

Study On The Driving Mechanism Of Hydrologic Drought In Karst Basin Based On Landform Index: A Case Study of Guizhou, China^{*}

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Abstract: In recent years, hydrological droughts in the Karst Basins have become more frequent and have caused serious ecological and environmental problems. This paper took the karst drainage basin of Guizhou, China as the study area to analyze the geomorphologic distribution and the temporal-spatial variations of hydrological droughts. The results indicated that ① the rainfall and its variation during drought periods had very limited impacts on the hydrological droughts in karst drainage basins; ② During 2000-2010, the hydrological droughts in Guizhou Province increased year by year, and the inter-annual variation of hydrological droughts in Guizhou had obvious stage characteristics. The overall regional distribution of hydrological drought severity in Guizhou is "severe in the south and light in the north, severe in the west and light in the east". ③ From the overall distribution of the landform types, the mountains, hills and basins have a certain impact on hydrologic droughts, but the impacts are insignificant. From the distribution of single landform types, the influences on hydrological droughts are particularly significant in high-medium mountains, deep-high hills and high basins, and where are also relatively light areas for hydrologic drought severity, While the relatively serious areas of that in the low mountains, shallow-low hills and low basins.

Keywords: Watershed Hydrological Drought; Geomorphologic Index; Landform Type; karst drainage basin

1. Introduction

In recent years, droughts have become more and more frequent, which, like large-scale disasters such as floods, earthquakes and volcanic eruptions, are natural disasters that threaten human life and property security (EU, 2006, 2007; Sheffield et al., 2011). The nature of droughts is the lack of water in the basins. The main source of basin recharge is atmospheric precipitation, followed by runoff recharge from the adjacent watershed (for the karst watershed). The amount of recharge in the catchments is greatly affected by rainfall, and the impact of basin topography on the primary distribution of precipitation should not be underestimated. In particular, the landform types and its morphological characteristics, the combination of landform types and spatial features are crucial to recharge / infiltration effect. Drought phenomenon is very complicated and has the characteristics of temporal and spatial distribution as well as being influenced by human activities. Therefore, it is difficult to define and study the drought simply (Van Loon et al., 2012). Therefore, the drought is usually divided into four types:

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35 meteorological drought, agricultural drought, hydrologic drought and socio-economic drought (Van Huijgevoort et
36 al.,2014; Van Lanen et al.,2013). Hydrologic drought is the continuation and development of meteorological
37 drought and agricultural drought. It is the final and most complete drought that is caused by the river runoff below
38 its normal level due to imbalance between precipitation and surface water or groundwater(Dracup et al.,1980;
39 Feng, 1993).

40 The present studies on hydrologic droughts, the theory of runs is firstly applied to make quantitative
41 expressions for the characteristics of hydrological droughts (Yevjevich, 1967), and study the characteristics of
42 extreme hydrological droughts following the extremity of independent and dependent orders in normality, log
43 normality, and γ distribution (Sen,1977,1990, and 1991; Guven,1983; Sharma,1998). Utilizing the different
44 drought indices like the Regional Drought Area Index (*RDAI*) of daily runoff series and Drought Potential Index
45 (*DPI*) are to analyze the characteristics of regional hydrological droughts (Fleig ,2011), and study the relationship
46 of double variables between the drought duration and intensity (Kim,2006;Panu,2009). Employing the
47 Standardized Runoff and Rainfall Indexes (*SRR*) are to study the influences of channel improvement and
48 nonlocal diversion on the process and level of hydrologic droughts (Wen, 2011). The level, process, and
49 recurrence interval of hydrologic droughts are studied by utilizing Palmer Drought Index (*PDI*), Soil Moisture
50 Model (*SMM*), Runoff Sequence (*RS*), Standardized Rainfall Index (*SRI*), and Vegetation Health Index (*VHI*),
51 respectively (Nyabeze,2004; Mondal,2015). Some scholars make a time series analysis and random simulation for
52 the hydrologic drought severity by using an autoregression model (Abebe, 2008), and make the Probabilistic
53 prediction of hydrologic drought by a conditional probability approach based on the meta-Gaussian model (Hao et
54 al.,2016), the seasonal forecasting of hydrologic droughts in the Limpopo Basin by a statistical analysis method,
55 respectively (Seibert et al.,2017). Rudd et al., (2017) was the first to use a national-scale gridded hydrologic
56 model to characterise droughts across Great Britain over the last century, and it was found that the model can very
57 well simulate low flows in many catchments across Great Britain. The threshold level method was also applied to
58 time series of monthly mean river flow and soil moisture to identify historic droughts (1891–2015), and it was
59 shown that the national-scale gridded output can be used to identify historic drought periods. Meantime, A small
60 number of scholars explore the spatial–temporal distribution differences between the characteristics of the
61 meteorological and hydrological droughts from the basin scale (Hisdal, 2003; Tallaksen, 2009). Among domestic
62 studies for hydrological droughts, the theory of runs is mainly applied to analyze the influence factors of runoff
63 volume in dry season and the identification of hydrological droughts (Feng,1997b), and study the probability
64 density and distribution functions of extreme hydrological drought duration (Feng, 1993,1994, and 1995). Using
65 the fractal theory is to study the temporal fractal characteristics of hydrologic droughts, and estimate the
66 hydrologic drought severity by the time fractal dimension (Feng, 1997a). Employing the Copula Joint Distribution
67 Function is to construct the joint distribution of hydrological drought characteristics (Zhou, 2011; Yan, 2007; Xu,
68 2010; Ma, 2010). However, most of the researches are still taking the different drought indices to make the
69 identification, characteristic analysis and prediction of hydrologic droughts, respectively. For example, Zhai et al.,
70 (2015) established a new hydrologic drought assessment index named Standard Water Resources Index (*SWRI*),
71 and developed a basic framework of hydrologic drought identification, assessment and characteristic analysis by
72 combining the distributed hydrologic model, Copula functions and statistical test methods. Zhao et al.,(2016)
73 selected the most suitable distribution from the logistic, normal, two-parameter log-normal, and Weibull

probability distributions to establish the Standardized Streamflow Drought Index (*SSDI*), classified the drought magnitudes of hydrologic drought events by the *SSDI*, and validated the applicability and rationality of the *SSDI* based on the actual drought situations in the Fenhe River Basin. Wu et al., (2016) constructed a Regional Hydrologic Droughts Index (*RHDI*) combined with the percentages of runoff and precipitation anomalies, obtained the frequency of corresponding drought grades, and then determined the threshold value of the different drought grades based on the cumulative frequency of the *RHDI*. Tu et al., (2016) constructed the Copula Model of two-variable joint distribution of hydrologic drought characteristics based on the test method of Cramer-von Mises Statistics associated with Rosenblatt transfer, and analyzed the hydrologic drought characteristics under a changing environment in Dongjiang River Basin. Based on the Variable Infiltration Capacity (*VIC*) model, Ren et al., (2016) quantitatively separated the effects of climate change and human activities on runoff reduction, and analyzed the spatial-temporal evolution characteristics of hydrologic droughts by the Standardized Runoff Index (*SRI*). Li et al., (2016) analyzed the evaluation characteristics of the meteorological and hydrological droughts by using Standard Precipitation Evapotranspiration Index (*SPEI*) and Streamflow Drought Drought Index (*SDI*), and discussed the response of hydrological droughts to meteorological droughts. He et al., (2015) analyzed the spatial-temporal characteristics of the meteorological and hydrologic droughts by Standardized Precipitation Index (*SPI*), Standardized Discharge Index (*SDI*) and associated indicators with the trend, time lag cross-correlation across the Yellow River Basin (YRB) during 1961-2010. Zhang et al., (2016) constructed the Copula prediction model of hydrologic droughts based on the Copula Function and Runoff Distribution Function by the Standard Runoff Index (*SRI*) according to the seasonal runoff-related characteristics, and made an empirical analysis for the hydrologic station of the Aksu River West Bride.

However, the present studies on the hydrologic droughts in Karst basins, except for some relevant research contents of this team (He et al., 2013, 2014, 2015, 2018; Li et al., 2017; Mei 2017), have not seen a more detailed study reporting. Thus, this paper is to take the Karst drainage basins in Guizhou Province of China as the study areas, make the identification and quantification for hydrologic droughts by utilizing the Runoff Drought Severity Index (*RDSI*) (Feng, 1997a & 1997b), and study the topographic features and hydrologic drought characteristics. And the driving mechanism of hydrological droughts in karst basins is further studied.

