 exceed 200 km in the arid western regions (Yang et al., 2025). The Qiangtang-Songnen  
524 deep-circulating groundwater recharge pattern may be widespread in many artesian  
525 basins.

## 526 **2.6 Limitations of the study**

527 Remote sensing and isotope analyses are employed to explore groundwater  
528 patterns in the Songnen Basin. However, some limitations still exist, including: (1)  
529 Given that the Songnen Bains is situated over 3,000km away from the endorheic  
530 Tibetan Plateau, and considering that the water conduit extends to mantle depths,  
531 additional comprehensive investigations are required to establish the potential  
532 connection between these two regions. (2) The dense vegetation coverage surrounding  
533 the Chagan Lake results in a sparse distribution of interferometric points, with high-  
534 coherence PS points predominantly concentrated in urban areas, villages, and other  
535 built-up areas. Future studies should consider SAR images of different bands or  
536 alternative interferometric techniques to mitigate the vegetation-induced impacts on



537 interferometric results.

### 538 **3 Conclusion**

539 This paper focuses on the Songnen Basin in the winter to explore the groundwater  
540 cycle patterns of the arid and semi-arid artesian basins, using multi-source remote  
541 sensing and hydrogen-oxygen isotope techniques. Groundwater from fault zones  
542 recharges lake clusters and influences spatio-temporal distribution of lake ice in the  
543 Songnen Basin. Contrary to traditional water balance theories, this groundwater does  
544 not originate from local precipitation but from external sources. The annual leakage  
545 water from the Tibetan endorheic regions is equivalent to the runoff of Yellow River.  
546 This leaked water recharges numerous artesian basins through fault zones, including  
547 the Qaidam Basin, Ordos Basin, and Changbai Mountains, as well as the Songnen Basin,  
548 all along the recharge pathway. Due to limitations in detection technology, there is still  
549 insufficient evidence to confirm that this external groundwater originates from the  
550 endorheic Tibetan Plateau. Further research is necessary to establish the connection  
551 between endorheic Tibetan Plateau and these artesian basins.

### 552 **4 Material and method**

#### 553 **4.1 Data**

##### 554 **4.1.1 Remote sensing data**

555 The satellites data utilized in the paper were primarily acquired from Landsat,  
556 MODIS and Sentinel-1 (**Table S1**). The Landsat series of satellites, developed by  
557 NASA and USGS, have provided Earth observation imagery since 1972  
558 (<https://glovis.usgs.gov>). This paper primarily utilized Landsat 8 images, with a spatial  
559 resolution of 30m and a revisit period of 16 days. MODIS is a satellite sensor jointly  
560 developed by NASA and the Committee on Earth Observation Satellites, from which  
561 MOD11A1 and MOD09GA data were primarily applied. Landsat and MODIS imagery  
562 were mainly employed to analyze lake ice characteristics and observe changes in the  
563 Chagan Lake and Yinsong Channel since 1972. The Sentinel-1 constellation comprises  
564 Sentinel-1A and Sentinel-1B, launched in 2014 and 2016, respectively. Single Look  
565 Complex data acquired from Sentinel-1B in Interferometric Wide mode were used for  
566 interferometric measurements to quantify subsidence in the Chagan Lake region.

##### 567 **4.1.2 Water Surface Temperature Retrieval**

568 Based on the Google Earth Engine, the water temperature of Chagan Lake was  
569 inverted using USGS Landsat Collection-2 Surface Temperature dataset ([Jimenez-](#)



570 [Munoz et al., 2014](#)). This dataset employs atmospheric correction methods to retrieve  
571 land-water surface temperatures. Compared with field measurements from seven  
572 ground stations, the analysis of 259 satellite images exhibited a mean bias of  $-0.267^{\circ}\text{C}$   
573 ([Cook, 2014](#)). Liu Xuemei et al. conducted in-situ water temperature measurements of  
574 Chagan Lake from 2018 to 2019 ([Liu et al., 2020](#)). The Landsat-derived water  
575 temperature of Chagan Lake exhibited a correlation coefficient of 0.89 and an error of  
576  $1.5^{\circ}\text{C}$  (**Fig. S7**), when compared with in-situ measurements. The higher error is  
577 attributed to temporal mismatches between Landsat image acquisition and in-situ  
578 measurements, necessitating the use of temporally proximate images for validation.  
579 Nevertheless, the high correlation indicates that this dataset adequately represents the  
580 spatial distribution patterns of Chagan Lakes water temperature.

