



# Unexpected shifts of dissolved carbon biogeochemistry caused by anthropogenic disturbances in karst rivers

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## ABSTRACT

Dissolved carbon (C) provides critical feedbacks to regional biogeochemical processes and global C cycling. Yet to date, the specific pathways of fluvial dissolved C turnover, particularly with human-induced shifts involved, are still poorly understood. Here, we examined dissolved inorganic C (DIC) and organic C (DOC), as well as human disturbances i.e., river damming and land use in karst rivers. We show that anthropogenic activities caused unexpected shifts to dissolved C biogeochemistry. Specifically, we found that human disturbances accelerated aquatic metabolism, ultimately causing more river CO<sub>2</sub> generation than fixation. The extended hydrological retention by damming greatly stimulated biological utilization of dissolved C. River DOC was sourced largely from farmland and forest, while land-use fragmentation increased DOC diversity. Artificial dams and land uses intensified the transformations between DIC and DOC within karst environments. Based on these findings, we provided a process-based conceptual model regarding the rapid cycle of active C in karst waters, revealing the associated trajectories of DIC and DOC biogeochemistry. This study suggests that reducing anthropogenic disturbances essentially decelerates organic C metabolism, and therefore promotes riverine CO<sub>2</sub> sequestration in the context of global C neutrality.

## 1. Introduction

Rivers and streams receive the bulk of carbon (C) from terrestrial environments, sustaining dissolved C transport via lateral and vertical diffusion (Battin et al., 2023; Chen et al., 2021a; Liu et al., 2022). In fluvial systems, dissolved inorganic C (DIC) is ultimately sourced from chemical weathering of minerals and atmospheric CO<sub>2</sub> (Raymond and Hamilton, 2018; Zhong et al., 2020, 2023), and dissolved organic C (DOC) can arise from soil leaching and biological metabolism (Lapierre et al., 2013; Lynch et al., 2019). Consequently, dissolved C origins are highly controlled by watershed climate, lithology, and hydrology (Horgby et al., 2019; Hotchkiss et al., 2018; Longworth et al., 2007). As a critical component of aquatic C balance, dissolved C along with a major gaseous form i.e., carbon dioxide (CO<sub>2</sub>), in turn provides feedbacks to fluvial water chemistry and biology (Campeau et al., 2017). Anthropogenic stress on fluvial C turnover, however, is poorly

constrained despite the profound influence on DIC and DOC biogeochemistry (Drake et al., 2020).

Previous studies declared that human disturbances have significantly changed riverine C export, emission and sequestration (Butman et al., 2015; Raymond et al., 2008; Wohl et al., 2017). Yet to date, explicit demonstrations of the biogeochemical pathways caused by anthropogenic activities are still restricted, particularly for intricate DIC and DOC turnover in aquatic ecosystems. Growing evidence suggests that human-induced changes actively mediate dissolved C dynamics in rivers (Peng et al., 2014; Tang et al., 2021). For instance, the damming of rivers, an artificial impoundment, has made alterations to watershed hydrology, water environment and downstream ecology, as well as biogeochemical cycles of aquatic C (Li et al., 2021; Palmer and Ruhli, 2019). In this context, global river DIC and DOC can be greatly modulated by damming, given that 63 % of the world's large rivers are non-free-flowing (Grill et al., 2019).

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Land use and landscape metrics can elucidate human-induced disturbances on aquatic C evolution (Battin et al., 2009; Coble et al., 2022; Mahowald et al., 2017). The prevailing view suggests that agriculture and urbanization likely increase structural complexity of fluvial organic and inorganic C (Nai et al., 2023; Wilson and Xenopoulos, 2009; Zhao et al., 2015). Landscape metrics e.g., patch density (PD), largest patch index (LPI) and Shannon’s diversity index (SHDI) are proposed to quantitatively characterize land use structures and spatial configuration, assuming to be an available predictor for human feedbacks to watershed biochemistry (Zhang et al., 2019). Prior findings reported that landscape controls hydrological export of DOC and DIC (Dornblaser and Striegl, 2015; Williamson et al., 2023). However, compositional variability and interactivity of dissolved C in rivers are largely omitted, despite their fundamental roles of aquatic C cycles.

In this study, we conducted a comprehensive study in two karst fluvial systems, unraveling the variability of dissolved C biogeochemistry in relation to anthropogenic stress. We choose carbonate-dominated rivers attributing to the large dissolved C stocks, being driven by carbonate weathering and the known spite tical C pump” (Liu

et al., 2015). Meanwhile, karst and semi-karst regions are susceptible to environmental changes due to ecological vulnerability (Butscher and Huggenberger, 2008), which may highlight the rapid response of dissolved C turnover to man-made perturbations. We thus hypothesized that human activities will alter surface water DIC and DOC dynamics, for their disturbances to biogeochemical pathways of dissolved C allocation (Vilmin et al., 2016). The objectives of this study are to: (1) examine temporal shifts of dissolved C dynamics regarding compositional variability and interactivity; and (2) reveal anthropogenic influences i.e., river damming and land use on dissolved C biogeochemistry in the karst rivers. Achieving these objectives hopes to provide a conceptual framework regarding how human activities alter aquatic environments and ultimately the fate of dissolved C.

## 2. Materials and methods

### 2.1. Study area

The rivers studied were Furong (latitude 28°0'57"–29°14'23"N;

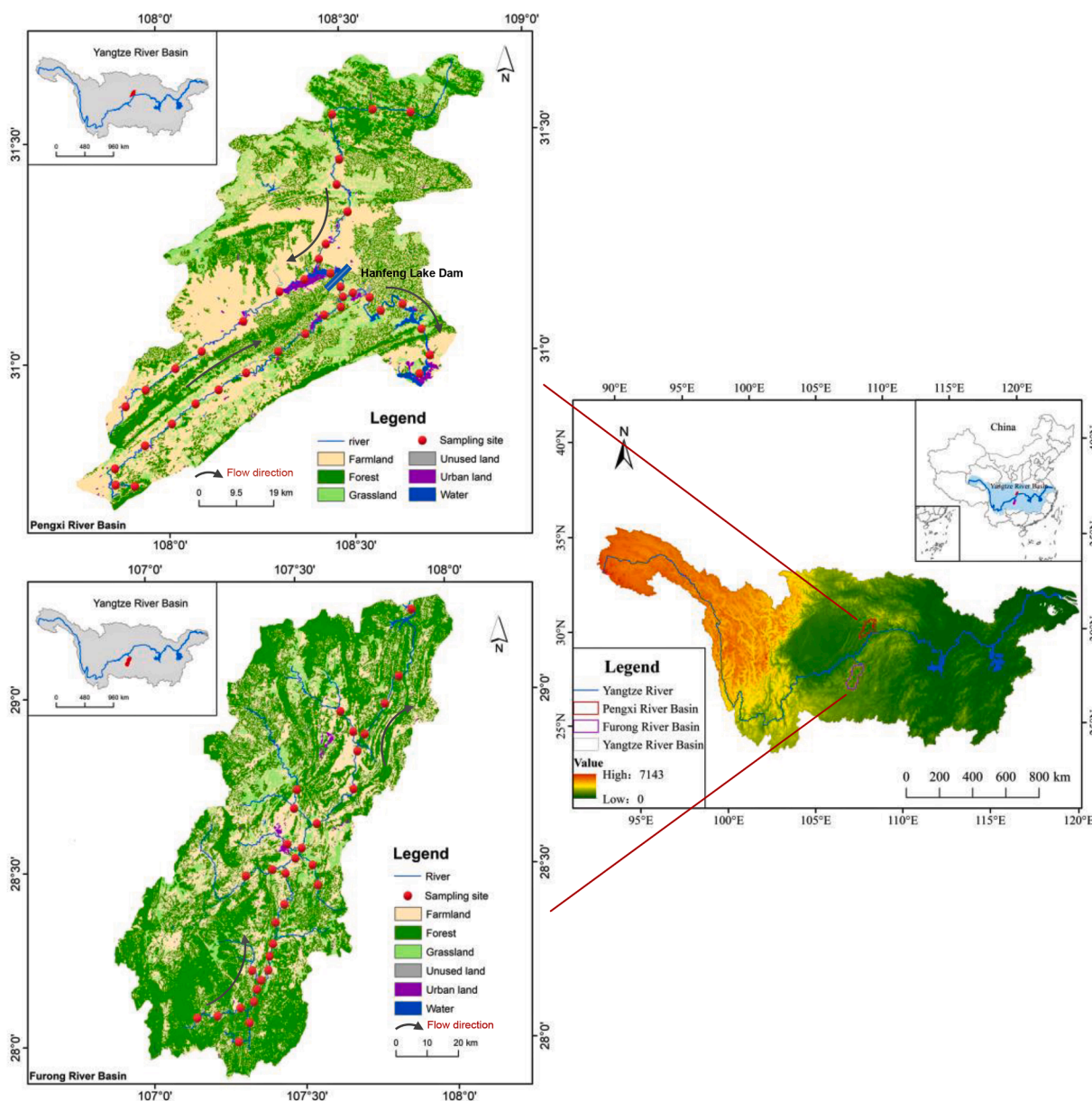


Fig. 1. Map showing sampling sites and land use in the karst rivers, China.