2. Study areas

Guizhou Province, located in southwest China, adjoins Hunan Province to the east, Guangxi Province to the south, Yunnan Province to the west and Sichuan Province and Chongqing Municipality to the north. Situated on the east slope of the Yunnan-Guizhou plateau, it occupies an area of 176, 167 km² enclosed by coordinate points of 24°37'N to 29°13'N, 103°36' E to 109°35'E (Fig. 1). The landscape in Guizhou is controlled deeply by the geological structures, and is mainly dominated by basins, hills and mountains with towering mountains, cutting strong, and significant elevation differences between valleys. Guizhou is an extremely developed karst province. Karst topography is complete and widely distributed with the total area of the carbonate rock outcrops account for 73%. Guizhou Province is located in the subtropical East Asia monsoon region, and the climate type belongs to China's subtropical humid monsoon climate. In most parts of the province, the climate is mild with no frost in winter and no heat in summer, four distinct seasons, abundant annual rainfall and uneven spatial and temporal

111 distribution, and average annual precipitation across the province in the 1100~1300 mm. With poor lighting
 112 conditions, lots of rainy days and high relative temperature, and 1200-1600 sunshine hours of every year in most
 113 part of the province. The rivers in Guizhou are densely covered with a total length of 1,1270 km, of which 93 are
 114 over 50 km in length. The Wumeng-MiaoLing Ridge watershed in Guizhou is a watershed, belonging to the
 115 Yangtze River and Pearl River basins, ie the northern part of the Yangtze River Of the Jinsha River system, the
 116 upper reaches of the Yangtze River mainstream system, the Wujiang River system and the Dongting Lake water
 117 system, and the south of the Pearl River Basin Nanpanjiang River system, Beipanjiang River, Hongshuihe and
 118 Duliuijiang river system.

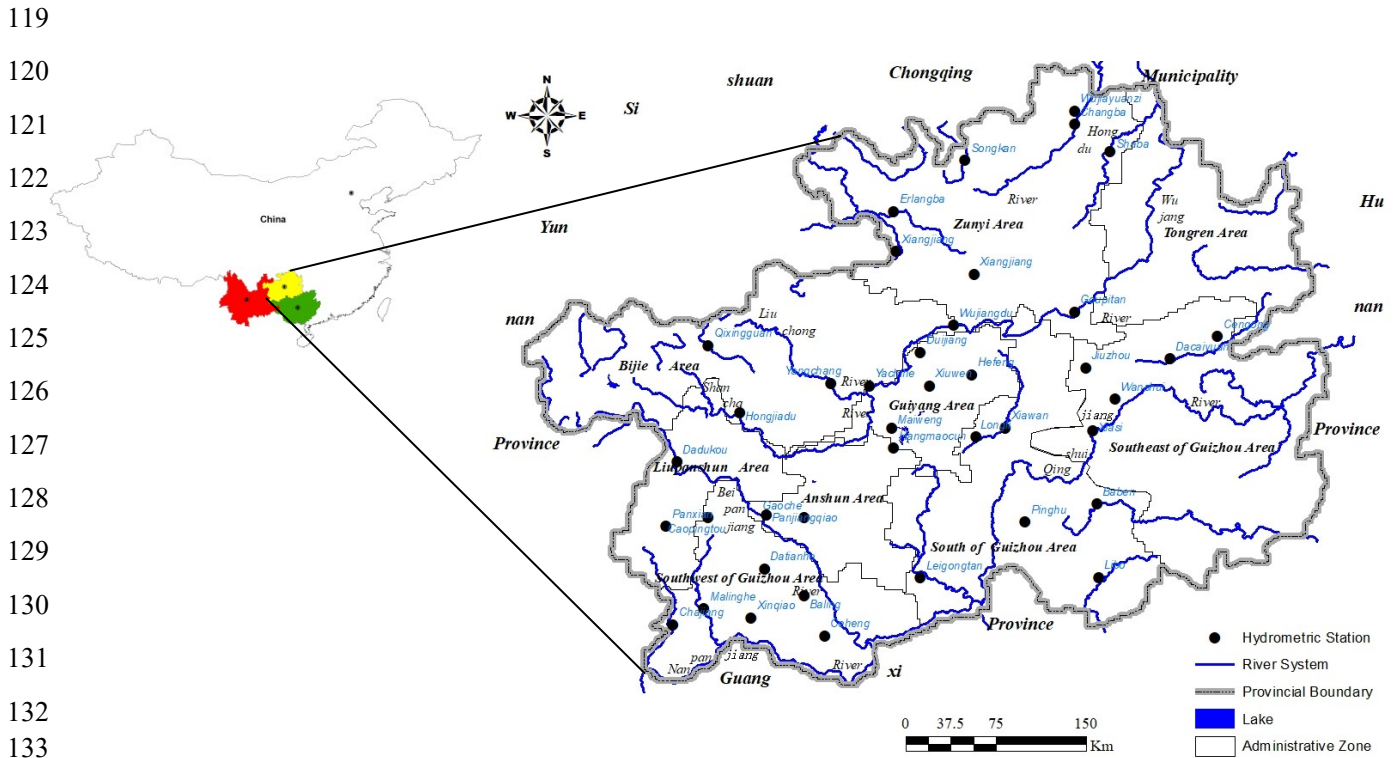


Fig.1 Sketch map of the study area

135 3. Data and methods

136 3.1 Study data

137 (1) Hydrological data

138 Considering the typicality and representativeness of hydrological data and the continuity and homogeneity of
 139 the hydrological data in this study area, this paper selected the monthly runoff and rainfall measurements of 40
 140 hydrometric stations in Guizhou Province (Fig. 1). Hydrological data were collected from "Guizhou Statistics on
 141 Mean Monthly Flows per Calendar Year" compiled by Guizhou hydrologic station, with reference to "Guizhou
 142 Water Resource Report" compiled by Guizhou Hydrology & Water Resources Department, and selected annual
 143 minimum monthly average runoff and the average monthly rainfall with the time range from January 2000 to
 144 December 2010 .

145 (2) Remote sensing data

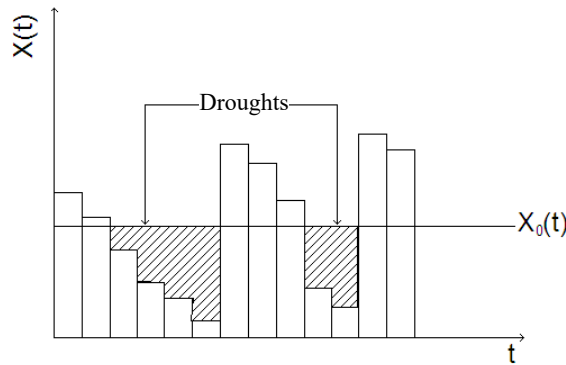
146 Taking into account the evolution of the geomorphology is a slow and long geological process, and the type

147 and shape of the topography in 2000-2010 remained basically unchanged. Therefore , this paper extracted the
 148 geomorphological information based on the LS5_TM images of the month corresponding to the minimum
 149 monthly mean runoff in 2006 (Time: January to December 2006; Strip Number & Line Number: 126~129,
 150 040~043; Data Format & Level: *.geotiff, L4).The Digital Elevation Model (DEM) is based on data provided by
 151 the United States Geological Survey (USGS) (Data Format: Grid; Coordinate System: WGS_84; Spatial
 152 Resolution: 30 m) .

153 3.2 Study methods

154 (1) Identification of hydrological drought

155 Hydrological drought is the phenomenon when the river flow is lower than its normal value. In other words,
 156 the river flow cannot satisfy the water supply demand in a certain period (Van Loon et al., 2012, 2015; Mishra,
 157 2010). The run theory (Herbst et al., 1996) was adopted to identify hydrologic drought (Fig.2). For a runoff time
 158 series $x(t)$, a significant drought period could be taken as $X(t) < X_0(t)$ after applying a truncation level $X_0(t)$. The
 159 length of negative runs $D(X(t) < X_0(t))$ is the duration of drought L. The total number of negative runs is the total
 160 deficit of water for the drought S. The intensity of negative runs is the magnitude of drought M, indicating the
 161 average water deficit volume of the drought period: $M=S/L$.



163
 164 **Fig. 2** Identification of hydrologic droughts

165 In this paper, hydrologic droughts in the karst drainage basins were identified by using the [Minimum](#)
 166 [Monthly Mean Flow \(MMM\)](#) of the period from 2000 to 2010 as truncation level. And taking the [Minimum](#)
 167 [Monthly Flow \(MMF\)](#) of sampling sites as Y axis and the series of sampling sites as X axis. Because of
 168 Hydrologic Drought Severity (HDS) mainly depends on the volume of water deficit and the length of drought
 169 duration, this paper took Relative Drought Severity Index ($RDSI$) (Feng et al., 1997b) as the measurement of HDS ,
 170 and the formula for calculating $RDSI$ was presented in the equation below:

$$171 \quad RDSI_{ij} = LD \times DI_{ij} \quad (1)$$

172 To eliminate the impact of units of measurement for the runoff, the following non-dimensionalization
 173 equation was adopted:

$$174 \quad DI_{ij} = \frac{X_{ij} - \bar{X}_j}{\bar{X}_j} \quad (2)$$

175 Where $RDSI_{ij}$ is the Relative Drought Severity Index of the i th year, j th research area
176 ($i=1,2,\dots,11;j=1,2,\dots,40$). LD is the relative drought duration within a year; (valued as 1/12 in this paper). DI_{ij}
177 is the relative water deficit of the i th year, j th research area. X_{ij} is the minimum monthly flow of the i th year, j th
178 research area. \bar{X}_j is the minimum monthly mean flow of the j th research area from 2000 to 2010. Viz., the
179 truncation level (threshold value).