#### 581 **4.1.3 Soil profile sampling and hydrogen-oxygen isotopes**

582 The Qianguo irrigation area has an average annual irrigation return flow of  
583 approximately  $1.3 \times 10^8 \text{ m}^3$  ([Ge et al., 2023](#)), which is considered crucial for  
584 maintaining groundwater levels coupled with precipitation. To evaluate the potential  
585 groundwater recharge from precipitation and irrigation water, soil profiles were  
586 excavated at three locations in the Chagan Lake, Longkeng, and Dabusui regions. Bulk  
587 soil samples were collected using a specialized soil auger at 20-cm depth intervals.  
588 Samples were sealed in airtight polyethylene bottles, transported and stored under  
589 refrigeration. Soil water was extracted using an automated vacuum condensation  
590 extraction system (LI-2100). The extracted soil water was analyzed for  $\delta^2\text{H}$  and  $\delta^{18}\text{O}$   
591 using a MAT253 mass spectrometer.

592 Soil water content was determined using the oven-drying method with an  
593 analytical precision better than 1%. The frozen soil samples were weighed initially,  
594 heated at  $110^{\circ}\text{C}$  for 3 hours, and reweighed after drying to determine water content. 30g  
595 oven-dried soil was mixed with 150 mL of deionized water and equilibrated for 48  
596 hours, followed by centrifugation and filtration. The filtrate was analyzed by a multi-  
597 parameter water quality analyzer and ion chromatograph (ICS-2000, Dionex, USA).  
598 Ion concentrations in soil water were converted based on the soil moisture content.

599 In addition to soil profile sampling, 664 water samples from groundwater, river  
600 water, and lake water were collected in the Chagan Lake region during 2017 and 2018.  
601 The hydrogen and oxygen isotopic compositions ( $\delta^{18}\text{O}$  and  $\delta\text{D}$ ) were analyzed using a  
602 MAT253 mass spectrometer with analytical precisions of  $\pm 0.1\%$  and  $\pm 2\%$ , respectively.



#### 603 **4.1.4 Lake Ice Fusion Dataset**

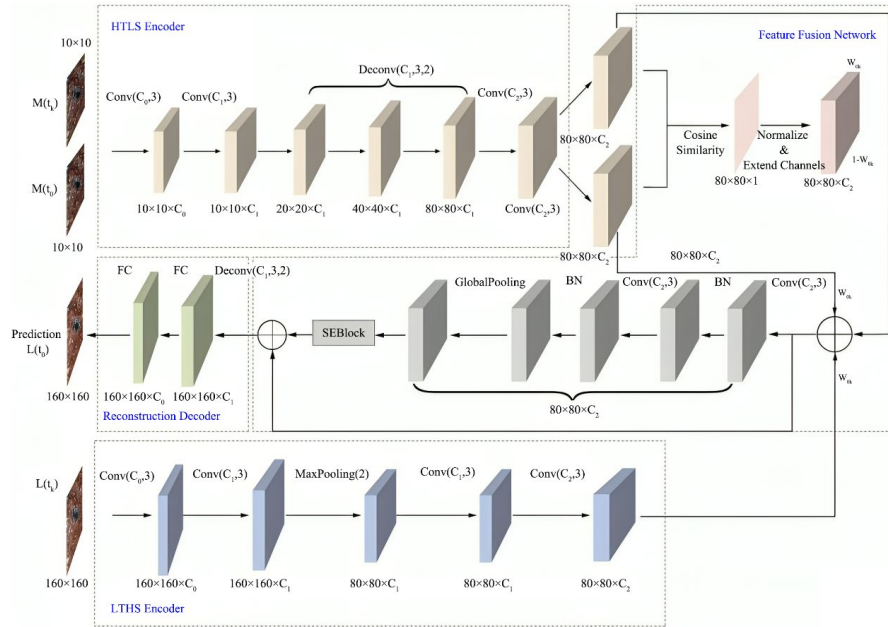
604 This paper integrates Landsat 8 and MOD09GA imagery to build an image fusion  
605 dataset and construct the lake ice formation process. Images with cloud cover below 5%  
606 underwent radiometric calibration, geometric correction, and atmospheric correction.  
607 Landsat images were cropped to 3200×3200 pixels, while MODIS images were  
608 resampled to 480m resolution and subsequently cropped to 200×200 pixels. The  
609 preprocessed data were organized into groups, with each group containing four images:  
610 one pair of temporally coincident MODIS and Landsat images for the prediction date,  
611 and one pair of MODIS images temporally adjacent to the prediction date. Through this  
612 preprocessing, filtering, and grouping procedure, a dataset containing 21 data groups  
613 was established. Among these, 15 groups of images acquired from January 2015 to  
614 December 2018 were allocated to the training set, and images acquired from January  
615 2020 to March 2021 were designated as the validation set. The constructed training and  
616 testing datasets will provide data for the subsequent training of the Landsat and MODIS  
617 fusion model.

