### **RESEARCH ARTICLE**



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## Intra-event concentration-discharge relationships affected by hydrological connectivity in a karst catchment

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#### Abstract

Concentration-discharge (C-Q) relationship in streamflow provides insights into hydrological transport at the catchment scale. Changes in hydrological connectivity during runoff events often dominate flood and solute export in the karst catchment. However, only few studies have explored intra-event C-Q relationships and how they are affected by hydrological connectivity in karst catchment. In this study, we explored the intra-event C-Q relationships in underground channel flows by integrating solute concentration, discharge and modelled flow age in a 1.25 km<sup>2</sup> karst catchment in southwest China. We apply piecewise functions to characterize the C-Q relationships on rising and falling limbs of hydrograph. Geogenic solutes exhibited dilution C-Q patterns during the runoff event, which could be fitted by two power-law models with different coefficients on rising and falling limbs. Affected by the strong hydrological connectivity between surface and subsurface, hillslope and depression, a steeper C-Q slope on the rising limb indicated an exhaustible, proximal source, that is, groundwater. In contrast, the C-Q patterns of the soil enriched solutes changed from enrichment to dilution during the runoff event. The enrichment pattern occurring at the early of rising limb was caused by strong hydrological connectivity between the surface and subsurface, which indicated a distal and plentiful sources of soil water. Whilst the strong hydrological connectivity between hillslope and depression caused a dilution pattern at the latter of rising limb. On the falling limb of hydrograph, a dilution pattern implied that the small fractures could be another source zone of soil-enriched solutes in addition to soil layer in the depression. The C-Q behaviours of soil-enriched solutes can be fitted by a combination of a parabola model and a power law model for rising and falling limbs, respectively. The current study highlights the variations in intra-event C-Q relationships of different solutes affected by hydrological connectivity in the karst catchment. Which is crucial for assession of hydrochemical processes and fertilization management in this area.

#### KEYWORDS

hydrological connectivity, intra-event C-Q relationship, karst catchment, water age

### 1 | INTRODUCTION

Karst catchment is characterized by unique heterogeneous and anisotropic hydrogeological conditions (Bakalowicz, 2005; Ford & Williams, 2013). Strong dissolution of carbonate rock makes a complex hydrogeological system, for example, different flow velocity and interconnected network paths in small fractures, large fractures and conduit (Hartmann et al., 2014). Variations in flow characteristics in these mediums with different hydraulic conductivities and storage capacities result in a marked spatiotemporal variability in hydrological processes. Under different wetness conditions, the sharp variations in hydrological connectivity between different landform units and between different mediums enhance the complexity of hydrological behaviours at the catchment scale (Hao et al., 2019). Specifically, the streamflow generation in intra-event is still an unanswered question for karst catchment, due to the variable flow paths and mixing processes controlled by hydrological connectivity (Benischke, 2021; Berglund et al., 2019; Ford et al., 2019). In karst environment, the transport and transformation of solutes are significantly related to hydrological processes, which makes it complicated to characterize the spatiotemporal variations in hydrochemistry in karst critical zone and down-stream (Husic et al., 2019, 2021; Yi et al., 2021; Yue et al., 2019, 2020; Zhang, Chen, Cheng, et al., 2020; Zhang, Chen, Zhang, & Soulsby, 2020). Although the process-based model by coupling hydrological and biogeochemical modelling can provide useful insights to this complexity, simulation of solute fate at the catchment scale usually requires detailed information of critical zone architecture (Husic et al., 2019; Zhang, Chen, Cheng, et al., 2020; Zhang, Chen, Zhang, & Soulsby, 2020). In addition, uncertainty often increases with the model complexity and parameters (Zhang & Shao, 2018).

The relationship between solute concentration and discharge (C-Q) establishes a linkage between solute dynamics at a given point in the stream to discharge, which provides a lumped insight to the hydrochemical processes at the catchment scale (Basu et al., 2011; Musolff et al., 2015; Stewart et al., 2022). C-Q relationships are usually linked to the solute availability (Westphal et al., 2020), hydroclimatic patterns (Dupas et al., 2016), flow paths (Hoagland et al., 2017), hydrological connectivity (Herndon et al., 2018), residence time (Tunaley et al., 2016), reaction kinetics (Ameli et al., 2017), and vegetation (Herndon et al., 2015). Which have been widely used to explore hydrological and reaction processes at the catchment scale (Knapp et al., 2020; Li et al., 2021; Musolff et al., 2017; Rose & Karwan, 2021). Many studies have approved that the C-Q relationships of streamflow can be used to assess solute behaviours under different hydrometeorological conditions in unique karstic environment (Xia et al., 2021; Yue et al., 2019; Zhong et al., 2018). Which have been extensively used to understand hydrological functions in karst catchment, and its responses to climate and land use change (Buckerfield et al., 2019; Zhang et al., 2021).