longitude 107°10'3"–107°52'42"E) and Pengxi (latitude 30°42'22"–31°35'22"N; longitude 107°50'49"–108°42'59"E) located respectively in the karst and semi-karst (also known as fluvial-karst) regions, Southwest China (Fig. 1). These two rivers are major tributaries of the Yangtze River with a subtropical monsoonal climate. The river Furong has a catchment area of 7406 km<sup>2</sup> and a total length of 231 km. Its annual rainfall and mean temperature are 1037–1233 mm (mainly concentrated in the rainy season, 86 % of the precipitation) and 16.1 °C, respectively. The discharge ranges between 15 and 58 m<sup>3</sup>/s with an average of 34 m<sup>3</sup>/s. Similarly, the Pengxi drains a catchment area of 5172 km<sup>2</sup> with a river length of 182 km. The rainfall dominantly occurs in May–September (rainy season), contributing 75 %–80 % of the annual precipitation (1100–1500 mm). The annual mean temperature varies within 10.8–18.5 °C with the highest temperature in July–August (>40 °C). River hydrology in the Pengxi is greatly regulated by water impoundment in the dry season (prolonging hydraulic retention) and flood discharge (accelerating hydraulic flow) in the rainy season. The water regulation specifically alters river discharge (17–71 m<sup>3</sup>/s), resulting in the highest and lowest water levels in December and June, respectively. The catchment lithology is characterized by limestone, dolomite, slate, sandstone and shale in the studied rivers. Particularly, in-stream waters in the Furong and Pengxi are dominantly supplied by carbonate-dominated environments. Currently, the Furong is relatively controlled by natural conditions and thus a low human-stress river. In comparison, the Pengxi is defined as a high human-stress river due to intensive agricultural practices, urbanization and river damming (Hanfeng Lake Dam, Fig. 1).

## 2.2. Sample collection and measurement

Four field campaigns were performed in the rainy (July–August) and dry seasons (November–December) from 2019 to 2020, based on natural hydrological rhythm. Our samplings incorporated full spectrum of stream orders, assigning 35 and 37 sites for the river Furong and Pengxi, respectively. Briefly, a total of 137 surface waters were thus collected a depth of ~10 cm and filtered through glass microfiber filters (GF/F 47 mm, 0.7- $\mu$ m, Whatman). The filtrates were kept in 100 mL high-density polyethylene (HDPE) plastic containers. The containers were sealed completely, in avoidance of any headspace or air bubbles. On-site water temperature and pH measurements were conducted with a portable CyberScan PCD 650 multi-parameters system (Eutech, USA). Current velocity was estimated using float method (5-m rope). Total alkalinity was titrated with an Alkalinity Test MColorTest™ (Merck, Germany) using fixed end-point titration method. The poisoning was not arranged because of short-term transport < 48 h (Wang et al., 2021). DOC concentration and optical analyses were conducted once the refrigerated samples arrived at the laboratory.

Riverine DOC concentrations were determined using varioTOC cube/select (Elementar, Germany) and multi N/C 2100S (Analytik Jena, Germany). Under a room temperature of 25 °C, ultrapure water was used as a reference for spectroscopic measurements. UV–visible spectrum was scanned using a double-beam scanning spectrophotometer (UV-5500 PC, Shanghai), within a range of 200–700 nm (1-nm interval). Excitation-emission matrices (EEMs) were scanned using a fluorescence spectrophotometer (F-7000 FL Spectrophotometer, Japan). The excitation (Ex) and emission wavelengths (Em) were within the ranges of 200–450 nm (5-nm interval) and 250–600 nm (1-nm interval), respectively.

## 2.3. Land use and landscape information

The satellite images ((Landsat-8 OLI, 30 m resolution) were used to delineate land use across sampling locations. We further employed a supervised classification technique with a support vector machine algorithm by ENVI 5.1 software. Land use types were therefore divided into six categories: farm (dry land and paddy field), forest (forest and

wooded areas), grass, water (rivers, reservoirs, lakes, ponds and sandy beach), urban (commercial, industrial and residential areas), and unused lands (bare ground, bare rocks and gravels). The sub-basins were identified according to previously published data in Resources and Environmental Science Data Center, CAS (<http://www.resdc.cn/>). Landscape metrics i.e., total area (TA), number of patches (NP), PD, LPI, edge density (ED), aggregation index (AI) and SHDI were calculated using Fragstats 4.2.1 software, reflecting land use structure and spatial configuration of landscape patterns. Consequently, we compiled compositional metrics regarding % of distinct land use categories, and quantified landscape fragmentation, dominance, structural complexity, aggregation and diversity in this study.

## 2.4. DIC calculations and DOC optical analysis

Riverine DIC species i.e., DIC, HCO<sub>3</sub><sup>-</sup>, CO<sub>3</sub><sup>2-</sup> and dissolved CO<sub>2</sub> were calculated from carbonate equilibria (water temperature, pH and total alkalinity) using CO<sub>2</sub>SYS program (D.E. Pierrot et al., 2006). To avoid possible uncertainties from non-carbonate alkalinity, samples with pH < 5.4 were excluded in this study (Hotchkiss et al., 2015). Impetus of water-air CO<sub>2</sub> exchange is defined as the differences between aqueous and atmospheric partial pressure of CO<sub>2</sub> ( $\Delta p\text{CO}_2$ ,  $\mu\text{atm}$ ). By linking to water turbulence, we modeled normalized gas transfer velocity of CO<sub>2</sub> ( $k_{600}$ , m/s) using an empirical model (Alin et al., 2011). River  $k_{600}$  was calibrated into site-specific gas transfer velocity ( $k$ , cm/h) using water temperature and Schmidt number. In-situ temperature and pressure were employed for Henry's constant ( $K_h$ ) calibration. Because riverine CO<sub>2</sub> exchange was not measured directly, we calculated water-air areal CO<sub>2</sub> efflux (mmol/m<sup>2</sup>/d) using thin boundary layer model as follows:

$$\text{CO}_2 \text{ efflux} = k \times K_h \times \Delta p\text{CO}_2 \quad (1)$$

For detailed information of aqueous DIC calculations and water–air CO<sub>2</sub> exchange estimates please see Supplementary Information S1.

Non-normalized absorption coefficient was extracted at wavelengths of 440 nm ( $a_{440}$ ) to characterize UV–visible DOC composition (Naperian units). Nonlinear fit of an exponential function was used to decipher spectral slope ( $S_{275-295}$ ) over the absorption wavelengths ranging within 275–295 nm. The ratio of absorption at 210 to 254 nm presented UV absorbance ratio index (URI). We identified fluorescent DOC composition with fluorescence regional integration, by modeling integrated intensities for five separated EEM regions (Zhou et al., 2013). EEM region I, II and IV refer to biogenic signals, expressing tyrosine- and tryptophan- and soluble microbial byproduct-like components, respectively. Region III and V are typical of bio-refractory DOC, which represent respectively fulvic acid- and humic-like components. We calculated freshness index ( $\beta/\alpha$ ) and humification index (HIX) as the ratios of 380 nm to 420–435 nm emission intensity at 310 nm excitation band, and 435–480 nm to 300–345 nm + 435–480 nm emission intensity at 254 nm excitation band, respectively (Hansen et al., 2016; Nai et al., 2023). Parallel factor analysis (PARAFAC) split EEM and captured collective fluorophores across samples. We selected component model and correspondence validation between excitation and emission loadings using residual analysis and split half analysis. We compared the identified fluorescence components with the open fluorescence database OpenFluor (<http://openfluor.lablicate.com/>), which successfully matched the observations from 109 independent studies conducted in aquatic and terrestrial environments. The maximum fluorescence intensity ( $F_{\text{max}}$ ) characterized relative abundance of the corresponding PARAFAC component. For detailed information of aqueous DOC optical analysis please see Supplementary Table S1.

## 2.5. Quality control

We collected and analyzed the samples following the standard procedures as described in American Public Health Association (1985). The



pH probe was calibrated with 4.01, 7.00 and 9.18 pH standard solution at 25 °C, ensuring an accuracy of  $\pm 0.002$  pH units. The accuracy of water temperature and uncertainty of Alkalinity Test MColorTest™ were  $\pm 0.5$  °C and  $< 3$  %, respectively. Previous studies indicated that non-carbonate alkalinity primarily affected to DIC chemistry and could be simply ignored in the context of non-acidic pH (Li et al., 2012; Ni et al., 2021). We estimated a maximal overestimation of 19 % for DIC species when assuming all DOC (278  $\mu\text{mol/L}$ ), nitrogen (77  $\mu\text{mol/L}$ ) and phosphorus (1.5  $\mu\text{mol/L}$ ) as contributors to total alkalinity (1886  $\mu\text{mol/L}$ ).

Riverine DOC concentrations were determined in triplicate with an uncertainty of  $< 2$  %: it excluded the outliers and recorded the average readings. Our replicates suggested that the coefficient of variation was below 2 % in the selected UV–visible spectrum. Given the instrument-specific biases, manufacturer's correction factors allowed us to convert the *S/R* readings into corrected *Sc/Rc*. We corrected EEM inner-filter effect using non-linear function fits based on absorbance scans (Murphy et al., 2010; Xu et al., 2016). Absorbance Unit (A.U.) was normalized to Raman Unit (R.U.) using Raman peak area of ultrapure water. Water Raman and Rayleigh scatterings were deducted with regional cut and interpolation (Bahram et al., 2006).

## 2.6. Statistical analyses

Three distinct datasets i.e., (1) land use and landscape metrics, (2) DIC species, and (3) DOC concentrations and optical properties were performed in statistical analyses. We tested data normality and homogeneity of variance with Kolmogorov-Smirnov and Levene's test, respectively. Data were log-transformed when statistical necessary for normality assumptions. We compared statistical differences between distinct seasons and rivers using Mann–Whitney *U* test and Analysis of variance. PARAFAC was modeled using MATLAB in DOMFluor toolbox 1.71 (Stedmon and Bro, 2008).

