



Short Communication

Lakes shifted from a carbon dioxide source to a sink over past two decades in China

Qitao Xiao^a, Xiaofeng Xu^b, Tianci Qi^a, Juhua Luo^a, Xuhui Lee^c, Hongtao Duan^{a,d,*}^a Key Laboratory of Watershed Geographic Sciences, Nanjing Institute of Geography and Limnology, Chinese Academy of Sciences, Nanjing 210008, China^b Biology Department, San Diego State University, San Diego, CA 92182, USA^c School of the Environment, Yale University, New Haven, CT 06511, USA^d University of Chinese Academy of Sciences, Nanjing (UCASNJ), Nanjing 211135, China

ARTICLE INFO

Article history:

Received 2 November 2023

Received in revised form 28 January 2024

Accepted 29 January 2024

Available online 9 March 2024

© 2024 Science China Press. Published by Elsevier B.V. and Science China Press. All rights are reserved, including those for text and data mining, AI training, and similar technologies.

Lakes emit large amounts of carbon dioxide (CO₂) into the atmosphere with 0.81 Pg C a⁻¹ [1], which offsets approximately 24% of global land carbon sink. However, there is considerable uncertainty in the estimate due to limited data and the effects of human activity and climate change. In China, lakes exhibit substantial variability in CO₂ exchange, resulting in uncertainties in national and regional land carbon sink assessments. For instance, on the Tibetan Plateau, lake-atmosphere CO₂ exchange can enhance land carbon sink by 33% or reduce it by 29% [2,3]. China's lakes have undergone widespread changes in the past decades; however, how they shift their role in CO₂ budget estimations over time remains unclear due to the shortage of time-series data.

China's lakes, with their diverse types and extensive distribution, hold global significance. These lakes are categorized into five groups [4]: East Plain lakes (EPL), Yunnan-Guizhou Plateau lakes (YGPL), Tibetan Plateau lakes (TPL), Inner Mongolia-Xinjiang lakes (IMXL), and Northeast Plain and Mountain lakes (NPML). However, global estimates of lake carbon emissions have predominantly relied on data from boreal (e.g., Finland) or northern temperature regions (e.g., the United States), lacking comprehensive information on China's lakes [5,6]. Notably, the CO₂ dynamics in lakes are closely associated with temperature, organic matter loads, and eutrophic status. These environmental variables in most of China's lakes exhibit distinct characteristics compared with those in boreal or northern temperate regions. Ignoring these differences poses a challenge in estimating the CO₂ budget in global lakes.

A number of studies have attempted to estimate CO₂ emissions from China's lakes in the past two decades to fill the data gaps [3,7]. The results showed that China's lakes are significant CO₂ sources, with a wide range of uncertainty (7.3 to 16 Tg C a⁻¹).