C-Q relationships are usually characterized at different temporal scale (Rose et al., 2018). The long-term and seasonal C-Q relationship can provide general patterns of hydrologic transport and associated controls (Minaudo et al., 2019; Westphal et al., 2020; Zarnetske

et al., 2018). However, it cannot give enough information to reveal C-Q behaviours at the runoff event scale, the critical moment for flooding and export (Le Mesnil et al., 2022; Rue et al., 2017). With high frequency online observation and automatic sampling technique more available, more and more attentions focus on C-Q relationships at the runoff event scale, which can provide additional insight into mechanisms of streamflow generation and solute transport at the catchment scale (Li et al., 2022; Minaudo et al., 2019; Musolff et al., 2021). Especially in karst catchment, the event-scale C-Q relationship provides a useful material to assess the spatiotemporal variations in transport processes (Qin et al., 2020; Wang et al., 2020).

Power law equation, in the form  $C = aQ^b$ , is the most widely used model to describe C-Q relationships of streamflow. According to the coefficients of a and b, C-Q patterns are distinguished into enrichment (b > 0), dilution (b < 0) and chemostasis pattern (b  $\approx$  0), which reflect the change in the solute concentrations versus the corresponding change in discharge (Musolff et al., 2015). Hysteresis occurs when there are differences of concentration for the same discharge during the rising and falling limb of event hydrographs. (Bieroza & Heathwaite, 2015). Which arises as a consequence of mixing of different source water (Zhi & Li, 2020) or difference in the rate at mobilization of sources (Haddadchi & Hicks. 2021). Hysteresis terms are often added to power law formula to consider the hysteresis between concentration and discharge, e. g.  $C = aQ^b + c \cdot dQ/dt$  (Minaudo et al., 2017; Musolff et al., 2021; Winter et al., 2021), where coefficient of c describes the hysteresis size (using the absolute value of c) and direction (using the sign of c). Hysteresis directions containing clockwise (c > 0) and anticlockwise (c < 0) represents the differences in the response rate of concentration and discharge to rainfall. Both the C-O patterns (enrichment, dilution and chemostasis) and hysteresis (clockwise and anticlockwise) are resulted from the behaviours of solute source mobilization with streamflow changes, controlled by the degree of connection between source and streamflow (Knapp et al., 2022; Stewart et al., 2022). In many studies, it is found that a single power law model usually cannot conform the C-Q relationships from monitoring data across the full wetness range (Minaudo et al., 2019; Moatar et al., 2017). This is not only related to dischargedependent biogeochemical actions (Moatar et al., 2017), but also to the variations in hydrological connectivity in resource zone (Knapp et al., 2022).

C-Q relationships are related to the source zone distribution in the catchment, and associated hydrological connectivity between them and stream. For example, geogenic species (e.g., Ca, Mg, Si) derived from chemical weathering are usually provided by groundwater (Anderson et al., 1997; Stewart et al., 2022; Zhi et al., 2019), while the soil-enriched species (e.g., rich in carbon-, nitrogen-) are mainly come from shallow soils (Herndon et al., 2015; Pesántez et al., 2018; Tittel et al., 2022). Regardless of the species, catchment hydrological connectivity is the controlling factor of activation of source (Knapp et al., 2020, 2022). Compared with non-karst area, the spatiotemporal variations in hydrological connectivity are more complex in karst area due to the high spatial heterogeneity of critical zone architecture (Zhang et al., 2019). Marked changes in the hydrological connectivity

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may occur in a short time (e.g., rising limb of hydrograph) during the runoff event (Al Aamery et al., 2021; Zhang et al., 2021). However, how the changing hydrological connectivity between source zone and stream affects event-scale C-Q relationships in karst catchment remains unclear. In practice, catchment hydrological connectivity cannot be identified by direct observation at the catchment scale. Water age, as a fundamental characteristic of catchment hydrological connectivity ity within a hydrological system (Kirchner et al., 2000; McDonnell & Beven, 2014). Which provides an aided index to assess influence of hydrological connectivity on C-Q relationship under different hydrometeorological conditions (Benettin et al., 2017; Soulsby et al., 2015; Sprenger et al., 2019; Zhang et al., 2019).

To help address the general research gaps in solute transport in karst catchment, our overall objective is to better understand variations in C-Q relationships of streamflow in karst catchment and its controls under different hydrometeorological conditions. More specifically in this study, aiming to karst catchment, we sought to address two questions: (1) How do the C-Q relationships of different species in streamflow vary during the runoff event? (2) How does source zone distribution and hydrological connectivity control the intra-event C-Q relationships at the catchment scale?

#### 2 | SITE AND METHODOLOGY

### 2.1 | Study site

Chenqi catchment (1.25 km<sup>2</sup>) is situated in the Puding Karst Ecohydrological Observation Station in Guizhou Province, Southwest China (Figure 1). It is a typical cockpit karst landscape experimental catchment drained by a single underground channel/conduit. This



FIGURE 1 Map of the location, geology, geomorphology, hydrological monitoring and sampling locations in the Chenqi catchment.