180 $RDSI_{ij}$ is a negative value and the larger the absolute value is, the more severe the drought is.

181 (2) Landform index

182 This paper made some processes on the spectral radiance and apparent reflectance of remote sensing data
183 corresponding to the minimum monthly average runoff depth of the hydrological station in 2006, and extracted the
184 sample sites controlled by the hydrologic cross-section (He et al., 2012). The object-oriented classification
185 technology was been used to extract the Geomorphic Type Indicators (GTI) and Landform Index (LI) based on
186 the GTI and LI (Tab.1 and Tab.2) (MA et al., 2012), and referring to "Guizhou Geomorphology Map" (internal
187 data) compiled by Guizhou Normal University.

188 Tab. 1 Basic classification of landforms

1 st grade landforms	1 st grade classification. criteria Depth of dissection, surface D(m)	2 nd grade landforms	2 nd grade classification criteria Absolute altitude H(m)	3 rd grade landforms	3 rd grade classification criteria Depth of dissection, surface D(m)
Basin	$S < 9^\circ$ $D < 100$	Depression	Slope of basin bottom $< 5^\circ$ and area $< 1 \text{ km}^2$		
		Low	$H < 900$		
		Medium	$900 \leq H < 1900$		
		High	$1900 \leq H$		
Hill	$9^\circ \leq S < 14^\circ$	Low	$H < 900$	Shallow	$D < 200$
				Deep	$200 \leq D$
		Medium	$900 \leq H < 1900$	Shallow	$D < 200$
				Deep	$200 \leq D$
		High	$1900 \leq H$	Shallow	$D < 200$
				Deep	$200 \leq D$
Mountain	$14^\circ \leq S$	Low	$H < 900$		
				Low	$900 \leq H < 1400$
		Medium	$900 \leq H$	Mid	$1400 \leq H < 1900$
				High	$1900 \leq H$

189 Tab. 2 Indices for landform classification

Name	Formula	Range	Description
symmetry	$\frac{2\sqrt{\frac{1}{4}(\text{Var}X + \text{Var}Y)^2 + (\text{Var}XY)^2} - \text{Var}X\text{Var}Y}{\text{Var}X + \text{Var}Y}$	[0,1]	VarX: Variance in X direction VarY: variance in Y direction. Eigenvalue rises with symmetry $\sqrt{\#P_v}$: diameter of square object containing $\#P_v$ pixel.
Square fit index (or density index)	$\frac{\sqrt{\#P_v}}{1 + \sqrt{\text{Var}X + \text{Var}Y}}$	[0, a value determined by the shape of image object]	$\sqrt{\text{Var}X + \text{Var}Y}$: diameter of the ellipse P_v : image object V expressed in pixels The more the image object resembles a rectangle in shape the higher its characteristic value,
Rectangle fit index	$\frac{\#\{(x,y) \in P_v : \rho_v(x,y) \leq 1\}}{\#P_v} - 1$	[0,1]. 1: 100% fit, 0: 0% of pixels fit into the rectangle	$\rho_v(x,y)$: rectangular distance at a pixel (x,y).

Ellipse index	fit	$2 \cdot \frac{\#\{(x,y) \in P_v : \varepsilon_v(x,y) \leq 1\}}{\#P_v} - 1$	$[0, 1]$, 1: 100% fit, 0: $\leq 50\%$ of pixels fit into the ellipse.	$\varepsilon_v(x,y)$: ellipse distance at a pixel (x,y). P_v : image object V expressed in pixels $\#P_v$: image object V expressed in pixels
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Note: Definiens Developer7 Reference Book was consulted for this index

4. Results and analysis

4.1. Geomorphic distribution characteristics of Karst basins

4.1.1 Distribution characteristics of geomorphic types

The overall landscape of Guizhou is dominated by mountains, followed by hills and basins. And these mountains were mostly dominated by low-medium and mid-medium mountains with the total area of the province accounting for 27.37% and 16.94%, respectively, followed by low mountains (10.96%) and high-medium mountains (4.93%). Hills are dominated by low hills with an area of 22.06%, followed by mid-hills (9%) and high hills (3.09%). Basins were mostly low basins (4.86%), followed by medium basins (0.51%), high basins (0.25%) and a few depressions (0.012%). Guizhou is a mountainous province with mountainous areas all over the province, while only a few areas are less widely distributed, such as Liupanshui and Anshun areas, but a large proportion of hilly areas are distributed in Guizhou, and mountains and hills in Guizhou show a "symmetrical" distribution. Hilly landforms in the province are distributed, but presented "trough" in the Southwest area, "broken" phenomenon in Zunyi. Basins are less distributed in the whole province, and presented "broken" phenomenon in the parts of southwest area, Liupanshui, Anshun and Zunyi (Fig. 3a).

4.1.2 Characteristics of topographic relief degrees

In Guizhou, the spatial distribution of the Topographic Relief Degrees (*TRD*) of mountains is basically consistent with that of the hills, and the peak *TRD* of mountains presents in Dadukou, Shuicheng (relative relief 1898m), Panxian (relative relief 1885 m) and Chajiang, Xinyi (relative relief 1842 m). While the maximum of relative relief of hills presents in Maiweng, Pingba (1518 m), and Hefeng, Kaiyang (896.4 m) and Xiawan, Guidiing (870.28 m) (Fig. 3b).

4.1.3 Distribution characteristics of landforms

From the analyses of the symmetry of topographic distribution, the symmetry indices of the three types of landforms all fluctuate around 0.6, indicating that there is a certain degree of "symmetry" in the mountain landform, hilly landform and basin topography (Figure 3c), and the symmetry index of mountain topography fluctuate within 0.4 ~ 0.8, the hills fluctuate within 0.2 ~ 0.9, and the basins fluctuate within 0.4 ~ 1. The square fitting index (density index) of the mountains, hills and basins all fluctuate around 1.5, indicating the "squareness" distribution of the topography of the mountains, hills and basins. In general, the hilly square fitting index (density index) is greater than the mountain, indicating that the hilly landform morphology is closer to "square" than the mountain topography (Fig 3d). The rectangle fitting index of hilly landform is generally greater than that of mountainous area, and the rectangle fitting index of mountain topography fluctuates within 0.4 ~ 0.7 (Fig. 3e). Similarly, the elliptic fitting index of the hilly landform is generally greater than that of the mountainous area. The

elliptic fitted index of the hilly and basin fluctuates greatly, ie., varies from 0 to 0.6 and from 0 to 0.7, respectively, and the "broken" phenomenon occurs in some areas (Fig.3f) .

