

Original Research

Analysis on Ecological Environment Change of Kalajun-Kurdening World Natural Heritage Site from 2006 to 2019

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Abstract

Scientific evaluation and dynamic monitoring of regional ecological environment have important reference value for the establishment and implementation of regional ecological environment protection and restoration measures. Spatial principle component analysis was used to assess the present situation and the temporal and spatial variation characteristics of ecological environment of Kalajun-Kurdening natural heritage site by calculating the remote sensing ecological index (RSEI) and analyzing the landscape pattern. Three results are presented: (1) During 2006-2019, the mean values of the greenness indicator showed an increasing trend, with an increase of 10.58%, which proves that the vegetation coverage in Kalajun-Kurdening shows an increasing trend year by year. The other three indicators of dryness, moisture, and heat decreased by 134.51%, 14.66%, and 3.45% respectively. The change of greenness and dryness has a stronger positive effect on the ecological environment quality, while the negative effect of heat on the ecological environment quality is reduced. (2) During the 14 years, the regional RSEI of 1104.23 km² remained unchanged, accounting for 54.32% of the total area. The area with a descending RSEI is 547.23 km², accounting for 26.92% of the total area, 84.52% of which had a drop of one level. The area with the rising RSEI is 381.31 km², accounting for 18.75% of the total area, 90.56% of which has a rising by one level. (3) Landscape indexes of the different grade of RSEI in Kalajun-Kurdening showed that the landscape fragmentation was small, the structural complexity was reduced, and the landscape patches were regularized, artificial, and centralized; different types of RSEI had obvious agglomeration; and the cohesion between patches was relatively good. Overall, the ecological environment quality of the Kalajun-Kurdening world natural heritage site showed an upward trend from 2006 to 2019 without large-scale deterioration of, maintaining in good condition.

Keywords: ecological environment, remote sensing, landscape pattern, spatial-temporal variation

Introduction

A natural heritage is a natural zone of Outstanding Universal Value with natural landforms, geological or geographical structures, natural places of interest and clearly defined habitats of endangered animals and plants [1]. The study on the temporal and spatial pattern and evolution of the ecological environment of natural heritage sites is conducive to a comprehensive understanding of the overall condition and spatial distribution of the ecological environment [2], and has important practical significance for targeted ecological environment construction and protection [3]. For example, Allan J.R. et al. analyzed global natural heritage sites threatened by human footprint and forest loss [4]; Shi Hui et al. analyzed the landscape ecological security and ecological environment vulnerability of Tianchi and Tomur in Tianshan, Xinjiang, respectively, and discussed the driving mechanism of the pattern evolution of Tianchi scenic area [2], and divided the Tomur region according to the vulnerability level [5]. However, there are few studies on natural heritage sites through the integrated monitoring of remote sensing and landscape pattern analysis.

Ecological environment is the material basis for human survival and development [6]. Since the 20th century, climate warming has been increasingly intensified, and the global climate and environment have undergone great changes [7]. The loss of species diversity, frequent occurrence of extreme weather events, intensification of desertification and melting of polar glaciers are strong feedbacks to the changes of ecological system, which greatly threaten the survival of human beings and the sustainable development of social economy [8]. Excessive and disordered exploitation and utilization of ecological resources has led to a series of ecological and environmental problems such as ecosystem degradation, energy shortage and land desertification [9]. As the most intuitive manifestation of human development and utilization of natural environment, land use/cover and other surface elements are in constant change and dynamic balance, driving the change of global ecological process and forming the regional spatial differentiation of surface landscape [10].

Vulnerable ecological environment is the sensitive response and self-recovery ability of an ecosystem in a specific space and time scale relative to external disturbance, and also an inherent internal natural attribute of the system itself [11]. As one of the core hotspots in global geography, ecology and environmental science, it is the result of the interaction of natural and human factors, and can objectively describe the degree of regional ecological environment quality [12]. Scientific evaluation and dynamic monitoring of regional ecological environment have important reference value for the establishment and implementation of regional ecological environment protection and restoration measures [13]. Therefore, the research of temporal and spatial difference of ecological

environment is carried out to deeply analyze the formation reasons and driving mechanism of ecosystem vulnerable problems, so as to provide decision-making basis and technical support for guiding the protection of ecological areas and restoration and governance of ecological environment [14].

Researches on ecological environment assessment originated in 1905 [15]. Since the 1980s, scholars have conducted in-depth studies on the systematic assessment of ecological vulnerability and the influencing factors of system changes, and applied landscape ecology, RS/GIS and other spatial analysis methods to the ecological environment assessment [16]. At present, remote sensing technology can quickly and quantitatively evaluate the changes of ecological environment [17]. Remote sensing technology has been widely used in ecological environment basins due to its advantages of rapid and real-time, etc., and has become an important means of ecological environment assessment [18].

In the aspect of index system research, it can be divided into single index and comprehensive index: (1) According to a single index, the different functions of an ecosystem are interrelated and constitute the overall function of the system. A single index, such as vegetation index represented by NDVI, temperature inversion index represented by LST and land use type change index, can only reflect a certain function of the ecosystem unilaterally and separate the overall function [15]. For example, Badreldin et al. used disturbance index and soil adjustment index to dynamically monitor desertification in the Sinai Peninsula region of Egypt [19]; Franke et al. studied the dynamic process of grassland degradation by using normalized difference vegetation index [20]. The advantages of single index are easy to understand and easy to calculate, but it is difficult to grasp the systematicness of ecological environment. (2) Comprehensive ecological environment index can contain more ecological environment characteristics related to research objectives. The ecological environment evaluation model composed entirely of remote sensing data is characterized by timeliness and rapidity [21]. However, the application of ecological index (EI) containing other types of data is limited to some extent due to the difficulty in obtaining monitoring data and statistical data. The monitoring of ecological environment is mostly based on statistical data, monitoring data or remote sensing data [22]. Comprehensive index method is adopted to conduct qualitative or quantitative analysis around a certain period of time in the research area to describe the temporal and spatial changes of ecological environment [23]. When scholars use remote sensing technology to monitor the ecological environment, most of them are still based on a single evaluation index, and the indexes and weights need to be adjusted artificially in studies in different regions. And multi-index remote sensing ecological index (Remote Sensing Ecology Index, RSEI), based on remote sensing information, can integrate the four indexes of greenness, humidity,