Random forest model was used to identify relative importance of land use and landscape metrics on dissolved C, further deciphering anthropogenic influences on riverine DIC and DOC biogeochemistry. The random forest was developed from Bootstrap Aggregation (Hu et al., 2022), which is available in high-dimensional estimate of variables anthropogenic influ. The minimum leaf node size and number of trees were set to be 2 and 500, respectively. The increased errors driven by permuting variables were defined as weights of relative importance. We ran the model multiple times and determine weights using the average values, which might provide a comprehensive assessment regarding primary human contributions to individual dissolved C parameters. In this study, random forest model was performed using MATLAB algorithm, and the visualization of logistic regression was shown in Fig. S1. Statistical analyses were performed using SPSS statistical package (19.0). All the figures were prepared using OriginPro and MATLAB.

## 3. Results

### 3.1. Land use and landscape metrics

Our data show that land use types were significantly distinct between the catchments (Table 1). The river Furong had a highest land use proportion of forest (55.3 %  $\pm$  18.0 %, mean  $\pm$  s.d.), and followed by farmland (34.4 %  $\pm$  12.7 %). In contrast, farmland was widespread in the river Pengxi, with a dominant proportion of 52.9 %  $\pm$  15.7 %, and forest occupied averagely 30.3 %  $\pm$  16.2 %. These proportions varied across sampling locations in a broad range, exhibiting a gradual invasion of agricultural to natural land use. Urbanization as another potential man-made perturbation, was notably greater in the Pengxi than Furong with the proportions of 1.81 %  $\pm$  3.08 % and 0.32 %  $\pm$  0.73 %, respectively ( $p < 0.05$ , Mann–Whitney *U* test). Grassland proportions spanned 4 orders of magnitude, ranging from 0.01 % to  $\sim$ 36 %. Waters occupied a higher proportion in the Pengxi (2.78 %  $\pm$  3.36 %) as

**Table 1**

Comparison of land use proportions and landscape metrics in the karst rivers.

	n	Min	Max	Median	Mean	Std. Dev
<b>Furong River</b>						
Farmland (%)	32	14.6	68.6	33.5	34.4	12.7
Forest (%)	32	11.4	85.0	54.9	55.3	18.0
Grass (%)	32	0.01	36.0	4.47	8.68	10.1
Water (%)	32	0.22	4.35	0.94	1.34	1.02
Urban (%)	32	0.01	4.01	0.04	0.32	0.73
Unused (%)	32	0.01	0.08	0.01	0.014	0.017
TA (km <sup>2</sup> )	32	2477	69,657	10,332	14,600	15,706
NP	32	32	711	137	178	153
PD (N/ha)	32	0.56	2.58	1.41	1.47	0.46
LPI (%)	32	14.45	84.5	32.4	35.0	15.8
ED (m/ha)	32	16.7	50.6	38.2	37.0	7.00
AI (%)	32	92.5	97.4	94.3	94.5	1.01
SHDI	32	0.44	1.2	0.87	0.87	0.19
<b>Pengxi River</b>						
Farmland (%)	36	24.4	85.0	51.3	52.9	15.7
Forest (%)	36	3.00	63.0	28.6	30.3	16.2
Grass (%)	36	0.01	36.8	9.21	11.4	9.57
Water (%)	36	0.27	13.0	1.18	2.78	3.36
Urban (%)	36	0.01	15.8	0.59	1.81	3.08
Unused (%)	36	0.01	18.6	0.01	0.89	3.51
TA (km <sup>2</sup> )	36	933	35,979	10,835	13,019	9560
NP	36	26	307	137	138	73
PD (N/ha)	36	0.57	4.07	1.10	1.43	0.92
LPI (%)	36	12.9	75.0	39.8	40.6	17.2
ED (m/ha)	36	17.7	80.9	45.5	46.2	16.9
AI (%)	36	88.1	97.3	93.2	93.1	2.50
SHDI	36	0.59	1.40	1.00	1.00	0.20

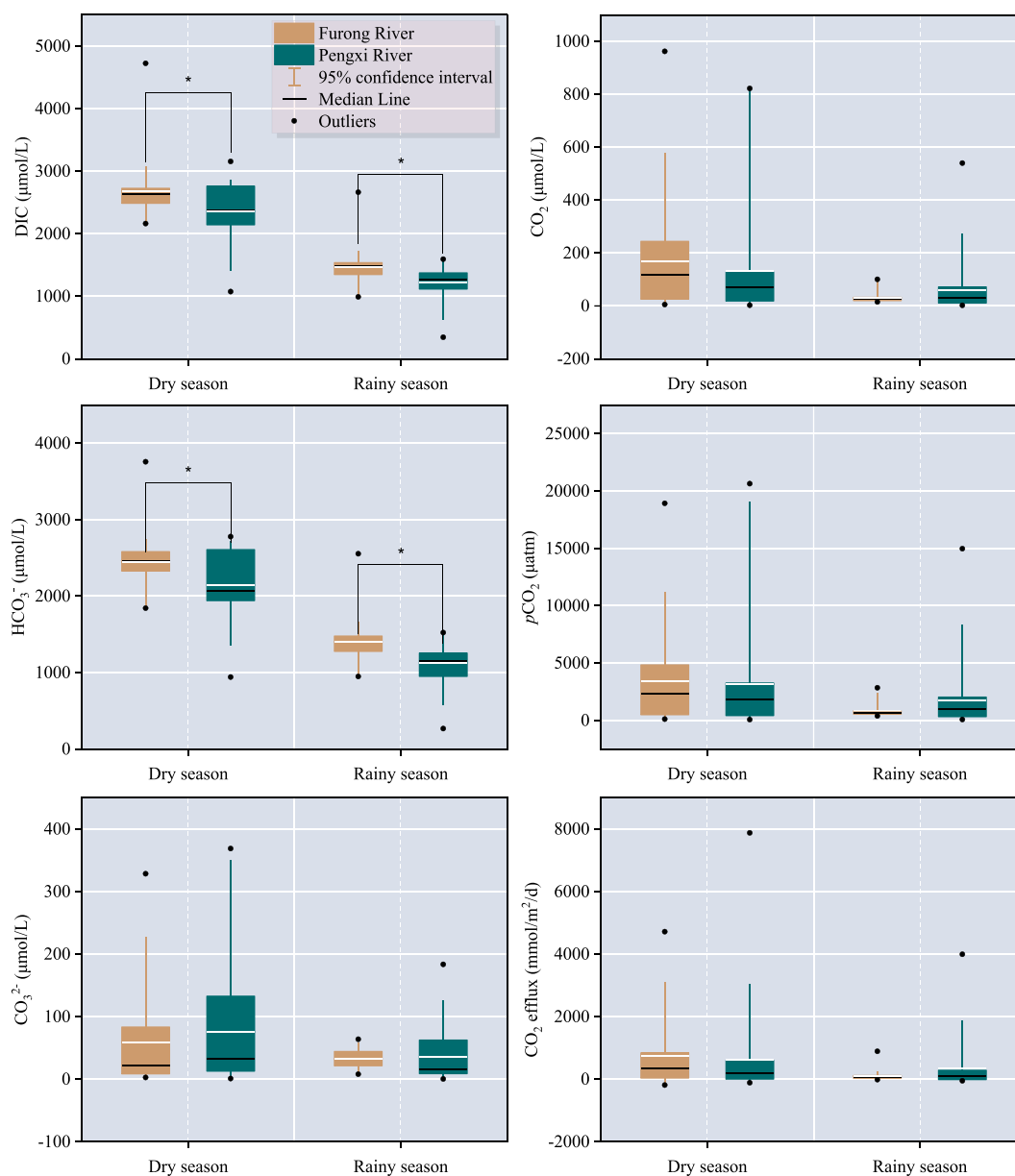
compared to the Furong (1.34 %  $\pm$  1.02 %), resulting in surface water areas of 59.5 and 46.5 km<sup>2</sup>, respectively ( $p < 0.05$ ). It is worth noting that we excluded non-river surface waters e.g., lakes, reservoirs and ponds. The proportions of unused land were mostly low ( $< 1$  %) across sampling locations.

Landscape metrics ED and SHDI were higher in the Pengxi (46.2  $\pm$  16.9 m/ha; 1.00  $\pm$  0.20) than Furong (37.0  $\pm$  7.00 m/ha; 0.87  $\pm$  0.19), whereas AI presented as Furong (94.5 %  $\pm$  1.01 %)  $>$  Pengxi (93.1 %  $\pm$  2.50 %) ( $p < 0.05$ ). This suggested more diverse land use types and highly fragmented landscape in the Pengxi, in tune with its intensive human activities. Other landscape metrics, however, showed no significant differences between the Furong and Pengxi ( $p > 0.05$ ). We found that TA, NP, PD and LPI values were generally in wide ranges i.e.,  $>$  threefold variation across sampling locations, with median values of 10,332 km<sup>2</sup>, 137, 1.41 N/ha and 32.4 % in the Furong, and 10,835 km<sup>2</sup>, 137, 1.10 N/ha and 39.8 % in the Pengxi.