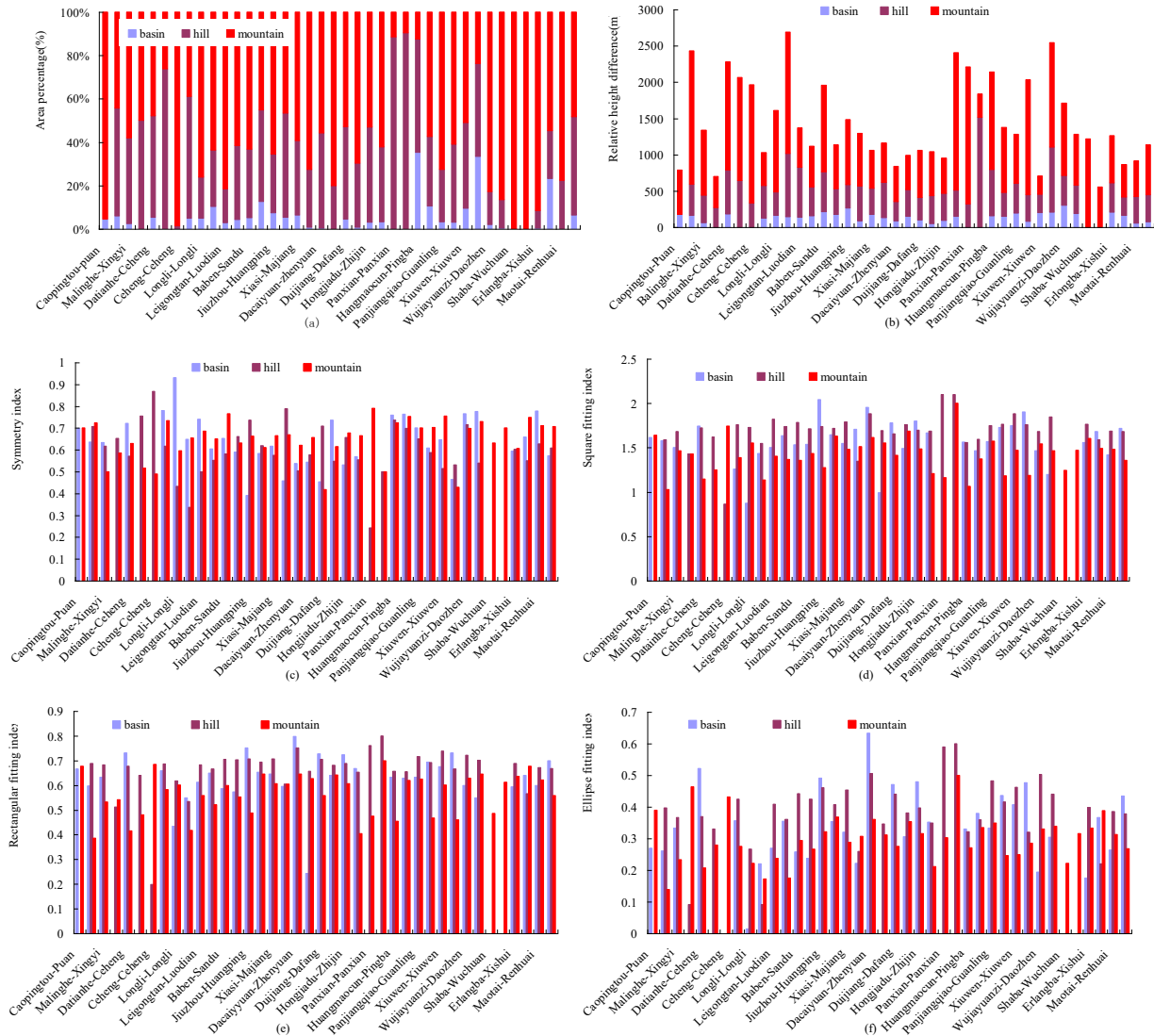


Fig.3 The overall distribution of landform types

4.2. Hydrologic drought characteristics in Karst basins

4.2.1 Inter-annual variation characteristics of hydrological drought

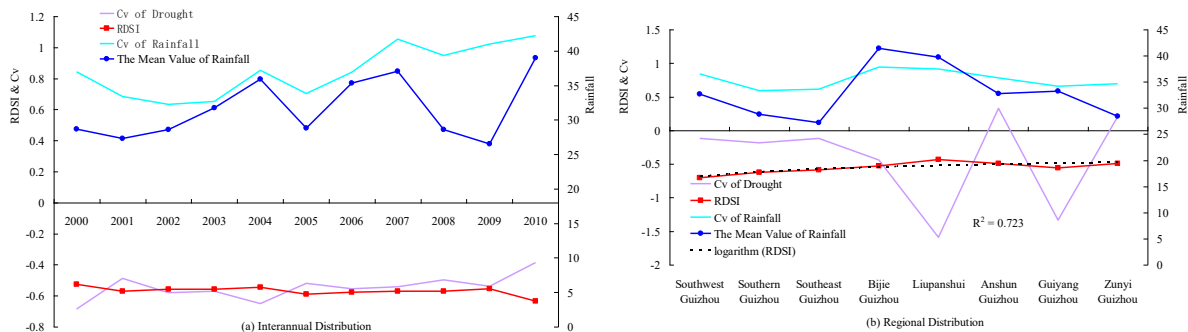
During 2000-2010, the hydrological droughts in Guizhou Province increased year by year, most notably in 2010 ($RDSI = -0.634$), followed by 2005 ($RDSI = -0.591$) and 2009 ($RDSI = -0.555$), the lighter was in 2000 ($RDSI = -0.528$). From 2000 to 2010, the inter-annual variation of hydrological droughts in Guizhou had obvious stage characteristics, which could be generally divided into "three stages and four periods", that was, the first transitional period from 2000 to 2001 (relative annual rate was 10.13%), 2004-2005 as the second transitional phase (annual relative variability of 11.09%), 2009-2010 for the third transitional phase (annual relative variability of 18.76%), and 2000 for the first period of drought, 2004 for the second period of drought, 2005-2009 for the third period of drought, 2010 for the fourth period of drought (Fig.4a).

During 2000-2010, the coefficient of variation (C_v) of hydrological droughts in Guizhou showed obvious

inter-annual variability, showing a tendency of decreasing year by year. The inter-annual variation of hydrological droughts occurred most frequently in 2000 ($C_v=-0.685$) and in 2004 ($C_v=-0.65$), with relatively small inter-annual variations in 2010 ($C_v=-0.385$) and 2001 ($C_v=-0.487$). The inter-annual differences of the C_v values of regional hydrological droughts was significant with annual relative variability as high as 66.11% (2000-2001), followed by 2009-2010 (relative annual rate of 51.04%), 2004-2005 (rate of 30.94%). The $RDSI$ of hydrological droughts was opposite to the C_v of hydrological droughts, that was, the greater the $RDSI$ value of hydrological droughts, the smaller the C_v value of hydrological droughts (2010). On the contrary, the smaller the $RDSI$ value of hydrological droughts was, the greater the C_v value of hydrological droughts (2000) was. The inter-annual variation trends of the $RDSI$ and C_v values of hydrological droughts was the opposite (Fig.4a).

4.2.2 Spatial distribution of hydrologic drought

The overall regional distribution of hydrological drought severity in Guizhou is "severe in the south and light in the north, severe in the west and light in the east" (Fig. 4b). The most severe areas of hydrological drought appeared in the "Southwest Guizhou Province", and the relatively light areas of that in the "Zunyi Area". The regional variation of C_v values of hydrological droughts is divided into two sections, that is, the first half is "curved- type" and the second half is "W-shaped ", which shows the regional variation of C_v values is small in the southern part of Guizhou, and large in the other areas. For example, the C_v value of hydrological drought in Liupanshui reaches a maximum value ($C_v=-1.595$), and the C_v value of hydrological drought in Zunyi reaches a minimum ($C_v=0.207$).The Northeast Southwest Distribution (Fig. 4c): hydrological drought severities "gradually increased", and showed a small "wave-type" distribution. The regional variation of C_v values is greatly, and shows "N-type" distribution. The Northwest Southeast Distribution (Fig. 4d), North-South Distribution (Fig.4e) and Western Distribution (Fig.4f): the $RDSI$ values of hydrological droughts in Karst basins are both greater than -0.44.The hydrologic drought severities gradually increase, showing a "linear" distribution with linear fitting indices $R^2=0.995$, $R^2=0.9978$ and $R^2=0.3794$, respectively. The C_v values of regional hydrological droughts vary greatly, showing a "V-shaped" distribution. The Southern Distribution (Fig.4g): the hydrological drought severities in Karst basins were "gradually reduced" with a "linear" distribution ($R^2=0.9633$), and the regional variation of C_v values of hydrologic droughts is small.