		Rainfall (mm)		Discharge (m <sup>3</sup> /s)			Modelled flux age (days)		
Event	Date	Amount	Max (mm/h)	Mean	Max	Min	Mean	Max	Min
1	24 Jun	4.4	2.4	0.03	0.065	0.015	142	164	115
2	27 Jun	15.4	2.6	0.05	0.1	0.028	125	147	97
3	30 Jun	51.4	9.6	0.08	0.14	0.03	104	127	82
4	9 Jul	83.4	28.6	0.07	0.15	0.01	81	102	8
5	19 Jul	28	12.2	0.03	0.09	0.003	121	157	21
6	4 Aug	13.6	11.2	0.01	0.05	0.003	134	166	66
7	12 Aug	29.2	16.4	0.03	0.06	0.002	110	186	44

**TABLE 1** Statistics of rainfall and discharges at the catchment outlet and hillslope spring (HS) for the seven events.

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catchment is surrounded by conical hills mainly covered by forest and shrub, separated by star-shaped valley covered by farmland (rice-rape crop rotation). From a 1:10000 digital topography map, the depression area (with elevations <1340 m) and the hillslope area (with elevations of  $1340 \sim 1500$  m) occupy 0.37 and 0.88 km<sup>2</sup>, respectively. In the depression, four observation wells record groundwater table and monitor the hydro-chemical composition (Figure 1). The catchment is subject to a subtropical wet monsoon climate. Mean annual temperature is 20.1°C and mean annual precipitation is  $\sim$ 1140 mm. More than 85% of annual precipitation falls in the wet season from May to September. Geological properties in the catchment are composed of dolostone, thick and thin limestone, marlite and Quaternary soil (cross sections of A-A' and B-B' in Figure 1). The limestone with the thickness of 150-200 m is mostly located at higher elevation areas. The marlite underlain the limestone forms an impervious layer and thereby produces karstic springs in this region. The soils overlying the carbonate rocks are thin on the hillslope, with a mean thickness about 30 cm. In depression, soils are relatively thick (over 2 m) and cultivated as cropland.

## 2.2 | Monitoring, sampling and runoff events selection

The discharges at the catchment outlet and a hillslope spring (HS) located at the foot of the eastern steep hillslope were measured using a v-notch weir instrumented with HOBO U20 water level logger (Onset Corporation). Electrical conductivity (EC) of the catchment outflows was measured in situ with a hydrological chemistry sensor (Aqua TROLL 600 Multiparameter Sonde). The NO<sub>3</sub><sup>-</sup> concentrations in catchment outflows were monitored using a non-optical NISE sensor which had been calibrated using the laboratory measurements (Yue et al., 2019). The observation interval for the discharge, EC and NO<sub>3</sub><sup>-</sup> concentrations was 15 min during the study period from 12 June and 14 August 2017. There was a meteorological station (Onset HOBO RG3-M) on a southern hillslope (Figure 1), recording precipitation, and temperature in a time interval of 5 min.

Rainfall (at the catchment outlet), flows at catchment outlet and hillslope spring were intensively sampled for using an autosampler setting to hourly intervals during the study periods In this study, groundwater (GW) in the depression mainly came from small fractures (Chen et al., 2018) was sampled from four wells with depth below the ground surface ranging from 13 to 35 m in the depression (Figure 1), for nine times during the study period (Table 1). All water samples were used to analyse ions concentration containing calcium (Ca<sup>2+</sup>), magnesium (Mg<sup>2+</sup>), potassium (K<sup>+</sup>) and sodium (Na<sup>+</sup>). Samples were first stored in high-density polyethylene container and then filtered through 0.45-µm Millipore nitrocellulose membrane filters within 24 h of sampling. The ion concentrations were analysed by inductively coupled plasma optical emission spectrometer, and the analyses were conducted in the Puding Karst Ecohydrological Observation Station within a relative standard deviation (RSD) of 5%.

To explore the C-Q relationship at the event scale, some runoff events during the study period were selected. A separated runoff event in this study was defined as the response of discharge which began with an increase of 10% in a moving window, and ended when discharge decreased less than 0.5% within the moving window or increased again due to another rainfall. According to this division, a total of seven separated events were selected (Figure 2 and Table 1). Sometimes, time interval between two separated runoff events was short, and flow water at the catchment outlet was also collected in some interval between events, for example, a continuous sampling was performed from 21 June to 4 July in this study (Figure 3).

To eliminate the effect of magnitude differences of different solute concentrations, normalized C-Q relationships were used for exploration in this study. The normalized solute concentrations and discharge were estimated as:

$$X_{norm} = (X - X_{min}) / (X_{max} - X_{min}), \qquad (1)$$

Where, X represents the observed concentrations of a specific solute,  $X_{min}$  and  $X_{max}$  represent the minimum and maximum concentrations, respectively.

#### 2.3 | Water ages

Tracer-aided hydrological model integrating tracers into rainfallrunoff model allows us to track the water age in streamflow (Hrachowitz et al., 2016; Remondi et al., 2018; Soulsby et al., 2015).