### 3.2. River DIC chemistry and CO<sub>2</sub> emission

Aqueous DIC concentrations were higher in the dry season (Furong: 2674.5  $\pm$  424.0  $\mu\text{mol/L}$ ; Pengxi: 2354.1  $\pm$  448.6  $\mu\text{mol/L}$ ) in comparison to rainy season (Furong: 1466.0  $\pm$  285.7  $\mu\text{mol/L}$ ; Pengxi: 1217.3  $\pm$  253.7  $\mu\text{mol/L}$ ) ( $p < 0.001$ , Fig. 2). Meanwhile, we found that a spatial difference of DIC presented as Furong  $>$  Pengxi ( $p < 0.05$ ). The bulk of river DIC was derived from HCO<sub>3</sub><sup>-</sup>, comprising 61–96 % with an average of 92 %  $\pm$  6 % of the overall concentrations. Therefore, spatiotemporal HCO<sub>3</sub><sup>-</sup> were highly consistent with DIC dynamics. Aqueous CO<sub>3</sub><sup>2-</sup> varied by 3 orders of magnitude ranging within 0.39–368.7  $\mu\text{mol/L}$ . Observed dissolved CO<sub>2</sub> concentrations exhibited notably temporal variations in the river Furong (dry season 170.5  $\pm$  204.0  $>$  rainy season 31.5  $\pm$  20.1  $\mu\text{mol/L}$ ,  $p < 0.001$ ) and Pengxi (dry season 131.2  $\pm$  196.3  $>$  rainy season 60.4  $\pm$  97.7  $\mu\text{mol/L}$ ,  $p = 0.05$ ), and yet had no spatial shifts between the rivers ( $p > 0.05$ ). This may indicate that carbonate-dominated rivers share common CO<sub>2</sub> drivers despite spatial isolation. Specifically, DIC species tended to fluctuate in adjacent areas of river damming along the main stem, suggesting a noticeable disturbance to the river continuum (Fig. S2).





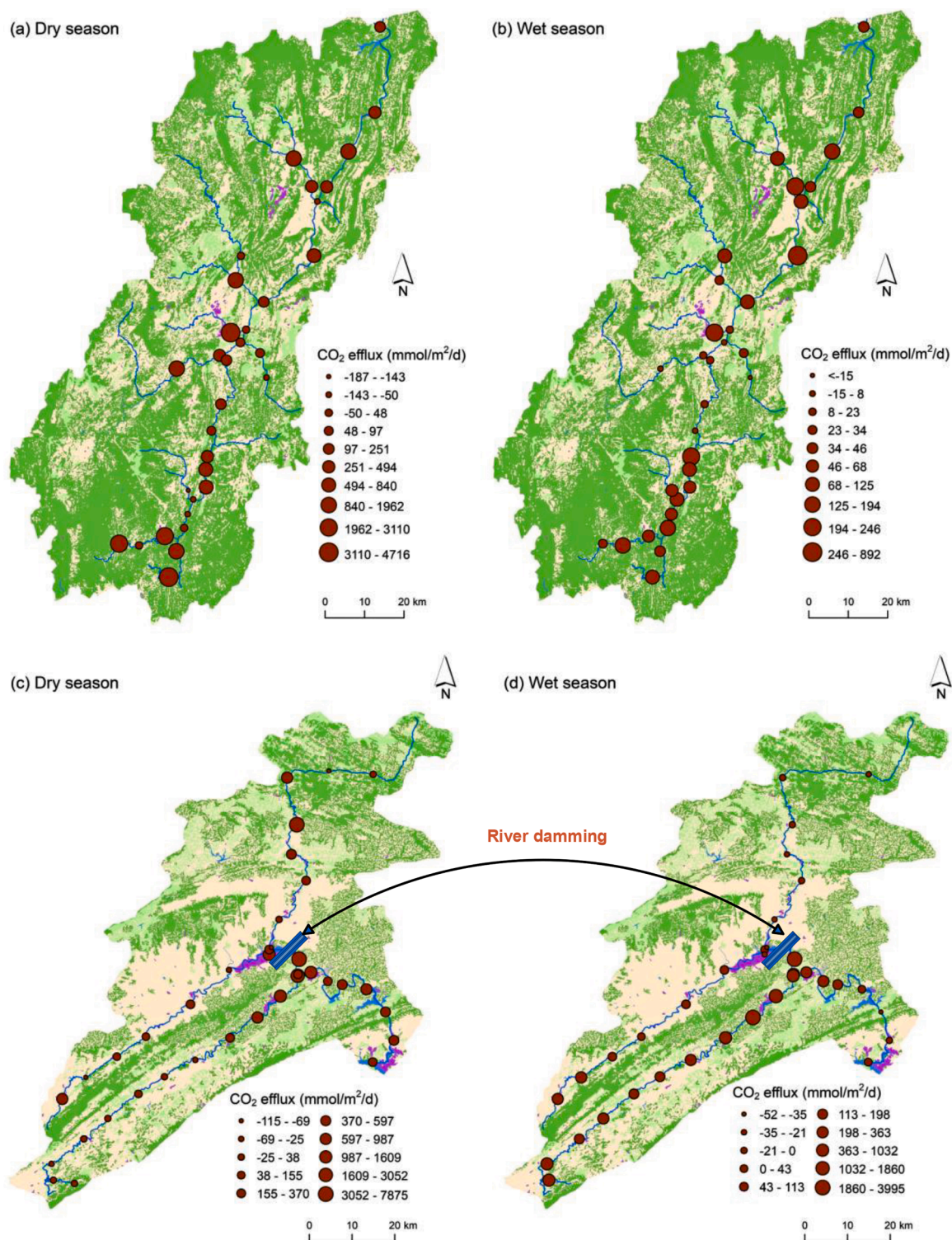
**Fig. 2.** Spatial and temporal variability of DIC chemistry and water-air CO<sub>2</sub> exchange in the karst rivers (The boxes with whiskers illustrate 25th–75th with 5th–95th percentiles, and the scatters present the outliers. The white and black lines show mean and median values, respectively. The mark \* refers to significant difference at  $p < 0.05$  level).

River CO<sub>2</sub> exchange was highly variable, and spanned a wide spectrum of  $p\text{CO}_2$  and CO<sub>2</sub> efflux. For example, instantaneous  $p\text{CO}_2$  levels ranged from 66.0 to 20,642.4  $\mu\text{atm}$  and averaged at  $2319.8 \pm 3580.1$   $\mu\text{atm}$  (Fig. S3). Our data indicate that the median  $p\text{CO}_2$  was 0.38 and 0.24–0.74 times the large-scale rivers from global (Raymond et al., 2013) and China's reports (Ran et al., 2021), respectively. Regarding spatiotemporal scales of the datasets, we found the higher  $p\text{CO}_2$  in the dry season (Furong:  $3395.8 \pm 4006.5$   $\mu\text{atm}$ ; Pengxi:  $3183.4 \pm 4753.1$   $\mu\text{atm}$ ) than rainy season (Furong:  $842.9 \pm 550.3$   $\mu\text{atm}$ ; Pengxi:  $1742.7 \pm 2762.9$   $\mu\text{atm}$ ) ( $p < 0.05$ ). The modeled  $k$  varied from 2.9 to 25.8 m/d with a mean of  $7.67 \pm 4.89$  m/d across sampling locations (Fig. S4), which was slightly higher than those for global rivers and streams i.e., 5.7 m/d (Raymond et al., 2013). By merging the paired  $p\text{CO}_2$  and  $k$  values from our datasets, we calculated areal CO<sub>2</sub> efflux ranging between  $-58.6$  and  $2044.5$  mmol/m<sup>2</sup>/d (95 % confidence intervals) with an average of  $452.1 \pm 997.5$  mmol/m<sup>2</sup>/d (Fig. 3). Similarly, it temporally showed dry season > rainy season in the river Furong ( $743.2 \pm$

$1111.8 > 101.7 \pm 158.5$  mmol/m<sup>2</sup>/d) and Pengxi ( $607.5 \pm 1378.0 > 333.8 \pm 737.9$  mmol/m<sup>2</sup>/d). Particularly, river damming induced a sudden increase of  $p\text{CO}_2$  and CO<sub>2</sub> efflux, highly mediating water-air CO<sub>2</sub> outgassing (Fig. S2). In this context, we estimated total CO<sub>2</sub> efflux to be  $0.32 \pm 0.064$  and  $0.45 \pm 0.11$  Tg CO<sub>2</sub>/y in the river Furong and Pengxi, respectively.

### 3.3. River DOC concentrations and optical properties

River DOC concentrations ranged from 90.3 to 656.9  $\mu\text{mol/L}$  across samples, which significantly varied over time (dry season > rainy season) and space (Pengxi > Furong) ( $p < 0.05$ , Table 2). Aqueous  $a_{440}$ , a proxy for lignin-DOC (Derrien et al., 2019), was higher in the Pengxi ( $5.13 \pm 1.60$  m<sup>-1</sup>) when compared to Furong ( $4.59 \pm 1.89$  m<sup>-1</sup>) ( $p < 0.05$ ). The increased  $S_{275-295}$  links to photobleaching and decreased DOC molecular weight (Helms et al., 2008), which exhibited variable seasonality in the Furong (Dry season > rainy season) and Pengxi (dry



**Fig. 3.** Spatial distribution of river CO<sub>2</sub> efflux along the karst rivers (a. areal CO<sub>2</sub> efflux in the Furong, dry season; b. areal CO<sub>2</sub> efflux in the Furong, rainy season; c. areal CO<sub>2</sub> efflux in the Pengxi, dry season; d. areal CO<sub>2</sub> efflux in the Pengxi, rainy season).

season < rainy season). Our URI data presented high abundance of unsaturated compounds (Ni and Li, 2022), varying from 3.53 to 408.0 with a mean of  $40.1 \pm 70.1$ . We thus suggest that DOC was highly degradable and bioavailable in the dry season, Furong River (median URI = 91.8).