#### 618 **4.2 Method**

619 Traditional hydrochemical isotope methods exhibit limitations due to ambiguity  
620 in groundwater source tracing. Hence, this paper combines remote sensing (Landsat,  
621 MODIS, and Sentinel-1) data and field data (soil profile and hydrogen-oxygen isotopes)  
622 to investigate the groundwater recharge pattern in the Songnen Basin. We will introduce  
623 our main methods used for lake ice inversion and deformation measurement in the  
624 following sections.

##### 625 **4.2.1 IDCSTFN fusion of Landsat and MODIS**

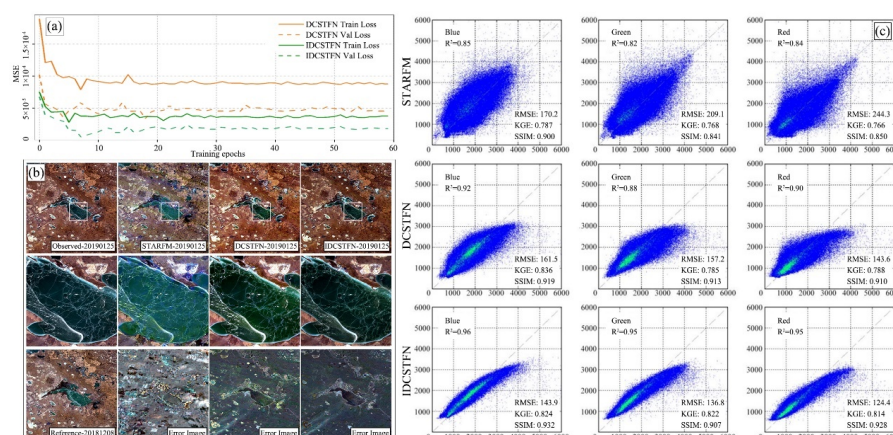
626 To continuously and stably monitor the lake ice characteristics of Chagan Lake  
627 and analyze groundwater discharge areas, this paper employs an Improved Deep  
628 Convolutional Spatiotemporal Fusion Network (IDCSTFN) to fuse Landsat and  
629 MODIS imagery. This method combines Landsats high spatial resolution with  
630 MODISs high temporal resolution to construct the lake ice formation sequence. The  
631 traditional DCSTFN follows the principles of the Spatial and Temporal Adaptive  
632 Reflectance Fusion Model (STARFM), which assumes that surface conditions remain  
633 nearly identical between reference and prediction dates. However, this assumption  
634 cannot adequately address the rapid ice growth in the Lake Chagan region.



**Fig. 8 IDCSTF structure diagram.**

Therefore, IDCSTFN utilizes a feature fusion network to replace the assumption equations in DCSTFN. The proposed fusion network computes the differences between reference and predicted images as weights to fuse input images, and subsequently employs attention residual blocks to eliminate redundant features, enhance key features of fused images, and prevent overfitting (**Fig. 8**). IDCSTFN implements an "encoder-fusion-decoder" architecture, comprising four main modules: the High Temporal but Low Spatial (HTLS) encoder, Low Temporal but High Spatial (LTHS) encoder, feature fusion, and reconstruction decoder. The network culminates in two successive fully connected layers that reduce the dimensions of the fused feature map, generating in a high-resolution fused image (specified in the supplement, IDCSTFN).