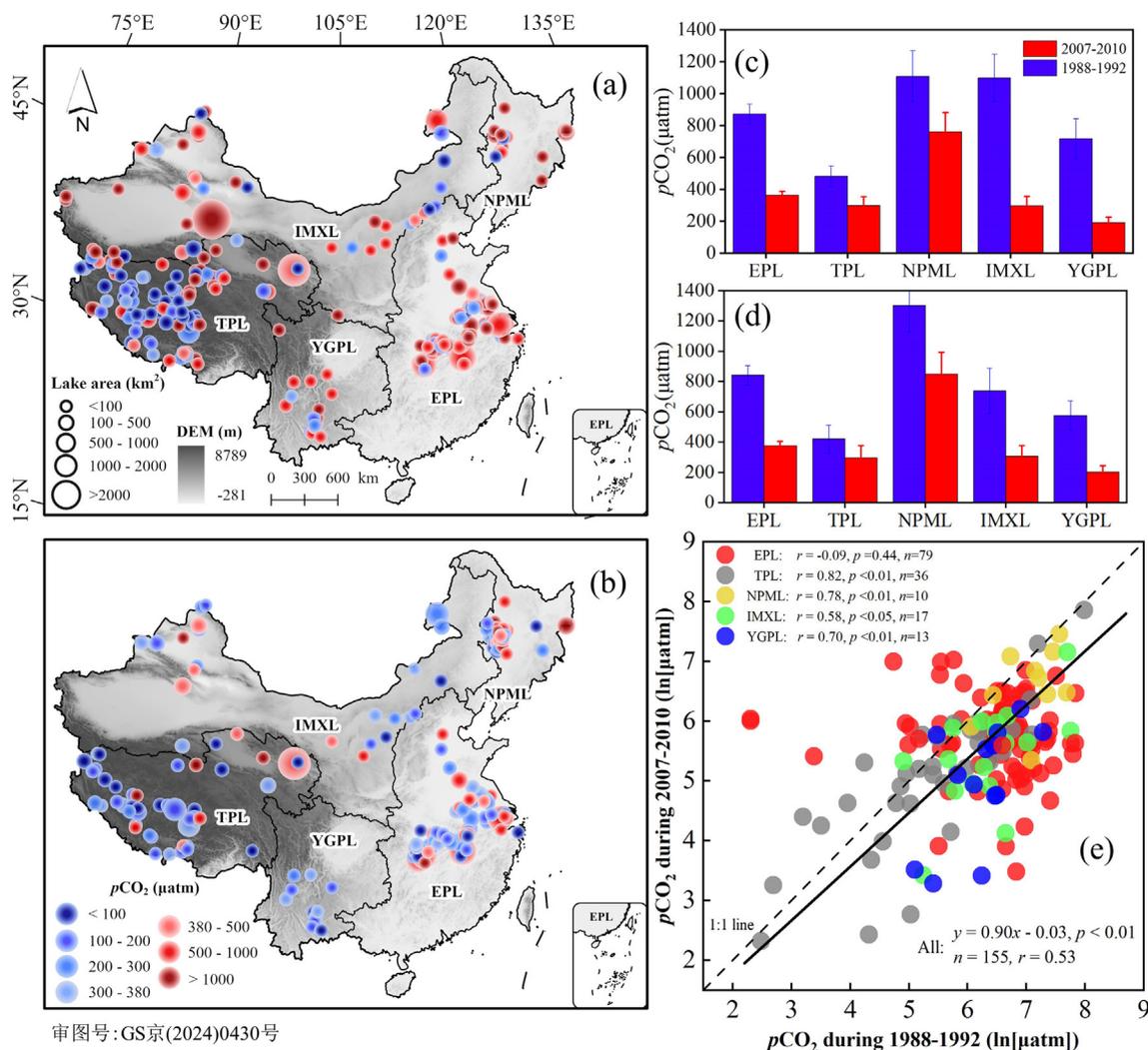
However, these findings have been challenged by regional observations indicating CO₂ uptake [2,8]. While existing literature focuses on emission magnitudes using limited data from different periods [3,7], investigations into the underlying mechanisms remain scarce. Human activities and climate change have led to a considerable increase in algal blooms in China's lakes [9], alongside changes in lake size and number due to glacier melt and rainfall runoff [10,11]. Simultaneously, a decreasing external loading accompanied by increasing dissolved oxygen has been widely reported [12]. A poor understanding of how CO₂ responds to these changes may lead to large uncertainty in emissions estimation and preclude the accurate prediction of variability under a changing environment.

Whether China's lakes act as CO₂ sinks or sources and their changes over time remain elusive. In this short communication, we took advantage of two comprehensive national surveys of CO₂ partial pressure (*p*CO₂) conducted during 1988–1992 and 2007–2010 to address this issue, and the CO₂ emissions are determined by *p*CO₂. By determining CO₂ emissions based on *p*CO₂ measurements, we compared the *p*CO₂ and CO₂ emissions between the two periods using an exceptionally extensive dataset. This approach allowed us to examine the relationship between these changes and environmental variables.

In total, 282 lakes were surveyed in 1988–1992 and 234 lakes in 2007–2010. The *p*CO₂ varied significantly across zones and between the two periods (Fig. 1), aligning with previous global lake studies [5]. Highly variable *p*CO₂ generally occurred in the EPL and TPL with numerous lakes, and peak *p*CO₂ occurred in the NPML. Over time, the average *p*CO₂ decreased by half, from 709 ± 691 to 332 ± 362 μatm (1 μatm = 0.1 Pa; Table S1 online). The 150 lakes surveyed in both periods showed a consistent decreasing trend in *p*CO₂ (Fig. 1d). Zonal CO₂ was unrelated (*p* > 0.05) to temperature and precipitation. However, differences in CO₂ were well explained

* Corresponding author.

E-mail address: htduan@niglas.ac.cn (H. Duan).