Time series of  $Ca^{2+}$ ,  $Mg^{2+}$ ,  $K^+$ ,  $Na^+$ ,  $NO^-_3$  and electrical conductivity (EC) during the study period. The shade represents the FIGURE 3 discharge.

To link water concentrations of dissolved solute to water age, a robust tracer-aided runoff model for karst catchments developed by Zhang et al. (2019) was used to track the flux age in different landscape units. The model consisted of two main conceptual stores representing the main landscape units: the hillslopes and the depression. To conceptualize the typical dual-flow system of the karst critical zone (Hartmann et al., 2014), the depression store was subdivided into slow and fast reservoirs. Which represent the low-permeability

	Concentration (mg/L) and EC (µS/cm)									
Event	Ca <sup>2+</sup>	Mg <sup>2+</sup>	K <sup>+</sup>	Na <sup>+</sup>	NO <sub>3</sub> <sup>-</sup>	EC				
1	85 ± 9	11.6 ± 1.2	0.9 ± 0.1	0.8 ± 0.1	$3.52 \pm 0.34$	476 ± 17				
2	85 ± 4	10.9 ± 0.5	0.8 ± 0.06	0.7 ± 0.07	2.95 ± 0.29	477 ± 11				
3	80 ± 6	11.1 ± 1.2	$0.8 \pm 0.08$	0.7 ± 0.1	2.99 ± 0.31	462 ± 25				
4	79 ± 9	10.2 ± 1.3	0.9 ± 0.2	0.7 ± 0.08	3.25 ± 0.14	419 ± 40				
5	85 ± 6	11.7 ± 1.8	0.8 ± 0.1	0.8 ± 0.1	3.35 ± 0.07	496 ± 34				
6	98 ± 7	15.9 ± 4.2	$1.1 \pm 0.07$	1 ± 0.07	3.48 ± 0.25	508 ± 32				
7	87 ± 15	19 ± 4.1	1.3 ± 0.3	1.1 ± 0.3	2.91 ± 0.26	504 ± 43				



media, for example, primary porosity in the matrix blocks and small fractures in the aquifer, and the large fractures and conduits with a high permeability, respectively. By conceptualizing the hydrological connectivity of the catchment that links the conceptual stores, this tracer-aided model successfully captured the nonlinear flow response in karst catchment. By tracking the input and output fluxes with isotope fingerprints through each conceptual store, the flux ages of different landscape units could be estimated. A complete mixing was assumed for both slow and fast reservoirs in the depression unit, and an active reservoir with an additional passive reservoir only for the tracer mixing simulation is employed to estimate the water and tracer dynamics in the hillslope unit. The flux ages of the catchment outlet flows were estimated by integrating the contribution of water flux from each conceptual store with different ages. Model calibration and verification have been performed using hourly flow discharge and stable isotopes at outlet, hillslope spring and groundwater in the wells in the study catchment. Please refer to Zhang et al. (2019) for full details of how the water ages were derived.

### 3 | RESULTS

## 3.1 | Dynamics of discharge, water age and solute concentration

The total precipitation amount was 437 mm over the study period from 12 June to 14 August 2017, with the maximum rainfall intensity of 28.6 mm per hour. For the study period, the mean discharges were 0.019 and  $0.27 \times 10^{-3}$  m<sup>3</sup>/s, and the median flow ages derived from the tracer-aided model were 154 and 109 days at the catchment outlet and HS, respectively (Figure 2). Figure 3 showed the dynamics of solute concentrations in catchment outlet flows. The concentrations of Ca<sup>2+</sup> and Mg<sup>2+</sup> were at a relatively high level during the study period, with the means of 90 and 13.6 mg/L, which is similar to monitoring in many other studies in carbonate-rich catchment with strong rock weathering (Qin et al., 2020; Zhong et al., 2018). The mean concentrations of K<sup>+</sup>, Na<sup>+</sup> and NO<sub>3</sub><sup>-</sup> were 0.97, 0.90 and 3.86 mg/L, respectively. The mean EC was 537 µS/cm over the study period. For the seven selected runoff events, the means of rainfall, discharge and modelled flow age at catchment outlet ranged from 4.4 to 83.4 cm, 0.01 to 0.08m<sup>3</sup>/s and 81 to 142 days, respectively (Table 1). The largest discharge was 0.15 m<sup>3</sup>/s for the event on 9 July with the largest rainfall intensity of 28.6 mm per hour. The lowest flow age was ~8 days corresponding to the largest discharge. For the seven events, the mean concentrations of Ca<sup>2+</sup>, Mg<sup>2+</sup>, K<sup>+</sup>, Na<sup>+</sup>, NO<sub>3</sub><sup>-</sup> and EC in catchment outflows ranged from 79 to 98 mg/L, 10.2 to 19 mg/L, 0.8 to 1.3 mg/L, 0.7 to 1.1 mg/L, 2.95 to 3.52 mg/L and 419 to 508 µS/cm, respectively (Table 2).