dryness and heat. There is no need to choose the weight of ecological index, and the calculated results are objective and stable. At present, some scholars have made ecological change analysis by using remote sensing ecological index in some cities. The results show that RSEI has a good effect on the evaluation of regional ecological environment quality, and can comprehensively reflect the change characteristics of regional ecological environment quality [24].

Due to the highly comprehensive and regional characteristics of the landscape itself, some scholars, from the perspective of landscape ecology, adopt the spatial distribution and gradient change characteristics of landscape information to establish evaluation models, so as to realize the quantitative and spatial evaluation of ecological environment vulnerability [25]. However, because of the differences in the evaluation objects, the selection of indicators has different focuses, which affects their unified academic cognition.

In recent years, dynamic assessment and analysis of ecological environment combined with landscape pattern index has become a research focus and application field of landscape ecology. Landscape, as the living environment of human beings and various creatures, shows obvious regional characteristics [26]. Research shows that there is an internal correlation between landscape pattern information and ecological environment vulnerability, which provides new research methods and ideas for ecological vulnerability assessment. The landscape pattern shows the spatial relationship and gradient change characteristics of different ecosystem or landscape units [27].

Most scholars construct the landscape ecological vulnerability framework from the landscape pattern level, but there are few studies on both landscape pattern and RSEI. Therefore, it is particularly important to study the temporal and spatial changes of regional landscape ecological vulnerability from the perspective of RSEI and landscape pattern as a whole. In terms of the influencing factors, the current researches on the influencing factors of landscape ecological vulnerability are mostly qualitative and relatively few quantitative

studies, and the multi-scale analysis of the influencing factors is even more lacking. In order to better reveal the influencing factors and differences of ecological environment at different scales, it is necessary to study the spatio-temporal evolution and multi-scale driving factors of landscape ecological vulnerability in diverse geographical regions.

Materials and Methods

Study Area

The Kalajun-Kurdening world natural heritage site is located in the Ili River Valley in the central part of the Tianshan Mountains in Xinjiang, with a core area of 1,138.18 km², and a buffer area 893.46 km² (Fig. 1). On June 21, 2013, Xinjiang Tianshan was ratified as a world natural heritage site by the United Nations Educational Scientific and Cultural Organization (UNESCO), making it the 47th world heritage site in China. The Bayanbulak, Bogda, Kalajun-Kurdening, and Tomur components constitute the Xinjiang Tianshan World Heritage Site. The Kalajun-Kurdening is the region with the richest biodiversity in Tianshan Mountain, Xinjiang, and is the most typical representative of Tianshan coniferous forest and Tianshan mountain grassland meadow in "Central Asia Mountain Grassland and Forest Land Ecological Zone" of Ecoregions 111 of Global 200. As the best habitat and origin of the world's snow Ridge spruce and the central Asian wild fruit forest, it provides a valuable habitat environment for many tertiary relic species and has been named as the "natural gene pool" of wildlife species in the hinterland of Eurasia. It has the biological landscape resources with the highest aesthetic value in Tianshan mountain. The biodiversity, geomorphic diversity and climate diversity have created the landscape aesthetic diversity, making it the most prominent representative of the integrated natural landscape beauty of temperate arid mountainous areas [14].

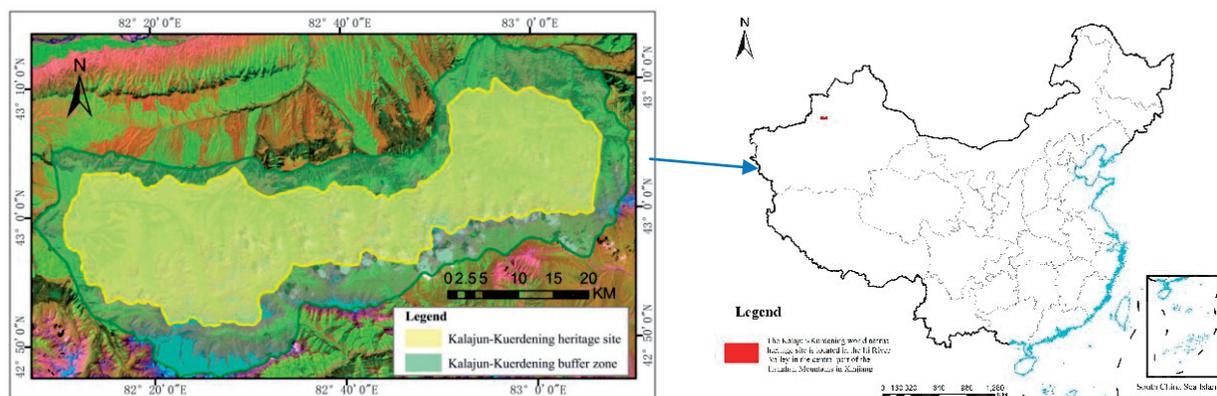


Fig. 1. Location of the study area. Map Content Approval Number: GS(2019)1822.