审图号:GS京(2024)0430号

Fig. 1. Spatial distribution and zonal comparison of $p\text{CO}_2$ in China's lakes. (a) Spatial distribution of $p\text{CO}_2$ during 1988–1992; (b) spatial distribution of $p\text{CO}_2$ during 2007–2010; (c) the $p\text{CO}_2$ comparison across five zones which were measured during 1988–1992 and 2007–2010; (d) the $p\text{CO}_2$ comparison in lakes which were both sampled for CO_2 measurement in the two periods (1988–1992 versus 2007–2010); and (e) the relationship of lake $p\text{CO}_2$ between the two periods. Error bars indicate standard error.

by the soil organic carbon (SOC) and chemical oxygen demand (COD) loadings in the watershed (Fig. S1 online). This suggests that external loadings (e.g., dissolved organic carbon, DOC) input may drive CO_2 variability by providing substances [13].

The CO_2 emissions decreased from $12.75 \pm 2.305 \text{ mmol m}^{-2} \text{ d}^{-1}$ in 1988–1992 to $-2.02 \pm 12.30 \text{ mmol m}^{-2} \text{ d}^{-1}$ in 2007–2010 (Table S1 online), indicating a source-to-sink shift of China's lakes. We estimated that China's lakes emitted $2.748 \text{ Tg C a}^{-1}$ (25th–75th percentiles: $1.346\text{--}4.138 \text{ Tg C a}^{-1}$) during 1988–1992 (Fig. 2). Among the total CO_2 efflux, $1.430 \text{ Tg C a}^{-1}$ (25th–75th percentiles: $1.319\text{--}1.539 \text{ Tg C a}^{-1}$) came from the EPL (Table S2 online), contributing 52% of the lake emissions. During 2007–2010, the CO_2 flux was $-0.408 \text{ Tg C a}^{-1}$ (25th–75th percentiles: $-1.408\text{--}0.605 \text{ Tg C a}^{-1}$), with 80% of the influx occurring in the EPL and TPL. This shift is advocated by a recent field measurement that reported a few lakes being a significant CO_2 sink [2,8].

Lake CO_2 dynamics are related to inter-connected physical, chemical, and biological mechanisms associated with human activities and climate change. To differentiate the effects of environmental variables and quantify their contributions to CO_2 variability, we categorized these lakes into three types (DOC-rich lakes, eutrophic lakes, and endorheic lakes, Fig. 2) based on gradi-

ents in climate, organic carbon, and eutrophic status [3,4,12]. Our results demonstrated that the variability of lake CO_2 can be primarily attributed to chemical production in the NPML (DOC-rich lakes), biological consumption in the EPL and YGPL (eutrophic lakes), and physical dilution in the TPL and IMXL (endorheic lakes) based on the correlations between CO_2 and environmental variables (Table S3 online).

In the NPML (DOC-rich lakes), we observed peak lake DOC levels (Fig. S2 online) and a positive correlation between CO_2 and DOC (Table S3 online). This suggests that the decomposition of organic carbon is the primary driver of CO_2 emissions. It is estimated that the external carbon loading (represented by COD) decreased by 15% while nutrient loadings (e.g., $\text{NH}_4^+\text{-N}$) declined by 13% [12]. These reductions were accompanied by corresponded a 56% decline in CO_2 emissions (Fig. 2). In eutrophic lakes at the EPL and YGPL, characterized by high chlorophyll *a* (Chl-*a*), CO_2 showed no correlation with DOC but exhibited a negative relationship with Chl-*a* (Table S3 online), suggesting that eutrophication can reduce CO_2 emissions by stimulating primary production. Over the past decades, phytoplankton abundance in these lakes has significantly increased, with Chl-*a* concentration rising by 83% and cyanobacteria increasing by 92% [9]. The rising cyanobacteria and Chl-*a*