## 3.2 | End-member source waters of the catchment outflows

In this study, the catchment was drained by an underground conduit, hence, the catchment outflows were treated as conduit flows. Which were derived primarily from three sources with distinct chemical characteristics: hillslope flows, diffuse recharges resemble water in small fractures and concentrated recharges via large fractures or sinkholes (Hartmann et al., 2014). The concentrated recharges usually come from lateral flow at the surface after rain, i.e. overland flows. In this study, hillslope flows were sampled from the hillslope spring, diffuse recharges from wells in depression (referred to as groundwater below) mainly collecting small fracture waters, concentrated recharges from overland flow point at surface in the depression (Figure 1). Figure 4 showed the solute concentration and EC in different end-member water sources, and the values of NO<sub>3</sub><sup>-</sup> concentration and EC in overland flow and groundwater came from the research by Tan (2020). The results showed that the highest concentrations of K<sup>+</sup> and NO<sub>3</sub><sup>-</sup> (classified as the soil-enriched solutes) were in overland flow, with the means of 3.5 and 19.8 mg/L, respectively. This was consistent with the findings by Wang et al. (2020). In this area, the nutrients (e.g., nitrogen, phosphorus and potassium) are mostly accumulated in the soils, which come from the fertilization in the depression with the light fertilization for rape in October-November, and the heavy fertilization for rice in May-early June (Yue et al., 2019). According to mineral composition test using XRD, Dmax-Illa, Japan, Wang (2008) reported that 75% of the surface soils consists of illite-smectite mixed mineral with high potassium. Hence, the surface soil is the main



**FIGURE 4** Solute concentration in rain, hillslope flow, overland flow, groundwater, and conduit flow (*p* < 0.05). The triangles represent the mean values from Tan (2020). CF, conduit flow; GW, groundwater; HS, hillslope water; OF, overland flow.

source zone of K<sup>+</sup> and NO<sub>3</sub><sup>-</sup> in conduit flow. It is worth noting that the concentrations of K<sup>+</sup> and NO<sub>3</sub><sup>-</sup> in groundwater in the depression (2.7 and 8.46 mg/L, respectively) were higher than that in conduit flow. Which reveals that the small fractures in depression could be another minor source zone of K<sup>+</sup> and NO<sub>3</sub><sup>-</sup> in conduit flows. The concentrations of Na<sup>+</sup> were higher both in overland flows and groundwater (1.87 and 1.81 mg/L) than that in conduit flows (0.9 mg/L), which was treated as a soil enriched solute in this study. By contrast, the highest concentrations of Ca<sup>2+</sup> and Mg<sup>2+</sup>, classified as the geogenic solutes (Zhi et al., 2019), were in groundwater with the means of 103.3 and 37.1 mg/L, respectively. Which indicated that the small fractures are the main source zone for Ca<sup>2+</sup> and Mg<sup>2+</sup> in conduit flows (with the mean values of 90 and 13.6 mg/L, respectively).

Chemical weathering of various rocks, as well as atmospheric and anthropogenic inputs, are main contributors of dissolved loads in streamflow (Gaillardet et al., 1999). Many previous studies have confirmed that the chemical weathering of rocks, especially the carbonate weathering, has a controlling effect on concentration of geogenic solutes (e.g., Ca, Mg) in streamflow in karst area (Zhong et al., 2017). The Na normalized molar ratios of  $Mg^{2+}/Na^+$  and  $Ca^{2+}/Na^+$  in the dissolved phase of streamflow can be used to characterize the weathering of silicate, carbonate and evaporite at



**FIGURE 5** The relationships of  $Mg^{2+}/Na^+$  versus  $Ca^{2+}/Na^+$  in conduit flows and groundwater in the depression.

catchment scale (Gaillardet et al., 1999). The relationships of Mg<sup>2+/</sup> Na<sup>+</sup> versus Ca<sup>2+/</sup>Na<sup>+</sup> in conduit flow and groundwater in the depression for Chenqi catchment were shown in Figure 5. The



FIGURE 6 Power-law relationships between concentration and discharge over the whole study period for each solute.

results showed the marked high values of Ca<sup>2+</sup>/Na<sup>+</sup>, indicating the strong limestone weathering. This is consistent with the findings by Wang (2008) that the geologic stratum of this catchment is predominantly calcite rich rocks. Compared to groundwater in the depression with long residence time, the water from hillslope has relatively short resistance times (a mean age of  $\sim$ 109 days by Zhang et al. (2021)), which weakens the rock weathering. In addition, the thin soil layer on hillslope results in relatively little soil carbon dioxide dissolution (Li & Li, 2018), which limits the weathering of carbonate in hillslope. Therefore, the concentrations of  $Ca^{2+}$  and  $Mg^{2+}$  were relatively low in hillslope flow, with the mean values of 75 and 9.5 mg/L, respectively (Figure 4).

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The mass of  $Ca^{2+}$  and  $Mg^{2+}$  accounting for over 90% of the cations in conduit flow (Tan, 2020), resulting in the highest EC in groundwater with the mean of 644 µS/cm, which indicated that the small fracture was the main 'source zone' of EC in conduit flows.