**Fig. 9 MODIS-Landsat fusion experiments using IDCSTF. (a) Loss convergence curve; (b) Fusion results from STARFM, DCSTFN, and IDCSTFN networks on January 25, 2019; (c) Scatter plots of reflectance between the observed image RGB bands and corresponding fused bands, where cyan regions indicate higher density of points.**

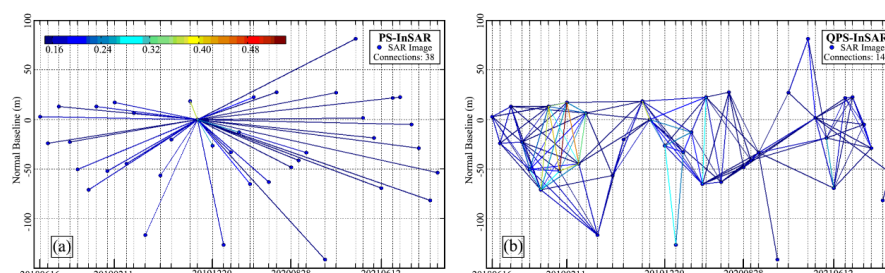
In the experiment, a dataset containing 21 data groups was used for training and the Adam optimizer was employed to optimize the training process, with Mean Squared Error (MSE) serving as the loss function. The training process demonstrated that the loss value stabilized after 20 epochs of iteration and the IDCSTFN exhibited consistently lower loss values compared to the DCSTFN (**Fig. 9a**). Using the prediction results from January 25, 2019 as a representative case, the difference image generated by STARFM exhibited significantly higher brightness than DCSTFN and IDCSTFN, and revealed anomalous values manifesting as colored stripes (**Fig. 9b**). The distinctions between DCSTFN and IDCSTFN were mainly evident at the edges between water bodies and land, with DCSTFN exhibiting noticeably higher brightness in these regions compared to IDCSTFN. This paper performs image fusion on the RGB channels of MODIS and Landsat. Quantitative analysis through scatter plots of these three bands between observed and fused images demonstrated that the IDCSTFN model outperforms both STARFM and DCSTFN across all bands. Notably, the blue band exhibited slightly higher correlation than the red and green bands, indicating that the blue band is particularly advantageous for fusion in regions dominated by water bodies (**Fig. 9c**).

#### 4.2.2 Interferometric deformation measurement

Synthetic Aperture Radar (SAR) (Bai et al., 2022; Cai et al., 2023) is employed to monitor surface deformation around Chagan Lake, characterized as an active microwave remote sensing system that employs side-looking imaging technology (Gao



et al., 2023). The Differential Interferometry SAR (D-InSAR) technique facilitates multiple observations of identical targets through SAR satellites to acquire phase difference information, which enables the calculation of spatial changes relative to the radar. However, D-InSAR encounters limitations in accurate deformation measurement due to atmospheric effects. Persistent Scatterer Interferometric SAR (PS-InSAR) (Ferretti et al., 2001) and Quasi PS-InSAR (QPS-InSAR) (Perissin and Wang, 2011) use Persistent Scatterer (PS) points to establish networks that simulate atmospheric effects, thereby enabling the measurement of surface deformations at millimeter-scale precision (specified in the supplement, PS-InSAR and QPS-InSAR).



**Fig. 10 Topological structure diagram of PS-InSAR and QPS-InSAR.**

In the experiment, 39 Sentinel-1 SAR acquisitions from Track 3 were utilized to implement PS-InSAR and QPS-InSAR over the Songnen region (Table S2). An image acquired on November 2, 2019 was selected as the master image, and 38 image pairs were generated utilizing a star topology for PS-InSAR (Fig. 10a). The maximum baseline length was 141m, remaining less than one-tenth of the critical baseline. For QPS-InSAR processing, the thresholds for coherence, spatial baseline, and temporal baseline were established at 0.148, 108, and 241 respectively, generating 144 interferometric image pairs (Fig. 10b).

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