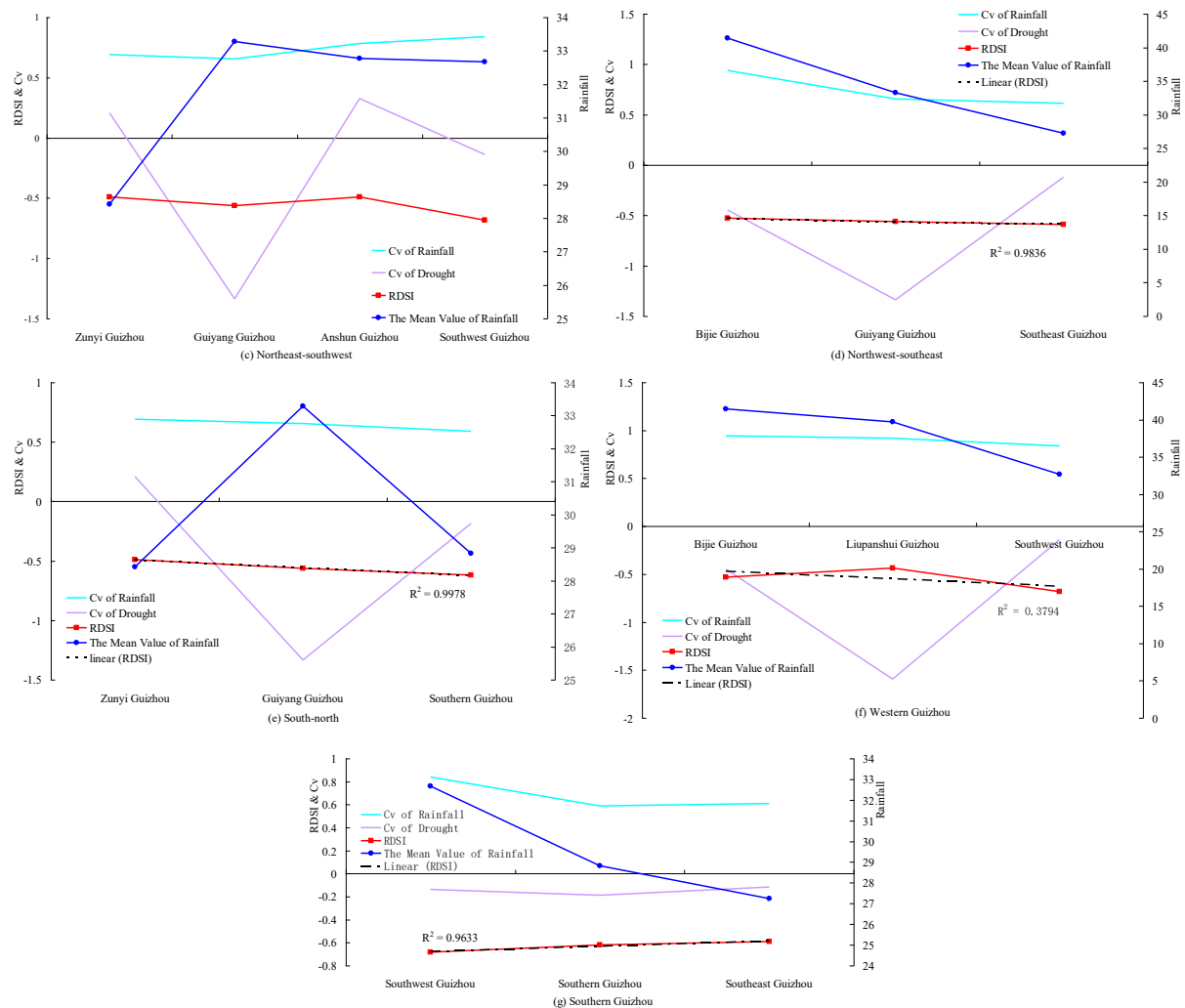


Fig.4 The spatial and temporal distribution of hydrological droughts and impacts of rainfall factors

4.3. Driving mechanism of hydrologic drought in Karst Basins

4.3.1 Driving mechanism of rainfall factors to hydrologic drought

(1) Inter-annual changes driven by rainfall factors

Watershed hydrological drought refers to the phenomenon of shortage of water due to different basin underlying factors when rainfall is low (or constant). Feng (et al.,1997a) Pointed out that the runoff in the dry season mainly comes from the amount of water retained in the catchment at the end of the flood season, and the amount of rainfall in the dry season, with the former accounting for a large proportion. The flood storage at the end of the flood season is mainly determined by the flood season precipitation and catchment factors, and the latter represents a significant proportion. As can be seen from Fig.4a, the mean value of rainfall in the driest month was "increasing year by year" from 2000 to 2010, while the hydrological drought severity in Karst basins was "serious year by year", which indicates that rainfall during drought periods has little effect on hydrological drought with the correlation coefficient $R=-0.468$, and significant probability $P=0.147$. In 2010, the average rainfall of the driest month was 38.949 mm with the $RDSI=-0.634$, and 28.651 mm with the $RDSI=-0.528$ in 2000. The difference of average rainfall of the driest month in 2001-2004 and 2005-2009 was very big, but that of drought degree was very small. In 2000-2010, the inter-annual variability of C_v values of the average rainfall in

the driest month was great, and showed an "increasing" trend (Fig.4a), while that of C_v values of hydrologic droughts was relatively small, and showed an "decreasing" trend, which indicates that the change of rainfall in the driest month has little effect on the hydrologic drought severity with the $R=0.323$, $P=0.332$. Similarly, the C_v value of the average rainfall in the driest month was 1.075, the drought index $C_v=-0.385$ in 2010, and the average rainfall $C_v=0.843$, the drought index $C_v=-0.685$ in 2000. Similarly, the C_v value of the average rainfall in the driest month was 1.075, the drought index $C_v=-0.385$ in 2010, and the average rainfall $C_v=0.843$, the drought index $C_v=-0.685$ in 2000. From 2005 to 2008, the great was the Inter-annual variability of C_v values of the average rainfall in driest month, the small that of C_v values of hydrologic drought severities.

(2) Regional changes driven by rainfall factors

In Guizhou Province, the spatial distribution of the mean rainfall in the driest month changed greatly, with a "hump type" (Fig.4b). The spatial distribution of the $RDSIs$ has little change and has a "logarithmic" distribution with a logarithmic fitting index of $R^2=0.723$. This indicates that the spatial distribution of rainfall in the driest month has little effect on that of the $RDSIs$, and Pearson correlation coefficient $R=0.4$, the significant probability $P=0.326$. The C_v of rainfall has little effect on the C_v of hydrological droughts ($R=-0.27$, $P=0.518$). *The Northeast Southwest Distribution* (Fig.4c) and *North-South Distribution* (Fig.4e): the spatial distribution of rainfall in the driest month changes a lot and appears "single peak". The rainfall had little effect on the watershed hydrological droughts. The correlation coefficient and significance were $R=-0.454$, $P=0.546$, and $R=-0.122$, $P=0.922$, respectively. The space change of the C_v of rainfall is small, which has a small influence on the C_v of hydrological droughts. The correlation coefficient and significance were $R=-0.55$, $P=0.45$, and $R=0.87$, $P=0.945$, respectively. *The Western Distribution* (Fig.4f): The spatial variation of rainfall is small and shows a "decreasing" trend. The rainfall has no significant effect on hydrological droughts ($R=0.841$, $P=0.364$). There is no linear correlation between the C_v of rainfall and the C_v of hydrological droughts ($R=-0.478$, $P=0.683$). *The Northwest southeast distribution* (Fig.4d) and *southern distribution* (Fig.4g): The rainfall drops drastically, and has a significant impact on hydrological droughts, the correlation coefficient and significance were $R=0.998$, $P=0.041$, and $R=-0.999$, $P=0.028$, respectively. However, the C_v of rainfall has no significant effect on the C_v of hydrological droughts, and the correlation coefficient and significance were $R=0.135$, $P=0.913$, and $R=0.302$, $P=0.805$, respectively.

4.3.2 Driving mechanism of landforms characteristics to hydrologic drought

(1) The driven by landform types

During the drought period, there is no rainfall or little rainfall in the karst catchments, which could not solve the drought problem. The runoff recharge mainly comes from the rainfall at the end of the flood season, and the recharge in the adjacent catchment (the non-closed catchment). Therefore, the topography type plays an important role in rainfall recharge. Different types of landforms, such as landforms, topographic relief degrees (Ma et al., 2012) and surface cutting depths of them are quite different, greatly influence on the horizontal flow on the surface and vertical flow under the ground of the rainfall, affect the rainfall recharge to the basin, and which relate

to the occurrence of watershed hydrological droughts. From the overall geomorphologic types of Guizhou, the area distributions of mountains, hills and basins are related to *RDSI*. The correlation coefficients are $R_{(mountain)}=-0.399$, $R_{(hill)}=-0.212$ and $R_{(basin)}=0.209$, respectively. Except basins, Hills and mountains do not pass the significance test of 0.05. From the correlation between single landform types and *RDSI* (Fig. 5a), the correlation could be divided into three sections. They are the basin section, showing "*N type*" and hilly section, showing "*bimodal type*" and mountainous section, showing "*growth type*". In the basin section, the smallest is the correlation between low-lying basins and *RDSIs* ($R=-0.291$, $P=0.069$), the highest in the high basins ($R=0.478$, $P=0.002$). In the hilly section, the smallest is the correlation between shallow low hills and *RDSIs* ($R=-0.241$, $P=0.134$), the highest in the deep high hills ($R=0.523$, $P=0.001$), followed by deep-medium hills ($R=0.177$, $P=0.273$). In the mountainous section, the highest is the correlation between high-medium mountains and *RDSIs* ($R=0.414$, $P=0.008$), the smallest in the low mountains ($R=-0.073$, $P=0.653$). The *RDSI* value of hydrological droughts is negative. That is, the greater the negative, the more severe the hydrological drought severity. Therefore, the correlation coefficients (*Rs*) of the landform types and *RDSIs* are larger, the more significant the influences of the landform types on the hydrological droughts are, and the lighter the hydrological droughts are. On the contrary, the greater the negative *Rs* between the landform types and the *RDSIs*, the more significant the influences of topography on hydrological droughts are, and the more serious the hydrological droughts are. In summary, the correlation coefficients (*Rs*) of high-medium mountains, deep-high hills and high basins are all greater than 0 and through the significance test of 0.01, which indicates that it is the relatively lightly areas of hydrologic droughts in the high-medium mountains, deep-high hills and high basins, while the relatively serious areas in low basins, shallow-low hills and low mountains with the negative *Rs*. With the elevation increasing, the *Rs* between landform types and *RDSIs* change from negative to positive and then increase in the basins, hills and mountains, which indicates that it is getting lighter for the watershed hydrological droughts with the altitude increasing. This could be that the high altitude area has low erosion basis and shallow groundwater, while the low altitude area would have the opposite situations.