Data Sources and Data Processing

Landsat series images were used for the data in the research, which were successively Landsat 5 TM data on July 17, 2006 and Landsat 8 OLI data on July 18, 2019 with orbit number 146/030 and a spatial resolution of 30m, downloaded from the United States Geological Survey (<https://www.usgs.gov/>). The imaging time was relatively close, and the data cloud cover was relatively small. Using ENVI 5.1 software, each image in each period is radiatively calibrated, and the pixel value of each image is converted into the reflectivity of the sensor. The FLAASH absolute atmospheric correction was used to correct each image to reduce the difference of the image generated in different periods of light, atmosphere and other conditions, and the images of different periods are seamlessly embedded, covering all areas of the research area. Finally, all images were cut by the boundary of the study area, and the root mean square error of the registration should be less than 0.5 pixels, which is satisfied the requirement of data accuracy in this study.

Research Methods

Remote sensing ecological index (RSEI) selects four important indicators inseparable with human living environment – greenness, moisture, heat and dryness to objectively and comprehensively evaluate the ecological environment. The remote sensing ecological index (RSEI) was proposed by Xu Hanqiu [24]. It was used to calculate the ecological index, by extracting a number of indicators that can reflect the ecological status, including vegetation index, moisture component, surface temperature, building index and bare soil index, and synthesizes them. Dimensionality reduction is achieved through spatial principal component analysis (SPCA) [28]. Principal component containing multiple index information is adopted as an indicator to represent the ecological status. The four indicators can be extracted by remote sensing image information. Vegetation indicator (NDVI) represents greenness, land surface moisture component (LSM) is used to represent moisture, surface temperature (LST) represents heat index, and normalized difference imperviousness and soil index (NDISI) represents dryness index.

Index Calculation of RSEI

– Greenness (NDVI)

Vegetation is a very important factor to reflect the regional ecological quality [29]. Normalized difference vegetation index (NDVI) is the most widely used vegetation index, which can reflect the relationship between plant biomass, leaf area index and vegetation coverage [30]. Therefore, NDVI can be selected as the green index in this paper, and its formula is:

$$NDVI = (\rho_{NIR} - \rho_R) / (\rho_{NIR} + \rho_R) \quad (1)$$

...where the ρ_R and ρ_{NIR} are the reflectance data of infrared and near-infrared bands of TM 5 and OLI 8 respectively.

– Moisture (LSM)

The brightness, greenness and moisture components of tasseled cap are closely related to the ecological quality [31]. Among them, the moisture component can reflect the soil and vegetation and the humidity condition in the study area [32]. Therefore, land surface moisture (LSM) is used to represent humidity index in this paper. Based on Landsat TM and Landsat OLI reflectivity image data, the formula is:

$$LSM = C_1\rho_B + C_2\rho_G + C_3\rho_R + C_4\rho_{NIR} + C_5\rho_{SWIR1} + C_6\rho_{SWIR2} \quad (2)$$

...where the ρ_B , ρ_G , ρ_R , ρ_{NIR} , ρ_{SWIR1} and ρ_{SWIR2} are the reflection rate data of TM and OLI's blue, green, red, near-infrared, short-wave infrared 1 and short-wave infrared 2 bands respectively. C_1 , C_2 , C_3 , C_4 , C_5 and C_6 are the coefficients for calculating humidity, and values in TM image are: $C_1 = 0.0315$, $C_2 = 0.2021$, $C_3 = 0.3102$, $C_4 = 0.1594$, $C_5 = -0.6806$, $C_6 = -0.6109$; Values in OLI image are respectively: $C_1 = 0.1511$, $C_2 = 0.1973$, $C_3 = 0.3283$, $C_4 = 0.3407$, $C_5 = -0.7117$, $C_6 = -0.4559$.

– Heat (LST)

Heat index is expressed by land surface temperature, which is closely related to vegetation and water resources [33]. All satellite-based studies of heat island have verified a close relationship between the satellite-derived surface temperature and land surface temperature. The surface temperature is obtained through the surface specific emissivity correction. The formula is as follows:

$$L = gain \times DN + bias \quad (3)$$

$$T_b = K_2 / \ln(K_1 / L + 1) \quad (4)$$

$$LST = T_b \left[1 + (\lambda T_b / \rho) \ln \varepsilon \right] \quad (5)$$

...where the L is the at-satellite spectral radiance values of the thermal bands, Band 6 of Landsat TM and Band 10 of Landsat OLI; gain and bias is the gain value and offset value of the corresponding band, and both of the values can be queried from the header file of corresponding image. T_b is the at-satellite brightness temperature. K_1 and K_2 are the band-specific thermal conversion constants of thermal bands, at Band 6 of Landsat TM, $K_1 = 607.76W/(m^2 \cdot sr \cdot \mu m)$, $K_2 = 1260.56K$; at Band 10 of Landsat OLI, $K_1 = 774.89W/(m^2 \cdot sr \cdot \mu m)$, $K_2 = 1321.08K$. λ is the wavelength of the thermal infrared band; $\rho = 1.4380 \times 10^4 \mu m$; ε is the surface specific emissivity.