By modeling and comparing PARAFAC components between our datasets and the recorded studies in OpenFluor, we were able to identify primary DOC composition in the karst rivers (Fig. S5). We found that UV

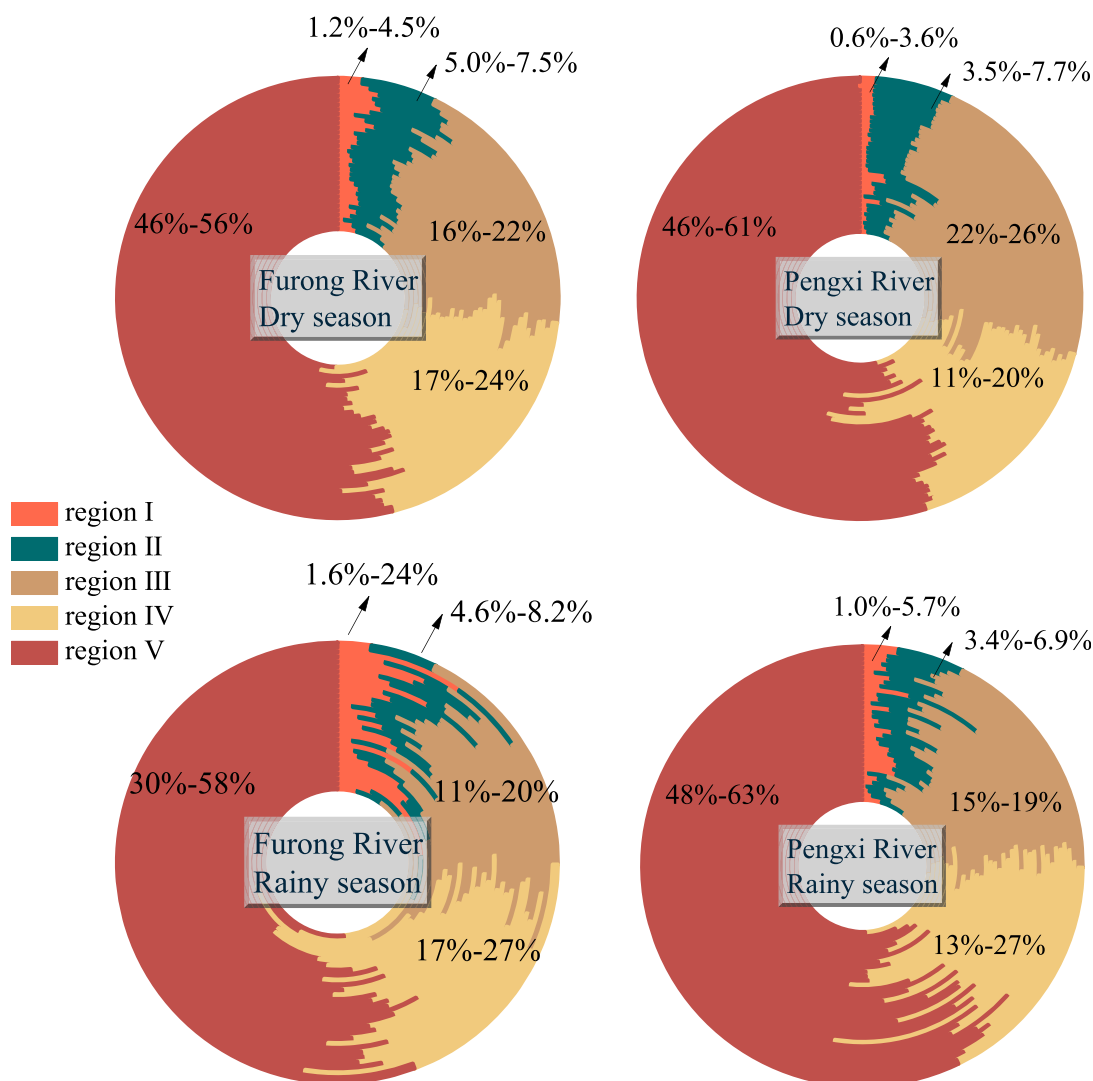
humic-like (C1, Ex = 245 nm, Em = 408 nm), terrestrial humic-like (C2, Ex = 260 nm, Em = 458 nm) and tryptophan-like DOC (C2, Ex = 230/275 nm, Em = 332 nm) were collective DOC compositions (Fig. S5). Specifically, C1 was previously reported in biology- and human-impacted rivers (Batista-Andrade et al., 2023; Ni and Li, 2023), while C2 closely matched DOC component in terrestrial and marine and ecosystems (Lei et al., 2021; Sharma et al., 2017). Most studies suggested that C3 was sourced from biological metabolism, which was also

**Table 2**  
Summary of DOC concentrations and optical parameters in the karst rivers.

	n	Min	Max	Median	Mean	Std. Dev
Furong river, dry season						
DOC ( $\mu\text{mol/L}$ )	33	188.9	430.04	261.2	269.9	51.9
$a_{440}$ ( $\text{m}^{-1}$ )	33	3.89	5.78	4.61	4.65	0.56
$S_{275-295}$ ( $\text{nm}^{-1}$ )	32	0.0014	0.048	0.0088	0.013	0.011
URI	28	35.9	408.0	91.8	133.7	109.0
Furong river, rainy season						
DOC ( $\mu\text{mol/L}$ )	32	90.3	324.3	236.0	217.6	68.6
$a_{440}$ ( $\text{m}^{-1}$ )	32	0.48	9.37	4.28	4.53	2.65
$S_{275-295}$ ( $\text{nm}^{-1}$ )	32	0.002	0.011	0.009	0.0079	0.0026
URI	32	15.5	36.6	25.4	25.0	5.30
Pengxi river, dry season						
DOC ( $\mu\text{mol/L}$ )	37	216.1	656.9	394.9	369.5	82.7
$a_{440}$ ( $\text{m}^{-1}$ )	37	4.08	7.08	5.16	5.32	0.82
$S_{275-295}$ ( $\text{nm}^{-1}$ )	37	0.0002	0.011	0.007	0.0069	0.0033
URI	37	4.31	93.6	12.5	16.7	18.8
Pengxi river, rainy season						
DOC ( $\mu\text{mol/L}$ )	35	118.0	460.7	214.3	240.3	84.7
$a_{440}$ ( $\text{m}^{-1}$ )	35	0.55	8.64	4.61	4.93	2.13
$S_{275-295}$ ( $\text{nm}^{-1}$ )	35	0.009	0.016	0.012	0.012	0.0015
URI	35	3.53	12.6	6.96	7.47	2.63

interpreted as protein-like DOC (Fouché et al., 2020; Graeber et al., 2021). Given significant signals of biologically derived DOC (as also indicated by  $F_{\text{max}}$ , Fig. S6) across samples, we underline that DOC was governed by biotic drivers in karst river.

Taking DOC analysis a step further, the full-region fluorophores were compiled and apportioned, via fluorescence regional integration (Fig. 4). Here we calculated proportions of distinct DOC compositions by identifying their corresponding EEM areas. Consistent with PARAFAC models, humic-like DOC (region V) was assumed to be a fundamental contributor occupying 30%–63% of DOC fluorophores across samples. Biogenic DOC i.e., tyrosine- (region I), tryptophan- (region II) and microbial byproduct-like compositions (region IV) collectively contributed 16–59% and were more abundant in the river Furong than Pengxi ( $p < 0.001$ ). By contrast, terrigenous fulvic acid-like DOC ranged within 11–26%, which was temporally higher in the dry season than rainy season ( $p < 0.001$ , Fig. S7). River  $\beta:\alpha$  and HIX varied within the range of 0.7–1.0 and 0.1–0.9, respectively (Fig. 5). The highest  $\beta:\alpha$  was observed in the dry season (Furong River), whereas HIX was spatially higher in the river Pengxi. We found that river damming accelerate biological metabolism of DOC, as characterized by the variations in paired biogenic DOC- $\beta:\alpha$  and humic DOC-HIX (Fig. S8).



**Fig. 4.** Proportions of tyrosine- (region I), tryptophan- (region II), fulvic acid- (region III), soluble microbial byproduct-like (region IV) and humic-like DOC (region V) in the karst rivers.