(2) The driven by landform dissection depths

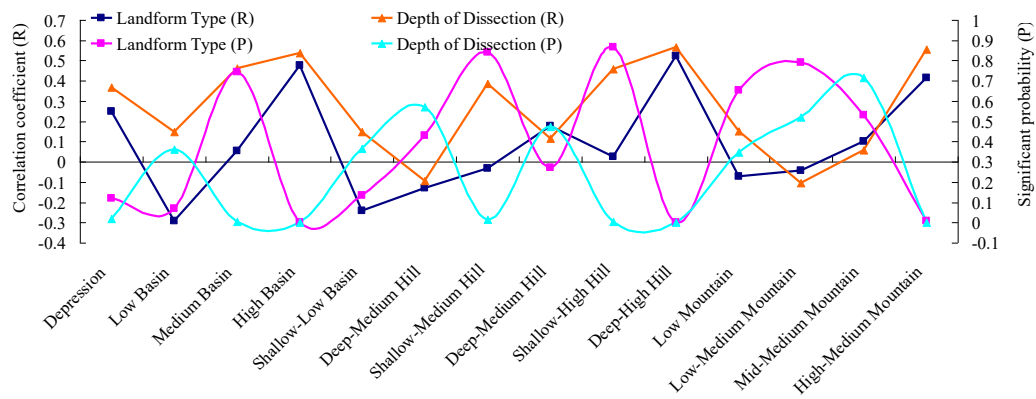
Affect the lateral velocity of surface water produced by rainfall, in addition to landform types, its relief amplitude or the depth of dissection could not be underestimated. The deeper the surface-cutted depth, the greater the surface fluctuation (correlation coefficient $R_{basin \& basin}=0.842$, $R_{hill \& hill}=0.982$ and $R_{mountain \& mountain}=0.362$), and the longer the confluence of rainfall on the surface, the more rainfall infiltration, so the lighter the hydrological drought severity occurs. As shown in Fig. 5a, the correlation between surface cutting depth and *RDSI* could be divided into three sections, that is, the basin section is "*V-shaped*" and the hilly section is "*W-type*" and the mountain section is "*V-type*".

Similarly, the impacts of the surface-cutted depths in high basins, deep-high hills and high-medium mountains on hydrologic droughts are the largest with the correlation and significance of $R=0.536$ and $P=0.0$, $R=0.568$ and $P=0.0$, $R=0.557$ and $P=0.0$, respectively. while those of low basins, deep-low hills and low-medium mountains are the smallest with the $R=0.148$ and $P=0.361$, $R=-0.092$ and $P=0.572$, $R=-0.104$ and $P=0.522$,

358 respectively. This indicates that the relatively light areas for hydrologic drought severity in the high basins,
 359 deep-high hills and high-medium mountains, and the relatively serious areas in low basins, deep-low hills and
 360 low-medium mountains, which could be because that deeper dissection provides more time for the rainfall to form
 361 surface flows and increases the volume of infiltration. The R between $RDSI$ and surface-cutted depth from
 362 depression to high-medium mountain is generally "increasing", which shows that the hydrologic drought severity
 363 in Karst basins is a getting lighter trend from depression to high-medium mountain.

364 (3) The driven by landform characteristics

365 Another important characteristic value of geomorphology types is morphological index, such as symmetry
 366 index, square fitting index (density index), rectangle fitting index and ellipse fitting index, which reflect the
 367 morphological characteristics and shape complexities of landform types from a different point of view, and also
 368 reflect the closure degree of the surface-groundwater system. Fig.5b is the correlation between morphological
 369 index and $RDSIs$, similarly divided into three sections. That is, a " V type" for the symmetry index, square fitting
 370 index and rectangular fitting index, a " N type" for the ellipse fitting index in basin sections, and a " U -shaped" for
 371 the symmetry index, square fitting index and rectangular fitting index, a " W -type" for the ellipse fitting index in
 372 hilly sections, and a " V -shaped" for the four kinds of morphological index in mountain sections. The R s between
 373 four kinds of morphological indices of the high basins, deep-high hills and high-medium mountains and the $RDSIs$
 374 are greater than 0, and $P=0.0$, which indicates that it has a significant impact on hydrological droughts, and is also
 375 a relatively light area for hydrologic drought severity in the high basins, deep-high hills and high-medium
 376 mountains. The R s between four kinds of morphological indices of the mid-medium mountains and the $RDSIs$ are
 377 the minimum, which shows that the shape distribution of mid-medium mountains has no obvious or no influence
 378 on the watershed hydrological droughts. From depressions to high mountains, the R s between the four
 379 morphological indices and $RDSIs$ are positive (except the low-medium mountain by ellipse fit index). Especially
 380 from depression to deep-high hills, the R s between of them are the relatively large, which indicates that the
 381 morphological distribution of landform types has different impact on watershed hydrologic droughts. It could be
 382 that the larger the morphological index of morphological types, the more regular the shape distribution of the
 383 landscape, and the simpler the edge distribution of landform types, the less outflow of water out of the basin, and
 384 the smaller the probability of watershed hydrological drought occurs.



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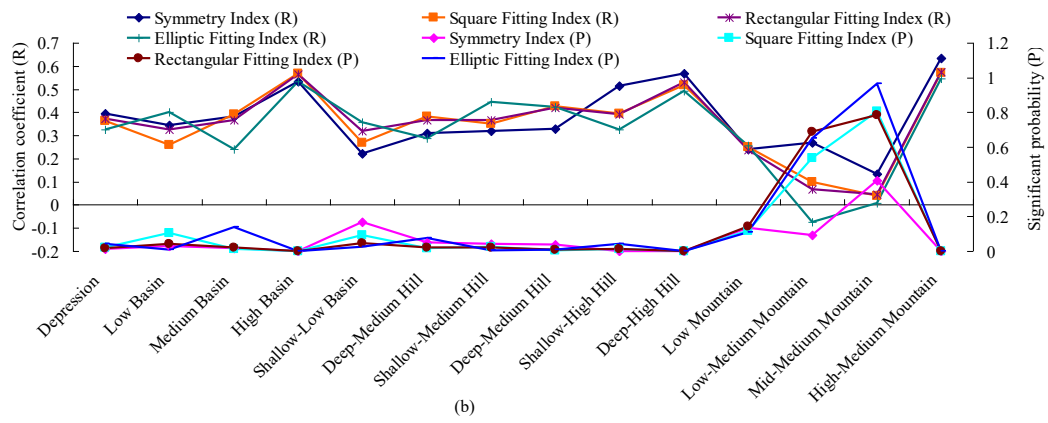


Fig.5 The correlation coefficients between landform types and hydrological droughts

4.3.3 Driving mechanism of hydrologic drought variability

(1) The inter-annual variability driven of hydrologic drought

Hydrological drought is the continuation and development of meteorological drought and agricultural drought. It is the final and most complete drought. However, once hydrological drought has occurred, it indicates that ① the deficiency of rainfall has reached an abnormal level; ② the catchment has a water deficit and a lower groundwater table; ③ irrigation is no longer possible (Geng et al., 1992). Once the hydrological drought occurs, it will be a devastating damage to the ecological environment of Karst basins. The result shows that the soil water content or soil water holding capacity drops sharply, even reaches the level of withering coefficient, which makes it difficult to supplement plant physiological water demand, resulting in the drying up and death of large areas of crops and vegetation. In addition to that, the vegetation coverage will drop, making the soils and rocks of the catchment become naked and scorched and thereby producing a lot of sands and dusts that may aggravate the greenhouse effect. Water storage medium is seriously damaged, thus affecting the basin's water storage capacity, which is an important factor that led to the hydrological drought in the coming year. Making pairwise correlation analysis on the *RDSIs* of 2000-2010 showed that each correlation coefficient was above 0.501, each significance probability was below 0.001, which indicates that the inter-annual affect each other of hydrologic droughts during 2000-2010 was particularly significant.