– Dryness (NDISI)

The Impervious Built-up Index (IBI) has been commonly used to map built-up lands accurately [34]. In addition to the built-up lands, patches of bare land

or sparsely vegetated ground occurred in the deforested or abandoned locations across the study area. For this reason, Soil Index (SI) was also employed to represent these bare areas [35]. Normalized Difference Imperviousness and Soil Index (NDISI) can effectively distinguish impervious and soil features without covering water before processing impervious surface information [36]. The final dryness indicator is made up of the Built-up Index (IBI) and bare Soil Index (SI) synthesis, denoted as NDISI:

$$IBI = \frac{\left\{ 2\rho_{SWIR1} / (\rho_{SWIR1} + \rho_{NIR}) - \left[\rho_{NIR} / (\rho_{NIR} + \rho_R) + \rho_G / (\rho_G + \rho_{SWIR1}) \right] \right\}}{\left\{ 2\rho_{SWIR1} / (\rho_{SWIR1} + \rho_{NIR}) + \left[\rho_{NIR} / (\rho_{NIR} + \rho_R) + \rho_G / (\rho_G + \rho_{SWIR1}) \right] \right\}} \quad (6)$$

$$SI = \frac{(\rho_{SWIR1} + \rho_R) - (\rho_B + \rho_{NIR})}{(\rho_{SWIR1} + \rho_R) + (\rho_B + \rho_{NIR})} \quad (7)$$

$$NDISI = (IBI + SI) / 2 \quad (8)$$

...where the $\rho_B, \rho_G, \rho_R, \rho_{NIR}$ and ρ_{SWIR1} are the planetary reflectance of blue, green, red, near-infrared and mid-infrared band of the Landsat 5 TM image and Landsat 8 OLI image respectively.

Standardization of Evaluation Indicators

Each evaluation index has different properties and dimensions, so it is impossible to directly evaluate ecological environment. Therefore, it is necessary to standardize each evaluation index in order to solve the contradiction between indexes that cannot be directly compared [37]. The four indicators selected in this paper can be divided into positive indicators and negative indicators according to their contribution to ecological environment equality. The positive indicators include greenness and moisture; the negative indicators include dryness and heat [38]. For indicator standardization, range standardization method is adopted, and its formula is:

Positive indicators: $SI_i = \frac{I_i - I_{min}}{I_{max} - I_{min}} \times 10 \quad (9)$

Negative indicators: $SI_i = \frac{I_{max} - I_i}{I_{max} - I_{min}} \times 10 \quad (10)$

...where SI_i represents the standardized value of indicator I , whose range is 0-10; I_i is the actual value of indicator; I_{max} is the maximum value of indicator I ; I_{min} is the minimum value of the indicator I .

Synthetic Evaluation Model of RSEI

Spatial principal component analysis (SPCA) is to transform the relevant multivariate spatial data into a few irrelevant comprehensive indicators by rotating the spatial coordinate axes of the characteristic spectrum, so as to retain the information reflected by many variables to the maximum extent with fewer comprehensive indicators. SPCA does not need to determine the weight of each index artificially, which can avoid the deviation of the final result caused by human factors [39]. In this paper, on the software platform of ENVI 5.1, SPCA is carried out for the four evaluation indicators of standardized greenness, moisture, dryness and heat in the evaluation index system to calculate the RSEI. Its calculation formula is:

$$RSEI = r_1PC_1 + r_2PC_2 + r_3PC_3 + \dots + r_iPC_i \quad (12)$$

...where i is the quantity of principal component (PC) that remained and r_i is the contribution ratio of PC_i .

The contribution ratio r_i is calculated as follows:

$$r_i = p_i / \sum_{i=1}^n p_i \quad (13)$$

...where p_i represents the contribution ratio of principal component p_i , and n is the significant number of principal components that remain.

According to the principle of SPCA, the inversion model of RSEI in the study area is obtained from Table 1:

$$RSEI_{2006} = 0.6034 \times PC_1 + 0.2895 \times PC_2 + 0.0577 \times PC_3 \quad (14)$$

$$RSEI_{2019} = 0.6150 \times PC_1 + 0.2184 \times PC_2 + 0.1073 \times PC_3 \quad (15)$$

Table 1. The results of spatial principal component analysis.

Principle component	Percent of Eigenvalues/%		Accumulative of Eigenvalues/%	
	2006	2019	2006	2019
1	60.34	61.50	60.34	61.50
2	28.95	21.84	89.29	83.35
3	5.77	10.73	95.06	94.08
4	2.93	1.91	100.00	100.00

Table 2. Statistics of NDVI, LSM, LST, and NDISI in 2006 and 2019.

	2006				2019			
	NDVI	LSM	LST	NDISI	NDVI	LSM	LST	NDISI
MAX	0.7775	1.0000	40.0070	0.1393	0.8231	1.0000	36.9948	0.1857
MIN	-0.7048	0.0260	-14.0536	-0.6011	-0.9552	0.0190	-16.3831	-0.8004
MEAN	0.2880	0.1609	19.0286	-0.2325	0.3221	0.1373	18.3718	-0.5497
STD	0.2739	0.1422	7.8586	0.1335	0.3155	0.0977	7.0532	0.0962

...where $RSEI_{2006}$ and $RSEI_{2019}$ are the ecological vulnerability index in 2006 and 2019 respectively; PC_1 - PC_3 are the first three principal component factors after the principal component transformation of the original spatial variable.

Classification of RSEI and Overall Index of Ecological Vulnerability

The spatial distribution of RSEI in 2006 and 2019 was obtained by using the Raster Calculator tool in ArcGIS 10.2. According to the interval of 0.2, the RSEI was divided into 5 grades, including lower ecological index (0.0~0.2), low ecological index (0.2~0.4), medium ecological index (0.4~0.6), high ecological index (0.6~0.8), and higher ecological index (0.8~1.0). For the convenience of use, the RSEI was numbered as I, II, III, IV, and V. Meanwhile, in order to study the overall differences of RSEI in different spatial units in different years, this paper uses the Remote-Sensing Ecological Body Index (RSEBI) [40] to estimate it, and its calculation formula is:

$$RSEBI = \sum_{i=1}^n P_i \times A_i / S \tag{16}$$

...where P_i is the value of ecological vulnerability grade i , which is 1-5. A_i is the area of the grade i ; S is the total area of the study area.