## 3.3 | C-Q behaviours of different solutes in conduit flow

Figure 6 showed the general C-Q relationships of  $Ca^{2+}$ ,  $Mg^{2+}$ ,  $K^+$ , Na<sup>+</sup>, NO<sub>3</sub><sup>-</sup> and EC in conduit flows over the study period. The results indicated that C-Q relationships of these solutes can be generally described by a power law model in the form  $C = aQ^{b}$ . The negative b indicated a dilution C-Q pattern for all constituents during the study period. It was notable that the variations in the concentration of  $NO_3^-$  were more complex than the other solutes, which could be associated with the biogeochemical reaction of nitrate.

The dynamics of hourly discharge, water age and solute concentration for each separated event were shown in Figure 7. Here is the case of event No. 1 on 9 July 2017, and the results for the other events are in Data S1. During the event, the modelled ages of conduit flow declined and then increased. The lowest water age appeared



**FIGURE 7** (a) Dynamics of hourly discharge, modelled flow age and solute concentration in conduit flows for the event on 24 June 2017 (event No. 1 in Table 1); (b) the normalized C-Q behaviours of solutes.

earlier than the flow peak, which indicated the rapid entrance of young water at the beginning of the event. There was a little decline of conduit flow age at 5 o'clock 25 June, on the falling limb of hydrograph, which was due to a small rainfall (with the rainfall amount less than 1 mm). The concentrations of  $Ca^{2+}$ ,  $Mg^{2+}$ ,  $NO_3^{-}$  and EC in conduit flow decreased with the increase of discharge on the rising limb, and then increased gradually on the falling limb. The concentration curves of these solutes showed a general shape of letter 'V' during the event, which indicated the dilution C-Q pattern over the entire event (Figure 7b). The C-Q relationship of Mg<sup>2+</sup> showed chaotic variations on the rising limb in this event, which may be related to the antecedent concentration conditions in the catchment. In contrast, the concentrations of  $K^+$  and  $Na^+$  increased first (increased by  $\sim 33\%$ and 27% in the first hour, respectively) and then decreased (Figure 7a) on the rising limb, and gradually increased on the falling limb. During the event, the concentration curves of  $K^+$  and  $Na^+$  showed a shape of

letter 'N' with two inflection points. Which indicated that the C-Q patterns changed from enrichment to dilution during the event (Figure 7b).

The difference of C-Q patterns for different species mainly occurred in the early of event (Figure 7). Here, the ratio of percentage changes in solute concentration and discharge, at the first hour of each event, was estimated as:  $\Delta Q = (Q_n - Q_0)/Q_0 \times 100\%$ ;  $\Delta C = (C_n - C_0)/C_0 \times 100\%$ . Where, Q and C represent discharge and concentration, and the subscript 0 and *n* represent the start time and elapsed time (*n* = 1 in this study) for the runoff event, respectively. The results show that the percentage changes in discharge at the first hour ranged from 13% to 291% (with the mean of 87%) for the seven events. The concentration of Ca<sup>2+</sup> tended to decrease at the first hour, and its percentage changes ranged from -0.6% to -27.1% for the seven events, which indicated the dilution C-Q pattern at the beginning of the event. On the contrary, the concentration of K<sup>+</sup> increased at the



**FIGURE 8** Percentage changes in the solute concentration at the first hour of each event versus the corresponding percentage changes in discharge.

first hour for all events, with the percentage changes from 0.4% to 71.3% (Figure 8), indicating an enrichment C-Q pattern. The percentage changes in concentrations of  $Mg^{2+}$  and EC increased in most events while decreased in some others (Figure 8), and the percentage changes in Na<sup>+</sup> and NO<sub>3</sub><sup>-</sup> concentrations showed irregular changes at the first hour of event.

# 3.4 | Empirical models for intra-event C-Q relationship

There were significant changes in C-Q relationships during the runoff event (Figure 7). To consider the variations and associated influence factors, we used piecewise models to fit the C-Q patterns on rising and falling limb, respectively, instead of single model with constant coefficients for a whole event (Musolff et al., 2021; Qin et al., 2020; Winter et al., 2021). The negative C-Q relationships for geogenic solutes (e.g., Ca<sup>2+</sup> and Mg<sup>2+</sup>) showed dilution patterns on both rising and falling limbs. Here, two power law equations, in the form of  $C = aQ^b$ , with different coefficients were chosen for the rising and falling limbs, respectively. Taking the C-Q behaviours of Ca<sup>2+</sup> of event

No. 1 on 24 June 2017 as an example (Figure 9), the results showed that these two power law formulations can capture the C-Q behaviours on both sides of the hydrograph, with  $R^2$  of 0.77 and 0.65, respectively. The values of *b*, representing the C-Q slopes in log–log space, for the rising limb (–0.13) were lower than that for the falling limb (–0.07). Which indicated an exhaustible, proximal source of groundwater on the rising limb. It can be inferred that the piecewise fitting models can be used to explore variations in contributions of different source water or activations of solute sources during the event, which are usually identified through hysteresis analysis (Li et al., 2022; Lloyd et al., 2016).