(2) The regional variability driven of hydrologic drought

The Karst drainage basin is a binary three-dimensional space structure with the binary media and dual water systems. According to the closed degree of surface water system and groundwater system, YANG (1982) classified karst basins into the Surplus Basin, Balanced river Basin and Deficit Basin. On the one hand, in karst basins, the basin water storage in the dry season is the main source of basin runoff recharge. Therefore, the strong / weak of basin water storage capacity affects the amount of runoff during the dry season, which is directly related to the occurrence of hydrological droughts. On the other hand, the water storage capacity of karst basins is greatly influenced by the basin storage medium and its water system. The water storage medium affects the type of water storage space, the size of water storage space and the numbers of water storage space, which will affect the amount of basin water storage. Water system is the channel of energy flow and information flow, which is the reflection of secondary distribution of rainfall on the surface and is the key factor of water balance in the basins.

416 In the karst areas, the rainfall during the dry period has little effect on the surface runoff. The runoff recharges
417 mainly come from the water storage in the basin or the water storage in the adjacent basin. Therefore, it is
418 significant for the mutual influence of hydrologic droughts in the Adjacent drainage basins, for example, in the
419 Bijie area & Guiyang City ($R=0.832$, $P=0.01$), Bijie area & Anshun area ($R=0.816$, $P=0.014$), and Anshun area &
420 Guiyang city ($R=0.753$, $P=0.031$). However, they may belong to neighboring areas from the administrative
421 divisions, which could be that the surface water system and the groundwater system are not closed, resulting in the
422 exchange of groundwater. If there is no exchange of groundwater or has not been lost of surface water,
423 hydrologic droughts will have little or no influence on each other even in the adjacent areas, such as Qianxinan
424 area & Anshun area ($R=-0.199$, $P=0.637$).

425 5. Conclusions

426 Based on the TM images and DEM data, This paper extracted the landform types, the morphological indices
427 of geomorphology types, the topographic relief degrees and so on by the use of the object-oriented classification
428 technique, and systematically analyzed the distribution of geomorphology types in Guizhou, the temporal and
429 spatial distribution of hydrological droughts in Karst basins, and the correlation between the rainfall during dry
430 periods, geomorphology types and the hydrological droughts in the basins. The results show that:

431 (1) During 2000-2010, the hydrological droughts in Guizhou Province increased year by year, most notably
432 in 2010 ($RDSI=-0.634$), which was in line with the southwestern drought in 2010. The inter-annual variation of
433 hydrological droughts had obvious stage characteristics, which could be generally divided into "three stages and
434 four periods", that was, the first transitional period from 2000 to 2001 (relative annual rate of change was
435 10.126%), the second transitional period from 2004 to 2005 (relative annual rate of 11.01%), and the third
436 transitional period from 2009 to 2010 (relative annual rate of 18.76%). 2000 was the first drought period,
437 2001-2004 was the second drought period, the third period of drought in 2005-2009 and the fourth period of
438 drought in 2010. The overall regional distribution of hydrological drought severity in Guizhou was "*severe in the*
439 *south and light in the north, severe in the west and light in the east*". The most severe areas for hydrological
440 drought severity appeared in the "*Southwest Guizhou Province*", and the relatively light areas for that in the
441 "*Zunyi Area*".

442 (2) The rainfall during drought periods has little effect on hydrological drought. For example, the mean value
443 of rainfall in the driest month was "increasing year by year" from 2000 to 2010, while the severity of hydrological
444 droughts in Karst basins was "serious year by year". The change of rainfall in the driest month has little effect on
445 the severity of hydrologic droughts. For example, in 2000-2010, the inter-annual variability of C_v values of the
446 average rainfall in the driest month was great, and showed an "increasing" trend, while that of C_v values of
447 hydrologic droughts was relatively small, and showed an "decreasing" trend. The spatial distribution of rainfall in
448 the driest month has little effect on that of the $RDSIs$. For example, the spatial distribution of the mean rainfall of
449 the driest month in Guizhou Province showed a great change with a "hump type" distribution. The spatial
450 distribution of the $RDSIs$ showed a small change with a "logarithmic" distribution.

451 (3) During the dry period, it is significant for the mutual influence of hydrologic droughts in the Adjacent
452 drainage basins, for example, in the Bijie area & Guiyang City ($R=0.832$, $P=0.01$), Bijie area & Anshun area
453 ($R=0.816$, $P=0.014$), and Anshun area & Guiyang city ($R=0.753$, $P=0.031$). This may be that the rainfall during
454 the dry period has little effect on the surface runoff in the karst areas, and the runoff recharges mainly come from
455 the water storage in the basin or the water storage in the adjacent basins. At the same time, the inter-annual affect
456 each other of hydrologic droughts during 2000-2010 was particularly significant.

457 (4) From the overall geomorphologic types of Guizhou, the area distributions of mountains, hills and basins
458 have certain influence on the hydrological droughts in Karst basins, but the effect is not significant. From the
459 distributions of single landform types, the influence of high-medium mountains, deep-high hills and high basins
460 on hydrological droughts is especially significant. And it is relatively light area for hydrologic droughts in the
461 high-medium mountains, deep-high hills and high basins, and is relatively serious area in low basins, shallow-low
462 hills and low mountains. This indicates that the hydrological droughts in Karst basins are the more and more light
463 with the altitude increasing. The correlations between depth of dissection and *RDSI* from depression to
464 high-medium mountain are generally "increasing", which indicates that the hydrologic droughts in the basins
465 show a tendency of "getting lighter and lighter". There are significant impacts on the hydrological droughts for the
466 landforms distribution of high basins, deep-high hills and high-medium mountains, and where are also relatively
467 light distribution areas of hydrologic drought severity. From depressions to high mountains, the correlation
468 coefficients (*Rs*) between the four morphological indices and *RDSIs* are positive (except the low-medium
469 mountain by ellipse fit index), and the relatively large for the *Rs* especially from depression to deep-high hills,
470 which indicates that the morphological distribution of landform types has different impact on hydrologic droughts
471 in Karst basins. This could be that the larger the morphological index of morphological types, the more regular the
472 shape distribution of the landscape, and the simpler the edge distribution of landform types, the less outflow of
473 water out of the basin, and the smaller the probability of hydrological droughts in Karst basins occurs.

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References

- Abebe A., Foerch G.,2008.Stochastic simulation of the severity of hydrological drought. *Water and Environment Journal*,22 (1):2-10.<https://doi.org/10.1111/j.1747-6593.2007.00080.x>.
- Dracup A, Lee K S, Paulson J E G.1980. On the definition of droughts . *Water Resources Management*, 16(2):297-302. <https://doi.org/10.1029/WR016i002p00297>.
- EU:2006.Water Scarcity and Droughts-Second Interim Report,European Commission,DG Environment,Brussels.
- EU:2007. Addressing the challenge of water scarcity and droughts in the European Union, Communication from the commission to the European Parlement and the Council, European Commission,DG Environment,Brussels.
- Feng G. Z., 1993.An analysis of frequency of critical drought duration in independent hydrologic sesies. *Agricultural Research in the Arid Areas*,11(3): 60-68.
- Feng P., and Wang R.,1997a. Investigation on the Time Fractal of Hydrologic Drought. *Water conservancy and Hydropower Technology*, (11):48-51.
- Feng P., and Jia H.,1997b. Inverstigation on forecastiong model of hydrological drought in water supply systems. *Journal of Tianjin University*, 30(3): 337-342.
- Feng G.,1995. An analysis frequency of critical hydrologic drought duration.SHUILI XUEBAO, (6):37-41.
- Feng G.,1994. A STUDY ON PROBABILITY DISTRIBUTION OF CRITICAL HYDROLOGEIC DROUGHT DURATIONS USING THE METHODS OF ANALYTICS AND SIMULATION. *ACTA GEOGRAPHICA SINICA*,49(5):457-468
- Fleig A. K., Tallaksen L. M., Hisdal H.,2011. Regional hydrological drought in north-western Europe: linking a new Regional Drought Area Index with weather types. *Hydrological Processes*, 25:1163-1179.<https://doi.org/10.1002/hyp.7644>.
- Guven O.,1983. A simplified semiempirical approach to probabilities of extreme hydrologic droughts. *Water Resource Research*,19(2):441-453. <https://doi.org/10.1029/WR019i002p00441>.
- Geng H.J.,Shen B.C.,1992.Definition and Significance of Hydrologic Droughts.*Aricultural Research in the Arid Areas*,10(4):91-94.
- Hao Z.,Hao F.,Singh V.,etc.,2016.Probabilistic prediction of hydrologic drought using a conditional probability approach based on the meta-Gaussian model.*Journal of Hydrology*,542:772-780. <https://doi.org/10.1016/j.jhydrol.2016.09.048>.
- Hisdal H., Tallaksen L. M.,2003.Estimation of regional meteorological and hydrological drought characteri-stics: a case study for Denmark. *Journal of Hydrology*,281(3):230-247. [https://doi.org/10.1016/S0022-1694\(03\)00233-6](https://doi.org/10.1016/S0022-1694(03)00233-6)
- Herbst P. H., Bredenkamp D. B., Barker H. M. G.,1996.A technique for the evaluation of drought rainfall data. *Journal of Hydrology*, 4(4):264-272.
- He, Z.H., Liang, H., Yang, C.H., etc., 2018.Temporal – spatial evolution of the hydrologic drought characteristics of the karst drainage basins in South China. *International Journal of Applied Earth Observation and Geoinformation*, 64:22-30. <http://dx.doi.org/10.1016/j.jag.2017.08.010>
- He, Z.H., Liang, H., Yang, C.H., etc., 2018. Water System Characteristics of Karst River Basins in South China and Their Driving Mechanisms of Hydrological Drought. *Nat Hazards*,Published online:19 March 2018. <https://doi.org/10.1007/s11069-018-3275-2>
- He Z.,Chen X., and Liang H.,2015. Studies on the mechanism of watershed hydrologic droughts based on the combined structure of typical Karst lithologys.*CHINESE JOURNAL OF GEOLOGY*, 50(1):340-353.<https://doi.org/10.3969/j.issn.0563-5020.2015.01.023>.
- He Z.,Chen X., and Liang H.,2014. Study on Spatial Pattern of Land-using Types and Hydrologic Droughts for Typical Karst Basin of Guizhou Province . *Journal of China Hydrology*, 34(1):20-25.
- He Z., and Chen X.,2013. The Hydrological Drought Simulating in Karst Basin Based on Coupled Soil Factors——Taking Guizhou Province as A Case. *Scientia Geographica Sinica*, 33(6):724-734.
- He Z.,Chen X.,and Liang H.,2013. The Hydrological Drought Analysis of the Karst Basin Based on the Soil Systematic Structure-Taking Guizhou Province as a Case. *Journal of Natural Resource*, 28(10):1731-1741. <https://doi.org/10.11849/zrzyxb.2013.10.008>.
- Kim T. W., Valdés J. B.,2006.Nornparametric Approach for Bivariate Drought Characteriztion Uing Palmer Drought Index. *Journal of Hydrologic Engineering*,11(2):134-143.
- Li Y.,Huang J.,Xu Q., etc.,2017.Rethinking the concept and restoration of Karst rocky desertification. *Journal of Guizhou Normal*