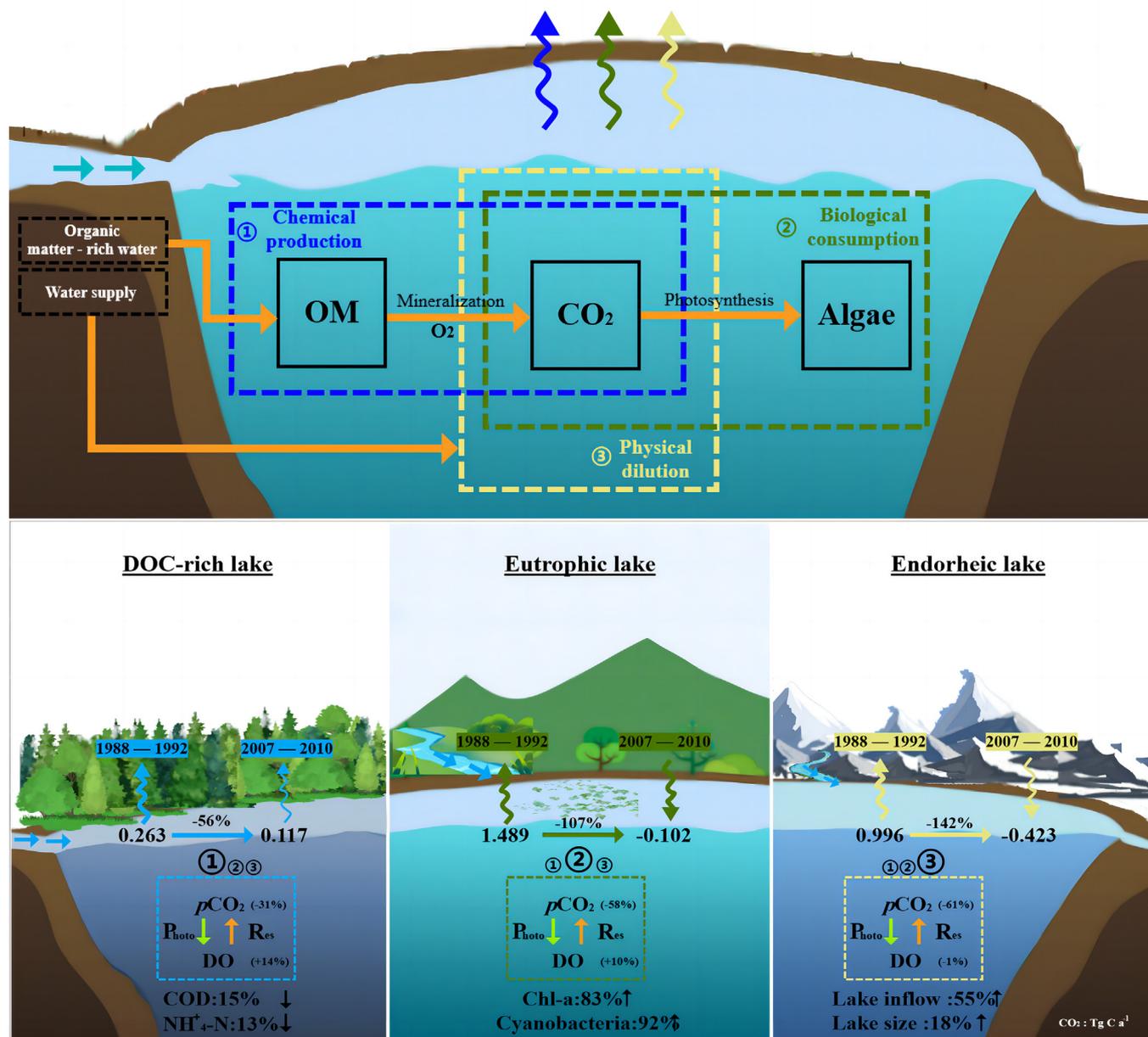


Fig. 2. Schematic of the CO₂ budget (Tg C a⁻¹) in China's lakes for the studied periods (1988–1992 versus 2007–2010). The five zones were clustered into eutrophic lakes (EPL and YGPL), DOC-rich lakes (NPML), and endorheic lakes (TPL and IMXL) based on eutrophication, hydrological condition, and watershed-derived DOC input. The P_{photo} is photosynthesis, which is represented by green arrows (consume CO₂ and increase O₂). The R_{es} is respiration, which is represented by orange arrows (consume O₂ and increase CO₂) in the lakes.

confirmed that the enhanced algal-induced primary production has led to a shift in these lakes from being CO₂ sources to becoming CO₂ sinks.