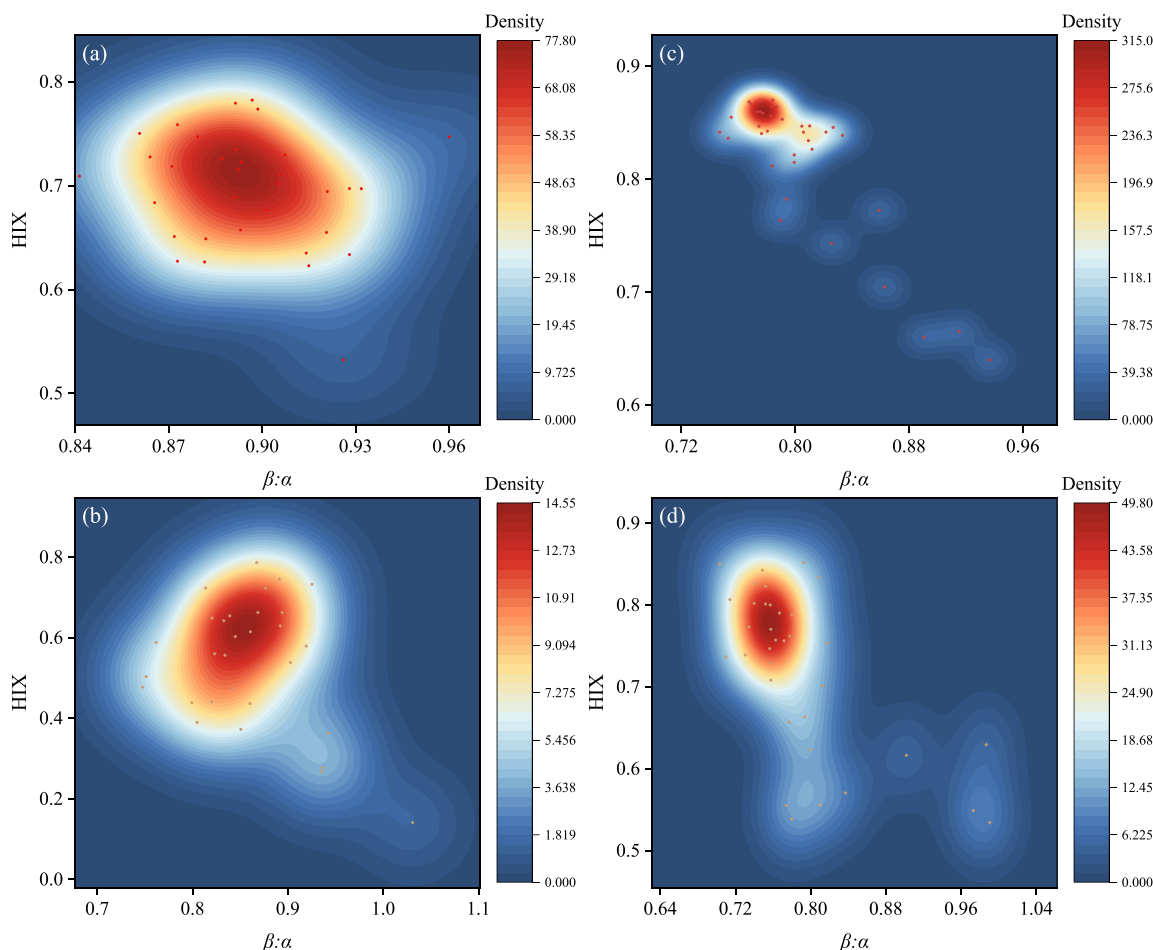


Fig. 5. Distribution density of river freshness index ( $\beta:\alpha$ ) and humification index (HIX) in the karst rivers (letters a, b, c and d are similar to Fig. 3).

## 4. Discussion

### 4.1. Human-induced variations in DIC biogeochemistry

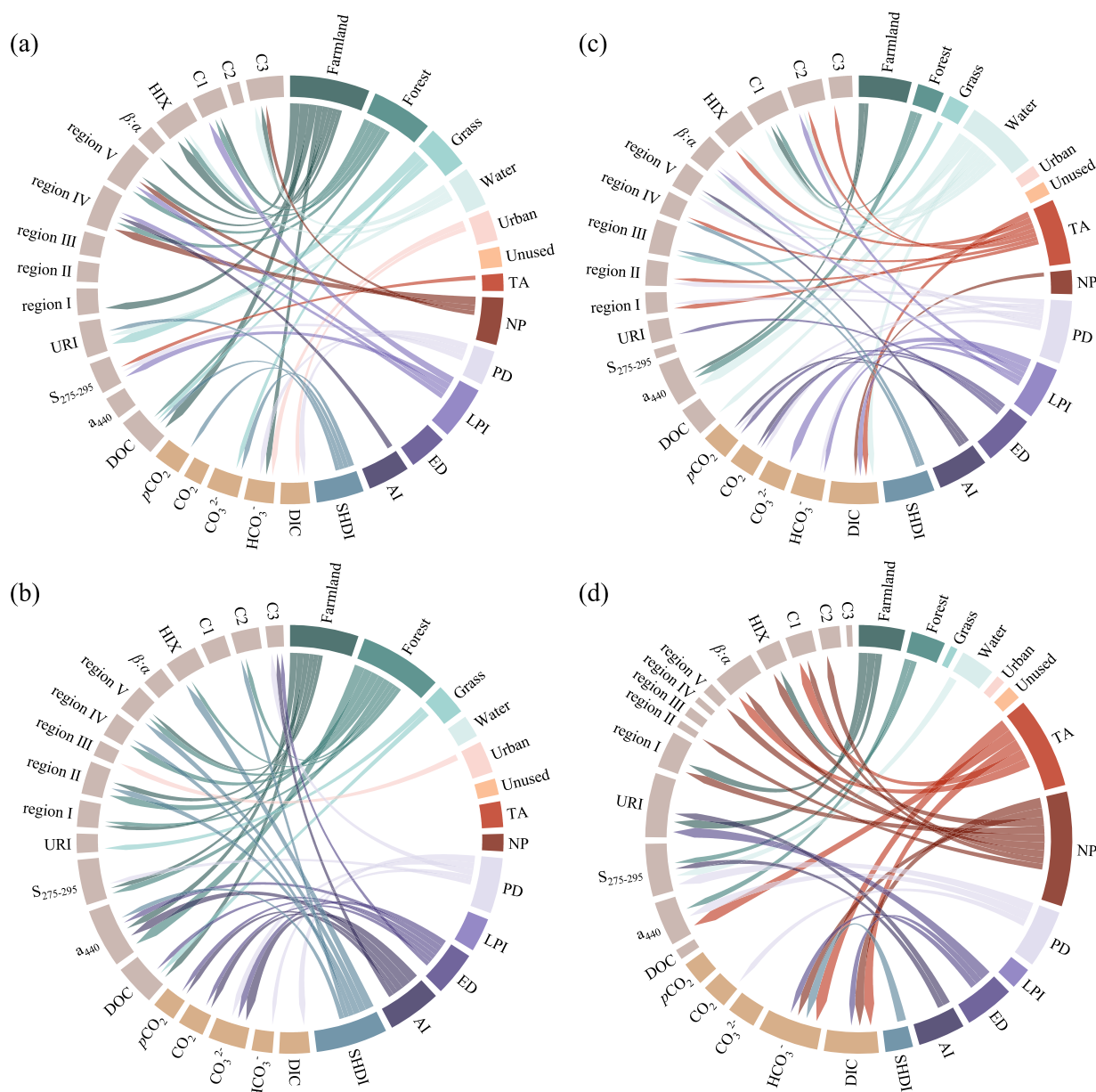
River DIC turnover linking water chemistry with biology have specific pathways in karst and semi-karst regions. For instance, the known “biological C pump” drives aquatic uptake of DIC for primary production (Sun et al., 2021), resulting in large consumption of  $\text{HCO}_3^-$  and dissolved  $\text{CO}_2$  (Fig. 2). This was supported by the co-dynamics of dissolved oxygen (Fig. S9), expressed as  $\text{CaCO}_3 + \text{CO}_2 + \text{H}_2\text{O} \rightarrow \text{Ca}^{2+} + 2\text{HCO}_3^- \rightarrow \text{CaCO}_3 + x(\text{CO}_2 + \text{H}_2\text{O}) + (1-x)(\text{CH}_2\text{O} + \text{O}_2)$ . It was especially the case for the rainy season (summer, Fig. 2), intense sunlight and rainfall accelerate photosynthesis and carbonate dissolution, respectively (de Montety et al., 2011; Maisonneuve et al., 2022). Thus, river  $\text{CO}_2$  emission was apparently modulated by this pathway, consistently showing the areal  $\text{CO}_2$  efflux of dry season > rainy season (Fig. 2). The dilution effect (Chaplot and Mutema, 2021) may not be applicable to explain temporal shifts of DIC species in the study river Pengxi, due to the specific water impounding (water level: dry season > rainy season). The karst rivers contributed significantly to  $\text{CO}_2$  outgassing in the bulk of drainage networks (Fig. 3). Terrestrially derived  $\text{CO}_2$  inputs and in-stream respiration might simply uncover the supersaturated  $\text{CO}_2$ , given the region-specific soil erosion and biological metabolism (Borges et al., 2015; Lapiere et al., 2013). Those  $\text{CO}_2$  drivers are likely equivalent to the studied rivers, causing the comparable  $p\text{CO}_2$  and  $\text{CO}_2$  efflux despite their spatial isolation (Fig. 3 and S3).

The damming of rivers represents an important anthropogenic disturbance along the river continuum, which alters aquatic biology by shifting water temperature and retention (Regnier et al., 2013).

Consequently, we found that DIC species had sudden changes in adjacent areas of river damming (Fig. S2). The activated biological metabolism involves both photosynthesis and respiration (Battin et al., 2023), inducing distinct pathways for DIC turnover between the species. For example, water impounding enhanced photosynthetic DIC uptake (Wang et al., 2022), as reflected by the decline of  $\text{HCO}_3^-$  (Fig. S2). In contrast, the locations adjacent to the dam sharply became hotspots for  $\text{CO}_2$  emissions (Fig. S2). This was in tune with the prevailing view (Maavara et al., 2017; Ran et al., 2017), suggesting that river dams impelled organic C mineralization. For given land use and landscape metrics (Table 1), relative importance of anthropogenic stresses on river DIC shifts was assessed by machine learning, random forest model. We show that agricultural land use largely modulated DIC in the karst rivers, as indicated by direct farmland to  $\text{HCO}_3^-$  (Fig. 6a) and agricultural patch-derived LPI to DIC species (Fig. 6c). Indeed, agriculture increased mineral and alkalinity inputs (Chen et al., 2021b; Ran et al., 2015), altering DIC species and the corresponding pH-driven dynamics ( $\text{CO}_2 + \text{H}_2\text{O} \leftrightarrow \text{H}_2\text{CO}_3 \leftrightarrow \text{H}^+ + \text{HCO}_3^- \leftrightarrow 2\text{H}^+ + \text{CO}_3^{2-}$ ). The PD, ED, AI and SHDI linked to  $p\text{CO}_2$  (Fig. 6), indicating that diverse and fragmented patches potentially contributed to river  $\text{CO}_2$  emissions. Landscape area plays a fundamental role in modulating dissolved C dynamics, which is highly constrained by artificial land use e.g., land development and deforestation. Thus, we specifically found that TA was associated with DIC concentration and  $\text{HCO}_3^-$  in the high human-stress river (Fig. 6c and d).