533 University (Natural Sciences),35(5):1-5+55.

534 Li Y., He J., and Li X., 2016. Hydrological and meteorological droughts in the red river basin of Yunnan Province based on SPEI and
535 SDI Indices. Progress in Geography,35(6):758-767. <https://doi.org/10.18306/dlkxjz.2016.06.009>.

536 Mei Z.,2017.Discussion on construction of Karst rocky desertification industry in Guizhou. Journal of Guizhou Normal University
537 (Natural Sciences),35(6):1-8.

538 Mondal A., Mujumdar p.,2015. Return levels of hydrologic droughts under climate change. Advances in Water Resources,75:67-79.
539 <https://doi.org/10.1016/j.advwatres.2014.11.005>.

540 Ma S.B., An Y. L.,2012.Auto-classification of Landform in Karst Region Based on Aster GDEM. Scientia Geographica
541 Sinica,32(3):368-373.

542 Mishra A.K.,Singh V.P.2010.A review of drought concepts. Journal of Hydrology, 391:202-213.

543 Nyabeze W. R.,2004. Estimating and interpreting hydrological drought indices using a selected catchment in Zimbabwe. Physics and
544 Chemistry of the Earth,29:1173-1180. <https://doi.org/10.1016/j.pce.2004.09.018>.

545 Panu U. S., Sharma T. C., 2009.Analysis of annual hydrological droughts: the case of northwest Ontario,Canada. Hydrological
546 Sciences Journal, 54(1):29-42. <http://dx.doi.org/10.1623/hysj.54.1.29>.

547 Rudd A., Bell V., and Kay A.,2017.National-scale analysis of simulated hydrological droughts (1891–2015).Journal of
548 hydrology,550:368-385.<http://dx.doi.org/10.1016/j.jhydrol.2017.05.018>.

549 Ren L., Shen H., and Yuan F., etc., (2016). Hydrological drought characteristics in the weihe catchment in a changing
550 environment.Advances in Water Science,27(4):492-500. <https://doi.org/10.14042/j.cnki.32.1309.2016.04.002>.

551 Sheffield, J., Wood, E. F., 2011. Drought, Past Problems and Future Scenarios, Earthscan.

552 Sen Z.,1977. Run-sums of annual flow series. Journal of Hydrology,35(3):311-324. [https://doi.org/10.1016/0022-1694\(77\)90009-9](https://doi.org/10.1016/0022-1694(77)90009-9).

553 Sen Z.,1990. Critical drought analysis by second-order Markov chain. Journal of hydrology,120:183-202.
554 [https://doi.org/10.1016/0022-1694\(90\)90149-R](https://doi.org/10.1016/0022-1694(90)90149-R).

555 Sen Z.,1991.On the probability of the longest run length in an independent series. Journal of Hydrology,125:37-46.
556 [https://doi.org/10.1016/0022-1694\(91\)90082-S](https://doi.org/10.1016/0022-1694(91)90082-S).

557 Sharma T. C.,1998. An analysis of non-normal Markovian extremal droughts. Hydrology Process,12:597-611.

558 Seibert M.,Merz B., and Apel H.,2017.Seasonal forecasting of hydrological drought in the Limpopo Basin:a comparison of statistical
559 methods.Hydrol. Earth Syst. Sci., 21:1611-1629. <https://doi.org/10.5194/hess-21-1611-2017>.

560 Tu X., Chen X., and Zhao Y., etc., 2016. Responses of hydrologic drought properties and water shortage under changing
561 environments in Dongjiang River Basin. Advances in Water Science,27(6):810-821.
562 <https://doi.org/10.14042/j.cnki.32.1309.2016.06.003>.

563 Van Loon A.F.,Laaha G.2015.Hydrological drought severity explained by climate and catchment characteristics.Journal of
564 Hydrology, 526:3-14. <https://doi.org/10.1016/j.jhydrol.2014.10.059>

565 Van Loon A. F.,Van Lanen A.J..2012.A process-based typology of hydrological drought.Hydrol.Earth Syst.Sci., 16:1915-1946.
566 <https://doi.org/10.5194/hessd-8-11413-2011>.

567 Van Huijgevoort, M.H.J., Van Lanen, H.A.J., Teuling, A.J., etc., 2014.Identification of changes in hydrological drought
568 characteristics from a multi-GCM driven ensemble constrained by observed discharge. Journal of Hydrology, 512(6):421–434.
569 <http://dx.doi.org/10.1016/j.jhydrol.2014.02.060>

570 Van Lanen, H.A.J., Wanders, N., Tallaksen, L.M.,etc., 2013.Hydrological drought across the world: impact of climate and physical
571 catchment structure.Hydrol. Earth Syst. Sci.17,1715–1732. <http://dx.doi.org/10.5194/hess-17-1715-2013>.

572 Yevjevich V., 1967.An objective approach to definition and investigations of continental hydrologic droughts,Colorado State
573 University.

574 Yang M.D.,1982.The Geomorphological Regularities of Karst Water Occurences in GuiZhou Plateau.Carologica Sinica, (2):81-91.

575 Wu J., Chen X., and Gao L., etc., 2016.Construction and Recognition of Regional Hydrological Drought Index Based on
576 Standardized Runoff Index. Mountain Research,34(3):282-289. <https://doi.org/10.16089/j.cnki.1008—2786.000129>.

577 Wen L., Rogers K., Ling J., etc., 2011.The impacts of river regulation and water diversion on the hydrological drought characteristics
578 in the Lower Murrumbidgee River, Australia. Journal of Hydrology, 405(3):382-391.

579 Zhou Y.,Yuan X., and Jin J.,2011. Regional Hydrological Drought Frequency Based on Copulas.SCIENTIA GEOGRAPHICA

580 SINICA, 31(11):1383-1388.

581 Zhai J., Jiang G., and Pei Y., etc., 2015. Hydrologic drought assessment in the river basin based on Standard Water Resources Index

582 (SWRI): a case study on the Northern Haihe River. *Shuili Xuebao*, 46(6):687-698. <https://doi.org/10.13243/j.cnki.slxb.20140844>.

583 Zhao X., and Zhao R., 2016. Applicability of the hydrologic drought index in the upper Fenhe River. *Advances in*

584 *Water Science*, 27(4):512-519. <https://doi.org/10.14042/j.cnki.32.1309.2016.04.004>.

585 Zhang Y., Xiang L., and Sun Q., etc., 2016. Bayesian Probabilistic Forecasting of Seasonal Hydrological Drought Based on Copula

586 Function. *Scientia Geographica Sinica*, 36(9):1437-1444. <https://doi.org/10.13249/j.cnki.sgs.2016.09.017>.

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