In the endorheic basin lakes (TPL and IMXL), characterized by low temperatures and relatively sparse population [4], the decrease in CO₂ emissions may be attributed to climate change-induced lake expansion [11]. Previous studies have shown that increased precipitation has contributed to a rising trend in the number and size of lakes [11]. Meanwhile, air temperature increased significantly (Fig. S3 online), likely leading to the expansion of lake areas due to melting snow and glaciers. Lakes that expand due to precipitation in glacierized catchments or glacier-fed lakes generally receive fewer terrestrial organic inputs for CO₂ production and are typically under-saturated in CO₂ [14], lead-

ing to a dilution effect on CO₂ concentrations. Lakes in the endorheic basin typically have high levels of dissolved inorganic carbon [3], and increased runoff may transport more calcium ions, which can enhance CO₂ uptake. Our estimation indicates that a 55% increase in lake inflow and an 18% increase in lake size resulted in a 142% decrease in CO₂ emissions from these lakes, effectively shifting them from CO₂ sources to sinks (Fig. 2).

Dissolved oxygen (DO) serves as a reliable indicator of CO₂ variability, although the underlying mechanisms vary geographically. The negative correlation between CO₂ and DO (Fig. S4 online) can be attributed to either respiration, where oxygen is consumed and CO₂ is produced, or photosynthesis, where CO₂ is fixed and oxygen is produced. The significant relationship between CO₂ and DOC in NPML (Fig. S4 online) suggested that organic matter

degradation dominates the DO levels. However, in eutrophic lakes at the EPL and YGPL, the CO₂ levels were unrelated to DOC (Table S3 online), while a positive correlation between DO and Chl-*a* (Fig. S5 online) was observed. This indicates that the relationship may be driven by primary production, as increased algae-induced primary production can lead to a decrease in CO₂ and an increase in DO. The increase in DO concentration in China's inland water has been reported [12]. In this context, the DO levels also significantly increased due to high primary production in eutrophic lakes and declining external loadings in DOC-rich lakes (Fig. 2). These factors likely contribute to the decline in CO₂ emissions.

Our results provide evidence that anthropogenic and natural factors concurrently regulate the CO₂ variability of lakes on a national scale. The impact of eutrophication on CO₂ variability is evident from its strong correlation with Chl-*a* and DO levels (Table S3 and Fig. S4 online). While the intensive degradation of organic matter contributes to substantial CO₂ emissions from lakes in the NPML [13], the reduction in human-derived external loadings [12] likely contributes to the decrease in CO₂ efflux. The impacts of natural factors and climate change on CO₂ variability are via two mechanisms. Firstly, climate warming has increased primary production in lakes, leading to lower CO₂ levels. Secondly, the lakes in the cold TPL region are highly sensitive to temperature; therefore, climate warming might have substantially enhanced the CO₂ variability. Overall, our findings highlight the complex interplay between anthropogenic and natural factors, as well as the influence of climate change, in shaping the CO₂ dynamics of lakes.

The source-to-sink shift of China's lakes has three implications. First, the primary CO₂ uptake occurred predominantly in lakes experiencing algal blooms, which differs from previous studies [3]. This highlights the significance of accurately estimating the CO₂ budget by considering diverse lake types [1]. Second, the significant difference in CO₂ levels observed between the two periods underscores the importance of long-term sampling to improve the quantification of CO₂ emissions. Last, our findings demonstrate that DO is the best predictor of CO₂ variability. A recent survey with long-term measurements revealed increasing DO concentrations in eutrophic lakes due to high primary production [15], suggesting that eutrophic lakes can act as CO₂ sinks within the terrestrial biosphere.

Our study revealed a significant shift in China's lakes, leading to substantial changes in the CO₂ budget, as evidenced by a halving of *p*CO₂. This shift can be primarily attributed to increased primary production in eutrophic lakes, reduced external carbon loadings in organic carbon-rich lakes, and expanded water volume in endorheic lakes. This transition on a nationwide scale highlights the importance of considering multiple mechanisms when assessing CO₂ flux in lakes. It underscores the need for comprehensive investigations of various environmental changes to accurately understand CO₂ dynamics in lakes. Furthermore, lake CO₂ dynamic variabilities are related to the size, eutrophic status, and saline of the lakes. Given the global significance of China's lakes and their diverse types, it is crucial to gather more detailed lake datasets, including saline lakes and eutrophic lakes, to improve the accuracy of CO₂ budget estimations. Additionally, the CO₂ emissions were calculated from the *p*CO₂, which may bias the emissions due to the limitations and uncertainties of snapshot sampling and the *p*CO₂ measurements, and more direct measurements with temporally representative are also needed to accurately estimate the emissions. In conclusion, our findings shed light on the complex interplay of factors affecting CO₂ dynamics in China's lakes, highlighting the need for comprehensive data and a nuanced under-

standing of these ecosystems to accurately assess their contributions to the carbon cycle.