Due to theoretical monotonicity, power-law models cannot describe the changes in C-Q patterns from enrichment to dilution for  $K^+$  (Figure 9). In this study, a parabolic equation in the form of  $ax^2 + bx + c$  was used to fit the C-Q pattern of  $K^+$  on the rising limb of hydrograph. The results showed that the C-Q relationship can be captured well on the rising side of hydrograph, with  $R^2$  of 0.92. The positive C-Q relationship (enrichment pattern) implied that the proximal source of  $K^+$  was plentiful at the beginning of the rising phase. Then supply limitation occurred and the C-Q pattern reversed in the later of rising limb. On the falling limb, the concentrations increased



**FIGURE 9** C-Q relationships (Ca<sup>2+</sup> and K<sup>+</sup>) at the rising and falling limbs of hydrograph for the event on 24 June 2017.

monotonically with the decrease of discharge, showing a dilution C-Q pattern. Thus, a power law equation was used to fit the C-Q relationship on this limb, and the model can generally capture the C-Q relationship, with  $R^2$  of 0.43. It worth noting that the K<sup>+</sup> has a similar dilution C-Q pattern to Ca<sup>2+</sup> on the falling limb of the hydrograph, which revealed that they have the same source water, that is, groundwater, during this phase. According to the variations in concentrations and discharges in Figure 7, it can be found that not all soil-enriched solutes follow the same C-Q pattern as K<sup>+</sup> during the event, for example, NO<sub>3</sub><sup>-</sup>. The most likely explanation relates to the biogeochemical reactions and anthropic impacts on the solute fates at the catchment scale. This is consistent with findings in many studies that some soilenriched solutes usually show different C-Q relationships at the event scale (Liu et al., 2022).

### 4 | DISCUSSION

## 4.1 | Constraint of hydrological connectivity on inter-event C-Q patterns

Geogenic solutes usually exhibit high concentrations in groundwater due to mineral weathering upon long-time contact between water and rocks (Ameli et al., 2017; Rose et al., 2018). According to ion monitoring in this study, the concentrations of geogenic solutes in overland flows in depression and hillslope flows were lower than that in the conduit flows (Figure 4). In other words, groundwater is the main source of geogenic solutes in stream/under river flows (Zeng et al., 2019). On the rising limb of hydrograph, the decrease trend of concentrations of geogenic solutes (e.g., Ca and Mg) in conduit flows indicated the entrance of water with low concentrations. The increase of overland and hillslope flow contributions can cause this dilution C-Q pattern. Water age can provide information to exactly identify the source water for this C-Q behaviours. Conduit flow ages dropped rapidly from a few hundred days to a dozen days at the beginning of rainfall (Figure 2), while the ages of hillslope flows were about 100 days (with mean of  $\sim$ 109 days) during the same period (Zhang et al., 2019). Hence, it can be inferred from the dynamics of water age that the dilution C-Q pattern of geogenic solute in the early of rising limb was caused by the high contribution of overland flows with low age (Zhang et al., 2021). This was related to the strengthening hydrological connectivity between surface and conduit through large fractures or sinkholes in depression at the early of runoff event. With the strengthening of hydrological connectivity between hillslope and depression, the contribution of hillslope flows to conduit flows increased in the later of rising limb. Which resulted in the continuous dilution C-Q pattern during this phase. The flatter C-Q slope on the falling limb indicated the gradual dominant of groundwater with higher availability of solutes in contrast to overland and hillslope flows. The increasing ages of conduit flow on the falling limb supported this hypothesis (Figure 7a).

In no-karst area, many researches found that C-Q slopes of geogenic solutes were usually invariant during runoff event, due to the relatively constant contribution of groundwater to streamflow (Anderson et al., 1997; Godsey et al., 2009; Stewart et al., 2022). Which indicated the hydrologic connectivity had less effect on variations in C-Q slope (Knapp et al., 2020). However, hydrological connectivity between small fractures (slow flow system) and conduit (fast flow system) showed significant variation across wetness states in karst area (Chen et al., 2018; Wang et al., 2022). Which can result in the changes in C-Q slopes during runoff event, as the contributions of groundwater changes with hydrological connectivity. Therefore, timevariant models could be needed for C-Q relationship fitting in karst catchment with rapid variability of hydrological connectivity during the event.

For soil-enriched solutes, diffuse percolation of soil water to small fractures in depression increases the availability of solutes in small fracture water (Sorensen et al., 2015; Yue et al., 2019). In addition, higher water level in conduits at the beginning of a flood can lead water flux with high concentrations (showing in Figure 7) from conduits to small fractures, known as the 'bidirectional exchange' between conduit and small fracture in karst critical zone (Chen et al., 2018; Zhang et al., 2017). These make the small fractures in epikarst a secondary source zone for soil-enriched solutes in conduit flows, and the monitoring results of concentration (Figure 4) approved our hypothesis. Therefore, both overland flows and groundwater in depression, in theory, could produce the increases of solute concentrations at the beginning of rising limb, as well as falling limb phases (Figure 7). Fortunately, water age provides information to determine the mixing of different water sources with a different timing (Botter, 2012; van der Velde et al., 2015), which can be used to identify which source is mobilized at different wetness stages. According to variations in water ages, the strong hydrological connectivity