Analysis of Landscape Pattern Change in Different Grades of RSEI

On the basis of the classification of RSEI, patches of grade I, II, III, IV and V of RSEI were regarded as five landscape types. The landscape indexes are used to study the RSEI of each grade, such as total area (CA), percentage of landscape (PLAND), largest patch index (LPI), number of patches (NP), patch density (PD), landscape division index (DIVISION), splitting index (SPLIT), propotation of like adjacencies (PLADJ), aggregation index (AI), landscape shape index (LSI), and patch cohension index (COHESION).

Results and Discussion

Analysis on the Temporal and Spatial Variation of Ecological Environment in Kalajun-Kurdening Natural Heritage Site

According to the changes of the indicators of Kalajun-Kurdening heritage site in 14 years, the greenness that has a positive impact on the ecological index shows an upward trend, with the mean value rising from 0.2880 in 2006 to 0.3221 in 2019, with an increase of 10.58%, which proves that the vegetation coverage in this region shows an increasing trend year by year; The dryness index decreased from -0.2325 in 2006

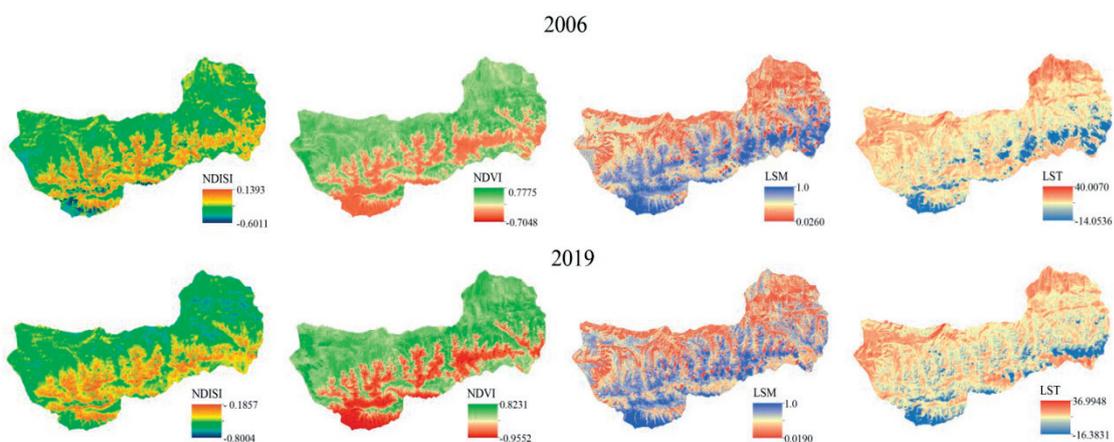


Fig. 2. Spatial distribution of RSEI indicators values in 2006 and 2019.

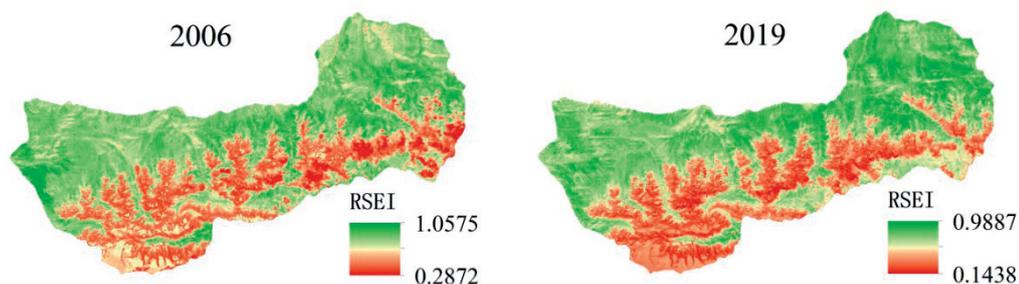


Fig. 3. Distribution of RSEI levels of the study area in 2006 and 2019.

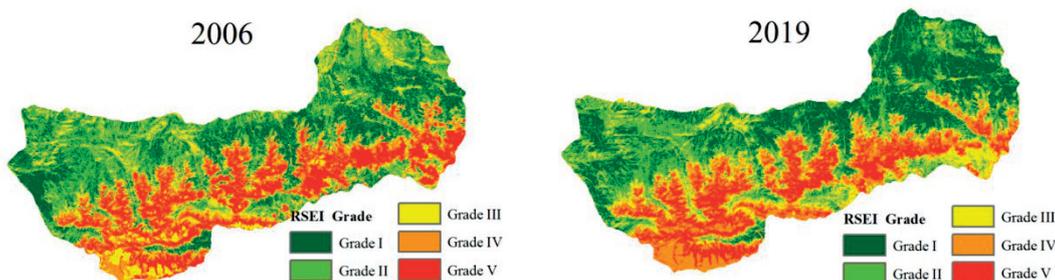


Fig. 4. Spatial distribution of RSEI grades in 2006 and 2019.

to -0.5497 in 2019, with a decrease of 134.51%, indicating a significant decrease in the degree of surface nudity in the heritage site. The average moisture closely related to vegetation and water resources decreased from 0.1609 in 2006 to 0.1373 in 2019, with a decrease of 14.66%. The heat indicator, which has a negative effect on the RSEI, shows a downward trend year by year, with its mean dropping from 19.0286 in 2006 to 18.3718 in 2019, with a decrease ratio of 3.45%. On the whole, the change of greenness and dryness has a stronger positive effect on the ecological environment quality, while the negative effect of heat on the ecological environment quality is reduced. Although moisture is reduced to some extent, the overall effect of positive factors is relatively strong, which promotes the improvement of the RSEI of Kalajun-Kurdening, that is, the ecological environment quality is improved.