Conflict of interest

The authors declare that they have no conflict of interest.

Acknowledgments

This work was supported by the National Natural Science Foundation of China (42271114, 42271377, U2243205), the Provincial Science and Technology Innovative Program for Carbon Peak and Carbon Neutrality of Jiangsu of China (BK20220041, BE2022422), the Science and Technology Planning Project of NIGLAS (NIGLAS2022TJ12, NIGLAS2022GS09), and the Youth Innovation Promotion Association of CAS (2023329).

Author contributions

Qitao Xiao designed and conceptualized the study, performed data analysis, and wrote the original manuscript. Xiaofeng Xu performed data analysis and edited the manuscript. Tianci Qi and Juhua Luo prepared the figures and participated in data curation. Xuhui Lee reviewed the manuscript and provided guidance. Hongtao Duan designed and conceptualized the study, and edited the manuscript.

Appendix A. Supplementary materials

Supplementary materials to this short communication can be found online at <https://doi.org/10.1016/j.scib.2024.03.022>.

References

- [1] DelSontro T, Beaulieu JJ, Downing JA. Greenhouse gas emissions from lakes and impoundments: Upscaling in the face of global change. *Limnol Oceanogr Lett* 2018;3:64–75.
- [2] Li X-Y, Shi F-Z, Ma Y-J, et al. Significant winter CO₂ uptake by saline lakes on the Qinghai-Tibet Plateau. *Glob Change Biol* 2022;28:2041–52.
- [3] Li S, Bush RT, Santos IR, et al. Large greenhouse gases emissions from China's lakes and reservoirs. *Water Res* 2018;147:13–24.
- [4] Zhang G, Yao T, Chen W, et al. Regional differences of lake evolution across China during 1960s–2015 and its natural and anthropogenic causes. *Remote Sens Environ* 2019;221:386–404.
- [5] Raymond PA, Hartmann J, Lauerwald R, et al. Global carbon dioxide emissions from inland waters. *Nature* 2013;503:355–9.
- [6] Holgerson MA, Raymond PA. Large contribution to inland water CO₂ and CH₄ emissions from very small ponds. *Nat Geosci* 2016;9:222–6.
- [7] Ran L, Butman DE, Battin TJ, et al. Substantial decrease in CO₂ emissions from Chinese inland waters due to global change. *Nat Commun* 2021;12:1730.
- [8] Jia J, Sun K, Lü S, et al. Determining whether Qinghai-Tibet Plateau waterbodies have acted like carbon sinks or sources over the past 20 years. *Sci Bull* 2022;67:2345–57.
- [9] Su H, Chen J, Li Y, et al. Carp stocking and climate change are potentially more important factors than nutrient enrichment driving water quality deterioration in subtropical freshwater lakes in China. *Limnol Oceanogr* 2023;68:S131–43.
- [10] Zhou J, Wang L, Zhong X, et al. Quantifying the major drivers for the expanding lakes in the interior Tibetan Plateau. *Sci Bull* 2022;67:474–8.
- [11] Zhang G, Luo W, Chen W, et al. A robust but variable lake expansion on the Tibetan Plateau. *Sci Bull* 2019;64:1306–9.
- [12] Ma T, Zhao N, Ni Y, et al. China's improving inland surface water quality since 2003. *Sci Adv* 2020;6:eaa03798.
- [13] Maberly SC, Barker PA, Stott AW, et al. Catchment productivity controls CO₂ emissions from lakes. *Nat Clim Chang* 2013;3:391–4.
- [14] St Pierre KA, St Louis VL, Schiff SL, et al. Proglacial freshwaters are significant and previously unrecognized sinks of atmospheric CO₂. *Proc Natl Acad Sci USA* 2019;116:17690–5.
- [15] Jane SF, Hansen GJA, Kraemer BM, et al. Widespread deoxygenation of temperate lakes. *Nature* 2021;594:66–70.



Qitao Xiao (Ph.D.) is currently a research assistant at Nanjing Institute of Geography and Limnology, Chinese Academy of Sciences. His research includes the carbon and nitrogen cycle processes and associated greenhouse gases emissions of inland waters.



Hongtao Duan (Ph.D.) is currently a professor at Nanjing Institute of Geography and Limnology, Chinese Academy of Sciences. His research mainly utilizes satellite remote sensing to focus on ecological and environmental issues in inland water, such as lakes, reservoirs, and rivers.