### 4.2. Human-induced variations in DOC biogeochemistry

Our data indicate that aquatic DOC was highly active and variable in the karst rivers. Anthropogenic activities enhanced land-water



**Fig. 6.** Machine learning-based relative importance of anthropogenic stresses to river dissolved carbon in the karst rivers (letters a, b, c and d are similar to Fig. 3). The flows represent the top 20 % weights of relative importance from land use and landscape metrics to dissolved C chemistry, as supplied by random forest model).

connectivity (Zhou et al., 2021), causing accumulated terrigenous lignin and DOC concentrations in the high human-stress river Pengxi (Table 2). We found biologically derived i.e., UV humic- and tryptophan-like compositions as universal DOC in the rivers (Fig. S5). This was confirmed by 16–59 % proportion of biogenic DOC (Fig. 4) and high  $\beta:a$  values (Fig. 5). A recent study suggested that UV humic-like component represented as a transition state during DOC biodegradation (Ni and Li, 2023). We thus speculated that in tune with the emerging view (Hu et al., 2023), river DOC undergone a continuous decay regarding incomplete degradation and even biological mineralization. This process was particularly pronounced in the dry season, leading to relative accumulation of terrigenous fulvic acid-like DOC (Fig. S7), a recalcitrant compound in natural waters.

This study provides empirical evidence that river DOC varied dramatically after flowing the river dam. For instance, river damming reinforced DOC bioavailability and freshness, and yet relatively reduced abundance of humic-like DOC and thus humification (Fig. S8). Long-

term retention was assumed to exhaust labile DOC and result in extreme lack of organic C substrate (Catalán et al., 2016). From this perspective, running waters might accommodate the sudden interruption and retention by utilizing aquatic DOC deeply rather than having “fast food”. These observations indicated that human-induced water retention highly stimulated DOC biodegradation (Kida et al., 2019; Zheng et al., 2020). Our results show that farmland and forest were primary contributors for macromolecular humic-like DOC (region V and HIX) and terrigenous lignin ( $a_{440}$ ) in the rivers (Fig. 6). Particularly, agriculture had significant weights on mediating biogenic fluorescence signatures (region I, II and  $\beta:a$ ), as observed in other streams despite the distinct DOC characterization i.e., ultrahigh-resolution mass spectrometry (Spencer et al., 2019). This was in good agreement with previous findings (Clark et al., 2022; Humbert et al., 2020; Wilson and Xenopoulos, 2009), suggesting agriculture increased DOC structural complexity and biodegradability. We observed that DOC chemistry was less susceptible to farmland and forest in the Pengxi (Fig. 6c and d),

probably because the mixed landscapes masked the flows driven by individual land uses in the high human-stress river. Particularly, AI served as a universal indicator associated with diverse DOC compositions across space and time (Fig. 6). This reflects that the growing fragmentation of land use contribute to riverine DOC diversity.

#### 4.3. Dissolved C turnover driven by anthropogenic disturbances

Inner linkages of DIC with DOC can reveal dissolved C turnover between inorganic and organic phases in aquatic systems (Ni and Li, 2022). Here, we observed their co-dynamics driven by biological production and degradation (Fig. 7). Our results upscale that “biological C pump” not only stimulated primary production e.g., carbohydrates, but also triggered overall organic C turnover. Aquatic DIC species linked to biogenic (protein- and microbial byproduct-like) DOC components, unsaturated compounds (URI) and freshness ( $\beta:a$ ) (Fig. 7), indicating primary production accelerated biological metabolism (Tortell et al., 2014; Zhong et al., 2021). The strong associations of  $\text{CO}_2$  ( $p\text{CO}_2$ ) with lignin (Fig. 7b) and DOC molecular weight (Fig. 7c) further confirm terrestrial inputs and DOC biodegradation acting as primary  $\text{CO}_2$  sources in the karst rivers. However, these processes in turn promoted recalcitrant DOC accumulation, as reflected by negative relationships between

DIC/ $\text{HCO}_3^-$  and humic-like DOC (Fig. 7c and d). Given the diverse relationships among dissolved C chemistry, we provide a causal description and analysis in Supplementary Information S2.

Artificial dams extended hydraulic retention time, accelerating both photosynthetic DIC uptake (Fig. S2) and biological DOC degradation (Fig. S8). For the karst rivers, damming caused more  $\text{CO}_2$  generation than consumption, as supported by potential  $\text{CO}_2$  emissions (Fig. S2). In this study, we identified anthropogenic disturbances on dissolved C turnover as the flows from land use and landscape metrics (Fig. 6) to the linked DIC and DOC (Fig. 7). We found farmland modulated the co-trajectory of  $\text{HCO}_3^-$  consumption and tyrosine-like DOC generation in the low human-stress river (Figs. 6a and 7a). In comparison, agricultural patch-derived LPI apparently stimulated synergistic DOC biodegradation (C2 and  $\beta:a$ ) with DIC ( $\text{DIC}$  and  $\text{HCO}_3^-$ ) increase in the high human-stress river (Figs. 6c and 7c). These results evidenced that agriculture unexpectedly led to hybrid functions on dissolved C interactions. Human-induced land use changes (TA) drove biologically derived DIC-DOC transformation in the dry season (Fig. 6c), and yet affected terrestrial DIC-DOC inputs in the rainy season (Fig. 6d). Therefore, fluvial DIC-DOC evolution was seasonally constrained by anthropogenic disturbances. The relatively aggregated land-use patches (AI) enhanced land-water connectivity, which intensified terrestrial pathway of  $\text{CO}_2$

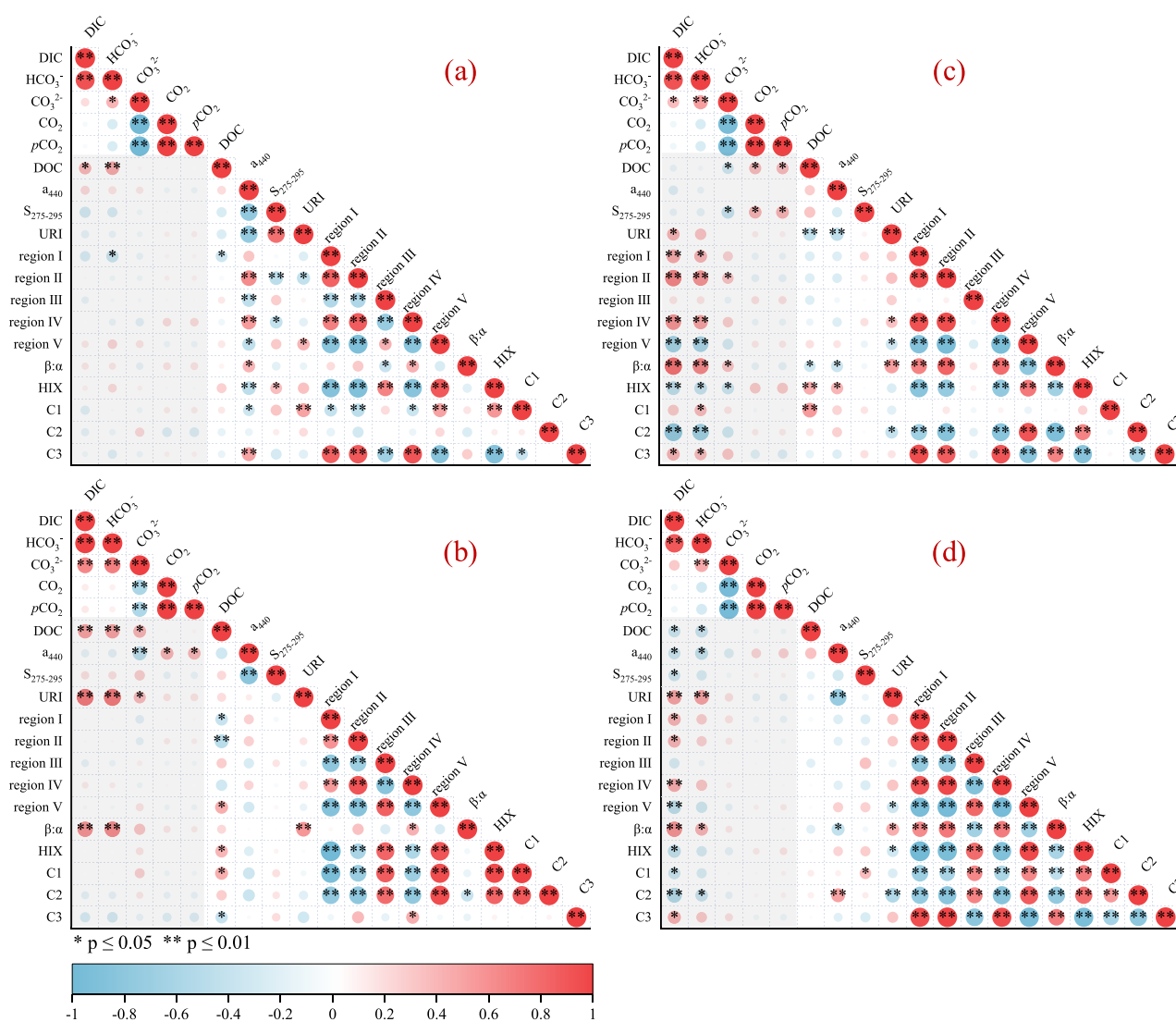


Fig. 7. Spearman's correlations of DIC species with DOC chemistry in the karst rivers (letters a, b, c and d are similar to Fig. 3. The red and blue circles with  $* p < 0.05$  or  $** p < 0.01$  indicate significant positive and negative correlations between the corresponding parameters, respectively).



and lignin inputs in the low human-stress river (rainy season, Figs. 6a and 7a). For more detailed information on modeling the relative importance of anthropogenic stresses to dissolved C please see Fig. S10.