From the spatial distribution of RSEI (Fig. 2), NDVI and LSM values are higher in the north of the study area and lower in the south, which are closely related to the distribution of snow, ice and water system. The NDISI value is higher in the south and lower in the north, which is associated with the decrease of snow and ice area in the southwest.

Accordingly, the distribution map of RSEI (Fig. 3) of Kalajun-Kurdening Heritage site is also shown. Compared with 2006, the orange area, which indicates poor ecological environment, gradually spread in 2019, mainly concentrated in the south of the study area. However, the increase of ecological index in the northern region, especially in the northeast region,

indicates that the ecological environment has been improved to a great extent.

For more in-depth analysis of RSEI space changes of Kalajun-Kurdening, the RSEI was divided into 5 grades according to the interval of 0.2, including Grade I ($0.0 \leq RSEI \leq 0.2$), Grade II ($0.2 \leq RSEI \leq 0.4$), Grade III ($0.4 \leq RSEI \leq 0.6$), Grade IV ($0.6 \leq RSEI \leq 0.8$), and Grade V ($0.8 \leq RSEI \leq 1.0$), and the specific calculation results as shown in Fig. 4 and Table 3.

From Fig. 4, in 2006, the northern part of the study area was covered by a large area with a low RSEI, while the area with a high RSEI was scattered; In the southern direction, RSEI is rising gradually, but the areas with medium and high ecological index are only scattered. In 2019, a large area of the northern part of the study area, especially the northeast region, experienced a decrease of RSEI, while the southern part of the study area, especially the southeast and southwest regions, experienced an increase in low-value areas and a significant increase in high-value areas.

Table 3 and Fig. 5 show the area and proportion of each grade of RSEI in the study area and its change curve. In 2006, the area with Grade I of RSEI was 429.12 km², accounting for 21.12%; By 2019, the area of Grade I is 540.33 km², accounting for 26.70%, with an increase of 111.21 km². Although the range of change is not large, it also indicates that the area with low RSEI is increasing. The area with Grade II occupies a large proportion in the whole study area, with the area of 641.21 km², accounting for 31.56% of the total area, and an area of 570.99 km², accounting for 28.06%,

Table 3. Percentage of areas of RSEI grades of the study area in 2006 and 2019.

Grade of RSEI	2006		2019	
	Area/km ²	Percent/%	Area/km ²	Percent/%
I	429.12	21.12	540.33	26.70
II	641.21	31.56	570.99	28.06
III	332.37	16.34	297.37	14.62
IV	263.18	12.98	327.88	16.10
V	365.76	18.00	295.07	14.52
Total	2031.64	100	2031.64	100

reducing by 70.22 km². The area of Grade III decreased from 332.37 km² in 2006 to 297.37 km² in 2019, and the proportion decreased from 16.34% to 14.62%, which was basically stable. The area of Grade IV increased from 263.18 km² in 2006 to 327.88 km² in 2019, and the corresponding proportion increased from 12.98% to 16.10%, with an increase of 64.70 km². The area of Grade V decreased by 70.69 km² from 365.76 km² in 2006 to 295.07 km², and the corresponding proportion increased from 18% to 14.52%.

The statistical value of RSEI of various grades in the research area shows that the ecological environment has changed with ups and downs over the past 14 years, but it is basically balanced on the whole. In terms of proportion, the ecological index distribution of the whole research area is relatively balanced, with Grade I and Grade II areas accounting for 54.76% of the total area in 2016. Grade III, IV and V areas account for 45.22% of the total area, so the overall level of ecological environment still needs to be improved.

Dynamic Monitoring of Eco-Environment Quality in Kalajun-Kurdening Natural Heritage Site

In order to further analyze the variation characteristics of the RSEI of Kalajun-Kurdening, the RSEI of the two time phases was compared, and the spatial variation chart of RSEI was obtained by

classifying the RSEI from three levels: descending, unchanged and ascending (Fig. 6). The results show that the increasing area of RSEI is mostly located in the southeast and south edge of the study area. Most of the RSEI invariant areas were scattered, and there were more in the southeastern region. The decline of RSEI is mainly distributed in the northwest of the study area, especially in the snow and ice area.

According to statistics on the specific changes of each grade (Table 4), from 2006 to 2019, the regional RSEI of 1104.23 km² remained unchanged, accounting for 54.32% of the total area. The area with a descending RSEI is 547.23 km², accounting for 26.92% of the total area, and 84.52% of the area has a descending ecological index of one level. The area with the rising RSEI is 381.31 km², accounting for 18.75% of the total area, of which 90.56% has the rising ecological index by one level. Therefore, the changes in the RSEI of the research area are mainly concentrated within a range of one level, indicating that the ecosystem of the whole Kalajun-Kurdening heritage site has been relatively stable in the past 14 years without large-scale deterioration of the ecological environment, and the overall trend of development is good.

Analysis of landscape pattern change in different grades of RSEI of Kalajun-Kurdening natural heritage site.

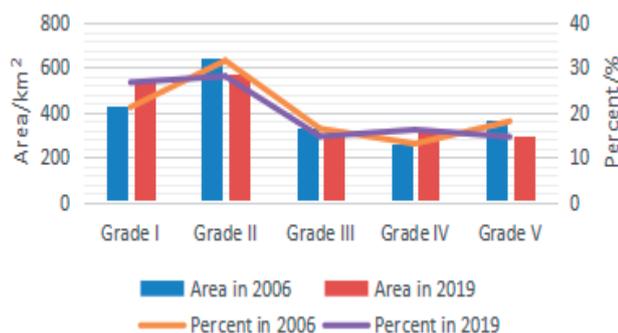


Fig. 5. Statistical chart of ecological grades and area ratios in 2006 and 2019.