between surface and subsurface mobilizing the source of soil layer in the depression, because the sharp increase of concentrations with the increase in discharge (the enrichment C-Q pattern) at the beginning of rising limb. On the contrary, the dominant of groundwater in the conduit flows results in the gradual increase of concentrations with the decrease in discharge (the dilution C-Q pattern) on the falling limb. At the later of rising limb, the ages of conduit flows indicated the strong hydrological connectivity between hillslope and depression (Zhang & Shao, 2018), which causes C-Q pattern convert from enrichment to dilution due to the entrance of hillslope flows with low concentrate. Hence, it can be deduced that affected by multiple sources and the variations in hydrological connectivity under different wetness conditions, the C-Q relationships of K<sup>+</sup> show an 'enrichment- dilution- dilution' pattern (Figure S2), which correspond with the 'N' dynamics of concentrations during the runoff event.

It is worth to note that the soil enriched solutes, for example,  $K^+$  or  $NO_3^-$  in this study are related to the anthropic actions (Lorette et al., 2022; Yang et al., 2020). Therefore, they are mainly concentrated in the soil and small fractures in the depression, but very low in the hillslope unit. However, some other soil-enriched solutes, for example, soluble carbon have significant high concentrations on hillslope in karst catchment (Liu et al., 2023), and they could have different C-Q behaviours under different wetness during the runoff event.

# 4.2 | Broader implications of C-Q relationships on agricultural management in the karst catchment

About one-third of global fertilizers is used in China for agriculture (Ju et al., 2009; Wang et al., 2020), and the relatively low efficiency of fertilizer use leads the risk of water quality deterioration, particularly in karst area of southwest of China, one of the most ecologically fragile regions in China (Tan et al., 2015). For example, fertilizer application is growing by 3.5% each year from 1996 to 2015 in Guizhou province, the centre of Yunnan-Guizhou Plateau of southwest China (one of the largest, continuous karst areas in the world). The mean utilization rate of fertilizer in Guizhou (587.98 kg/hm<sup>2</sup>) was 1.32 times that of China (446.12 kg/hm<sup>2</sup>). The intensive fertilizer application in agriculture in karst area increases the concentration of solutes in soil. Meanwhile, it leads potential nutrient losing and aquifer contamination under the rapid hydrological condition, especially during heavy rainfall events (Yue et al., 2020). The enrichment C-Q pattern of soil enriched solutes, for example, K<sup>+</sup>, could cause the solutes losing and aquifer contamination at the beginning of storm. Some of the pollutants from soils may absorbed by small fractures in the depression during runoff events due to the 'bidirectional exchange' between ground conduits and small fractures, as well as the diffuse infiltrations. During dry period, this source zone, as a 'hotspot' of contaminant, will release the water with high solute concentrations. According to observation by Puding Karst Ecohydrological Observation Station in China, the concentration of K<sup>+</sup> in well water is still in a high level during dry season, with the mean value of  $2.4 \pm 1 \text{ mg/L}$ . Which means the removal of dissolved solutes stored in the slow flow system will be a

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long process in karst aquifer in depression. Hence, in addition to reducing utilization rate of fertilizer, appropriate fertilizer should be selected to inhibit solute accumulation in soil. Avoidances of fertilization before storm and near to uncovered fractures or sinkholes are also a potential requirement of agricultural management in karst area.

## 5 | CONCLUSION

In this study, we explored the intra-event C-Q relationships of different solutes and its variations with the changes in hydrological connectivity in karst catchment, by integrating solute concentration, discharge and water age tracked by a calibrated karstic tracer-aided model in a 1.25 km<sup>2</sup> karst catchment in southwest China. Generally, geogenic solutes showed the dilution C-Q patterns during the runoff event, and the piecewise power-law formulations can describe the C-Q patterns on both rising and falling limb of hydrograph. Variations in hydrological connectivity between surface, hillslope and conduits leaded significant differences in the dilution C-Q patterns at different phrases of event, which revealed the changes in mobilization mechanisms during the runoff event. Both soil layer and small fractures in the depression were source zones of soil-enriched solutes. However, mobilizations of solutes in these two sources affected by hydrological connectivity could result in different C-Q patterns under different wetness conditions. As a result, there was a notable change in C-Q patterns from enrichment to dilution during the runoff event. In this study, we highlighted the effects of water ages in identifying the water sources and flow paths in the karst catchment. In addition, piecewise models could be needed to capture the variations in C-Q relationships during the runoff event. In future work, more and longer observations of chemistry of various end-member source water are needed for assessment and testing the hypothesises of solute transport in karst catchment. Assessing the influence of biogeochemical processes on C-Q relationship in streamflow is also requested.

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#### DATA AVAILABILITY STATEMENT

The data that support the findings of this study are available from the corresponding author upon reasonable request.

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## SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article.

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