#### 4.4. Implications for river C cycling

The C allocation in karst rivers driven by DIC and DOC turnover, along with the specific conversion pathways involved, is highly susceptible to anthropogenic disturbances. In this study, we show that river dissolved C shifts followed the associated trajectories of biogeochemistry, with important implications for aquatic C cycles. For instance, karst waters constitute a substantial DIC pool supply for coupled carbonate dissolution with photosynthesis, leading to large CO<sub>2</sub> consumption for primary production (Liu et al., 2015). Rainfall synergistically effects on CO<sub>2</sub> sink and results in seasonal patterns of river CO<sub>2</sub> reserves (Liu et al., 2010). The photosynthetic products e.g., carbohydrates are bio-labile and apparently stimulate biological metabolism, causing co-dynamics of overall DOC compositions (Fig. 7). That is, “biological C pump” unexpectedly drove rapid utilization of bioavailable and semi-labile DOC. With large biogenic signals, partial DOC undergoes incomplete degradation, and the remaining is mineralized into CO<sub>2</sub>. The produced CO<sub>2</sub> will be in turn consumed by the combined action of carbonate dissolution with photosynthesis, establishing a complete cycle of dissolved C.

From this perspective, we introduce a process-based conceptual model, the rapid cycle of active C in karst waters (Fig. 8). It is supposed

to have a part of dissolved C rapidly cycling in karst and semi-karst aquatic ecosystems: 1) carbonate dissolution sequesters CO<sub>2</sub> as HCO<sub>3</sub><sup>-</sup> form ( $\text{CaCO}_3 + \text{CO}_2 + \text{H}_2\text{O} \rightarrow \text{Ca}^{2+} + 2\text{HCO}_3^-$ ); 2) photosynthetic uptake of HCO<sub>3</sub><sup>-</sup> produces bio-labile CH<sub>2</sub>O ( $\text{Ca}^{2+} + 2\text{HCO}_3^- \rightarrow \text{CaCO}_3 + \text{CH}_2\text{O} + \text{O}_2$ ); 3) aquatic respiration of DOC preferentially utilizes bioavailable CH<sub>2</sub>O ( $\text{CH}_2\text{O} + \text{O}_2 \rightarrow \text{CO}_2 + \text{H}_2\text{O} + \text{ATP}$ ); 4) the bulk of produced CO<sub>2</sub> will be feedback to carbonate dissolution. The sequent processes (1) and (2) were well-understood by previous studies (Marcé et al., 2015; Song et al., 2022). Nevertheless, we underline that the processes (2) and (3) serve as key trajectories linking DIC and DOC turnover, and give a knowledge response to why karst rivers consume such a large CO<sub>2</sub> but still represent as CO<sub>2</sub> emitters — the rapid cycle of active C not only makes a substantial promotion for labile DOC mineralization, but also triggers overall DOC metabolism in karst rivers. Thus, the net CO<sub>2</sub> sink arising from “biological C pump” is partially counteracted by the activated biology.

Anthropogenic activities e.g., river damming and agricultural practice, nevertheless, accelerate the rapid cycle of active C, largely changing karst river dissolved C turnover. Consistent with our hypothesis, human activities altered dissolved C by disturbing the associated trajectories of DIC and DOC biogeochemistry. Given full pathways of man-made shifts in DIC and DOC turnover are still obscure (Bernot et al., 2010; Maavara et al., 2017), our study provides a novel understanding of the mechanistic underpinning regarding C cycling in karst waters. Human disturbances actively mobilise mutual transformations of the active C between inorganic and organic forms, particularly for

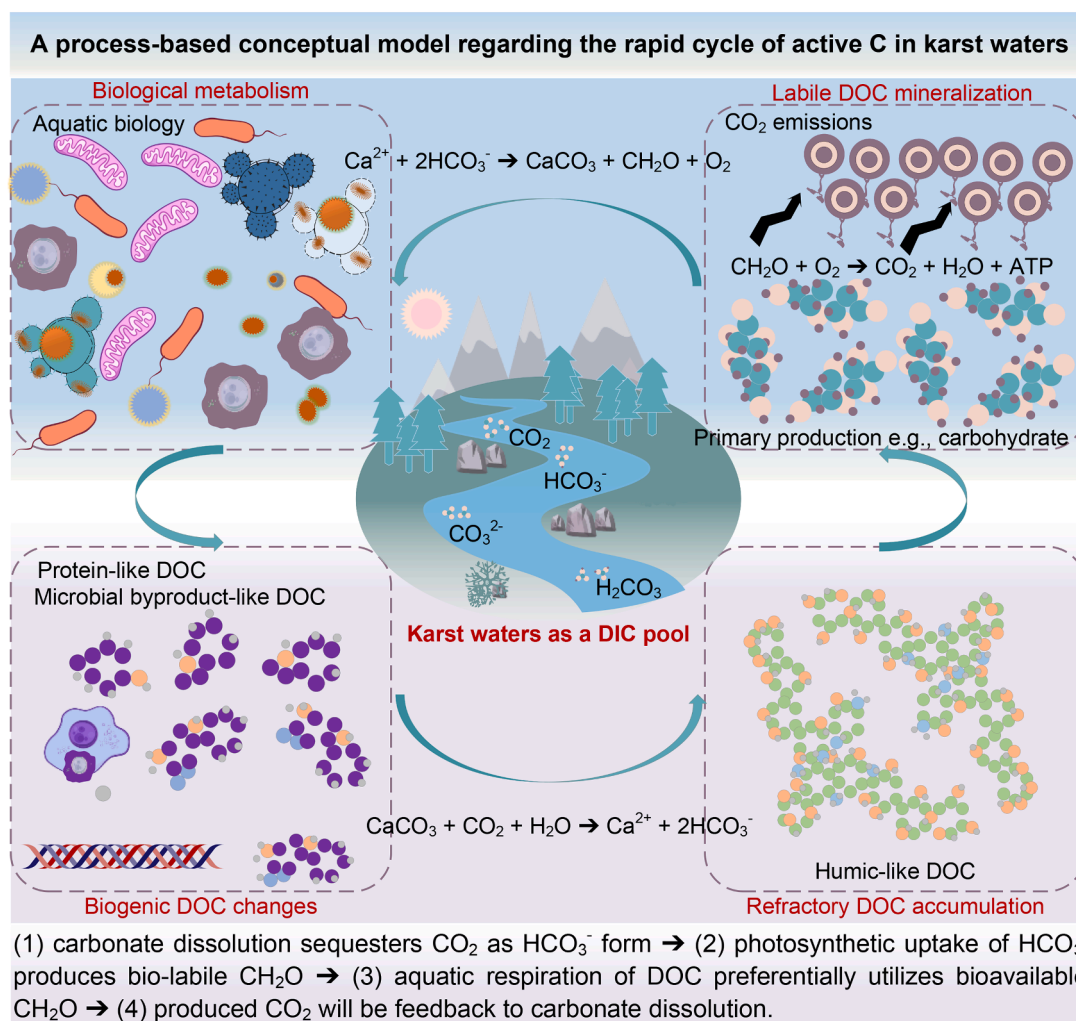


Fig. 8. A process-based conceptual model regarding the rapid cycle of active C in karst waters.

mineralizing DOC into CO<sub>2</sub>. Therefore, this study suggests that reducing anthropogenic stimulation on natural waters may decompress dissolved C turnover, and further sequester aquatic CO<sub>2</sub> in the context of global C neutrality.

## 5. Conclusion

Karst river dissolved C turnover was driven by the specific biogeochemical pathways, which showed the substantial shifts in response to human-induced disturbances. Here, we demonstrated that river damming and land use stimulated biological metabolism, highly altering DIC and DOC characteristics in the karst waters. Anthropogenic activities exhibited synchronous accelerations to aquatic photosynthesis and respiration, ultimately causing more river CO<sub>2</sub> production than fixation. River damming reinforced DOC bioavailability, while agriculture increased DOC structural complexity. Artificial dams and land uses unexpectedly altered aquatic DIC-DOC transformation. Based on these findings, we proposed a process-based conceptual model, indicating that a part of dissolved C is cycled rapidly in karst and semi-karst aquatic ecosystems. This study suggests that restricting human disturbances on natural waters can decompress dissolved C turnover and sequester CO<sub>2</sub> emissions in the context of global C neutrality.

## Declaration of Competing Interest

All authors agree this submission and the authors declare that there is no conflict of interests regarding the publication of this article

## Data availability

Data will be made available on request.

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## Supplementary materials

Supplementary material associated with this article can be found, in the online version, at [doi:10.1016/j.watres.2023.120744](https://doi.org/10.1016/j.watres.2023.120744).

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