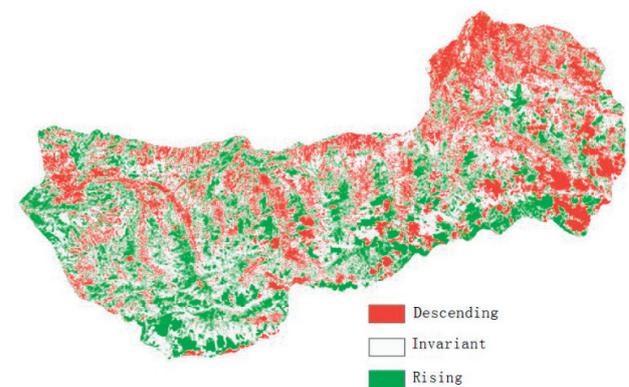


Fig. 6. RSEI hierarchical spatial distribution of the study area.

Table 4. Change of RSEI Grade in the study area.

Levels of RSEI	Range	Area of each level/ km ²	Proportion/%	Class Area/ km ²
Descending	-4	3.01	0.55	547.23
	-3	16.26	2.97	
	-2	65.46	11.96	
	-1	462.50	84.52	
Invariant	0	1104.23	-	1104.23
Rising	1	345.34	90.56	381.31
	2	28.57	7.49	
	3	6.31	1.66	
	4	1.09	0.29	

Table 5. Change in landscape patch characteristic values from 2006 to 2019 of the study area.

Type	CA		PLAND		NP		PD		LPI	
	2006	2019	2006	2019	2006	2019	2006	2019	2006	2019
I	429.13	540.33	21.10	26.57	15284	8344	7.51	4.10	1.79	11.03
II	641.31	570.99	31.54	28.08	1297	11085	6.38	5.45	13.82	12.08
III	332.47	297.37	16.35	14.62	18913	12333	9.30	6.06	0.53	1.42
IV	263.28	327.88	12.95	16.12	10976	7955	5.31	3.91	0.94	2.01
V	366.67	296.29	18.03	14.57	3573	3795	1.75	1.96	7.17	6.06
Total	2032.86	2032.86	-	-	61719	43512	-	-	-	-
Type	LSI		PLADJ		COHESION		DIVISION		AI	
	2006	2019	2006	2019	2006	2019	2006	2019	2006	2019
I	149.38	107.11	78.35	86.17	98.32	99.50	0.99	0.98	78.46	86.28
II	209.56	179.73	75.16	77.42	99.66	99.59	0.97	0.98	75.25	77.51
III	204.22	170.67	66.38	70.29	95.30	97.42	0.99	0.99	66.49	70.42
IV	169.51	133.37	68.65	77.88	97.21	98.47	0.99	0.99	68.77	78.01
V	72.06	77.02	88.70	86.57	99.62	99.49	0.99	0.99	88.84	86.72

RSEI patch I, II, III, IV and V were regarded as five landscape types, and the landscape index is used to study the RSEI of each grade. Fragstats 4.2 was used to calculate each index, and the specific calculation results are shown in Table 5.

The number of patches (NP) and patch density index (PD) are indicators reflecting landscape fragmentation [41]. As can be seen from Table 5, the total area (CA) of the study area was 2032.86 km², and the number of patches was 61,719 in 2006 and 43,512 in 2019. The number of patches in the Grade I region decreased from 15,284 to 8,344, which was the highest reduction in the number of patches in the Grade I region; It indicates that the landscape fragmentation in Grade I region has the largest reduction range, that is, the area with the lowest ecological index has a reduction in patch

number and a reduction in landscape fragmentation. The number of patches in Grade II and Grade V regions increased from 1297 and 3573 to 11085 and 3795 respectively, which are the two regions with increased number of patches among the five regions; the patch increase in Grade V region, that is, the area with high RSEI, was less, indicating a small degree of landscape fragmentation. The number of patches in both Grade III and Grade IV areas also decreased to varying degrees. The patch density also decreased in all grades areas. In general, the landscape fragmentation of the study area from 2006 to 2019 is relatively small, and there is no large-scale deterioration of the ecological environment.

In 2006 and 2019, the difference of PLAND index of each grade area was not significant. The total proportion of regions of Grade I and Grade II were

52.64% and 54.65% respectively, and the proportion of regions of Grade III-V were 47.33% and 45.31% respectively in the two years, which basically kept stable, indicating that the overall ecological environment of Kalajun-Kurdening kept a good state. Landscape shape index (LSI) is an index to characterize the complexity of landscape structure [42]. The LSI of the Grade I-IV region all decreased to different degrees, while the LSI of the Grade V region increased slightly from 72.06 to 77.02, indicating that the structural complexity of most areas in Kalajun-Kurdening was reduced, and the landscape patches were regularized, artificial and centralized. The DIVISION index was basically maintained at 0.98-0.99, indicating that the overall RSEI patch shape complexity of the study area was not high. PLADJ of Grade I-IV increased from 2006 to 2019, while that of Grade V decreased by 2.13, which reflects the strong connectivity of certain patches in the RSEI landscape on the whole. COHESION was used to characterize the natural connectivity of landscape patches [43]. The COHESION of RSEI of the study area was close to 100, indicating a good patch binding. The landscape aggregation index (AI) represents the ratio of the number of adjacent common edges of the grid to the number of maximum possible common edges of a landscape element [44]. The AI showed an increase in the overall analysis of the study area, indicating that there was no increase in small patches. To sum up, the performance of each index in each grade area is consistent.

Through the analysis of RSEI and landscape pattern index, it is concluded that Kalajun-Kurdening natural heritage site maintains good ecological environment and typical biodiversity and landscape aesthetic value. This is mainly due to the coupling of natural environment changes and human activities:

(1) From the perspective of natural factors, the Kalajun-Kurdening natural heritage site is located in the hinterland of Eurasia and has a temperate continental semi-humid climate with long winters and short summers. There is large daily temperature difference, sufficient sunlight and moderate thermal energy. The annual average temperature is 5-7°C, and the annual average relative humidity is 70% [45]. With such favorable climatic conditions, from 2006 to 2019, the aggregation index of landscape was improved, and the overall landscape structure is relatively stable. The overall landscape health status and biodiversity of the study area are well maintained, and it has a complete natural geographical landscape aesthetic value.

(2) From the perspective of human activities, West Tianshan National Nature Reserve was established with the approval of the State Council in 2000. Kalajun Original Ecological Prairie Scenic Spot was established in 2007, which is a public institution under the jurisdiction of the Tourism Bureau of Turks County, covering an area of 100,000 mu; In 2010, Kalajun Scenic Spot was established; In 2013, Kalajun-Kurdening was

included in the World Natural Heritage List as part of Xinjiang Tianshan World Natural Heritage Site [46]. In 2015, Karajun actively promoted the construction of national 5A scenic spot was actively promoted and the construction of tourism infrastructure was constantly improved in Kalajun, and it was promoted to national 5A scenic spot in November 2016 [47]. From 2006 to 2019, the landscape tends to be stable, indicating that the establishment of the nature reserve and the natural heritage site in the study area has played a role in protecting the integrity of the landscape. Furthermore, in 2016, the Turks County government proposed the "herdsmen settlement" project through the investigation of Kalajun, and let herdsmen move out of the original earth houses and settle in a centralized location [48]. For example, the higher greenness and humidity in the northern part of the study area were mainly due to vegetation restoration measures. These reflect the work of heritage protection, government policies and the production and life style of local residents, and have made great contributions to the maintenance of the outstanding universal value of natural heritage sites and the aesthetic value of the landscape.

On research methods, based on the comparative analysis of the spatial distribution of two phases of RSEI in the study area, this paper revealed the status quo and spatial distribution characteristics of the ecological environment in the study area, discussed the spatial variation rules of the ecological environment, and tried to analyze the landscape pattern characteristics from the perspective of RSEI grade, so as to further refine the study on the change of the ecological environment, and to some extent, make up the deficiency of the existing studies on the analysis of landscape pattern. However, in terms of time sample selection, only 2006 and 2019 data were selected, which failed to characterize some potential special time nodes and time series characteristics of the ecological environment of Kalajun-Kurdening World Natural Heritage site. These deficiencies need to be further improved in the future research.

Conclusions

Based on Landsat satellite remote sensing data, the four indicators of greenness, moisture, dryness and heat were coupled into RSEI by SPCA method, and the ecological classification was combined with landscape pattern analysis to study the objective and quantitative spatio-temporal changes and dynamic monitoring of the ecological environment of Karajun-Kurdening World Natural Heritage site in 14 years, analyzing the present situation and the spatial distribution characteristics of the RSEI in Kalajun-Kurdening from 2006 to 2019. The result of the research shows that:

(1) From the perspective of spatial and temporal distribution, the overall ecological environment quality of the Kalajun-Kurdening World Natural Heritage

site showed an upward trend from 2006 to 2019. The greenness indicator that has a positive impact on the RSEI shows an increasing trend, with an increase of 10.58%, which proves that the vegetation coverage in Kalajun-Kurdening shows an increasing trend year by year. The dryness indicator decreased by 134.51%, indicating that the degree of surface exposure in the basin was greatly reduced. The mean moisture, which is closely related to vegetation and water resources, decreases by 14.66%. The heat indicator, which has a negative effect on the RSEI, showed a downward trend year by year, with a decrease ratio of 3.45%. On the whole, the change of greenness and dryness has a stronger positive effect on the ecological environment quality, while the negative effect of heat on the ecological environment quality is reduced. Although moisture is reduced to some extent, the overall effect of positive factors is relatively strong, which promotes the improvement of the RSEI of the research area, that is, the ecological environment quality of Kalajun-Kurdening is improved.

(2) According to the dynamic monitoring, the ecological environment of Kalajun-Kurdening World Natural Heritage site was maintained in good condition from 2006 to 2019, and the regional RSEI of 1104.23 km² remained unchanged, accounting for 54.32% of the total area. The area with a descending RSEI is 547.23 km², accounting for 26.92% of the total area, 84.52% of which had a drop of one level. The area with the rising RSEI is 381.31 km², accounting for 18.75% of the total area, 90.56% of which has a rising by one level. Therefore, the changes of RSEI of Kalajun-Kurdening are mainly concentrated within a range of one level, indicating that the ecosystem of the whole area has been relatively stable in the past 14 years without large-scale deterioration of the ecological environment, and the overall trend of development is good.

(3) From the perspective of landscape pattern analysis, landscape indexes of the study area such as NP, PD, and LSI generally show a downward trend, indicating that the landscape fragmentation is small, the structural complexity is reduced, and the landscape patches are regularized, artificial, and centralized; PLADJ and AI showed an overall trend of increase, indicating that the connectivity between patches was good, that is, different types of RSEI had obvious agglomeration; COHESION was close to 100, indicating that the cohesion between patches was relatively good; PLAND and DIVISION kept basically stable. The indexes of each grade area are consistent, which indicates that the ecological environment of the study area is in good condition.

Overall, the ecological environment quality of the Kalajun-Kurdening world natural heritage site showed an upward trend from 2006 to 2019 without large-scale deterioration of, maintaining in good condition.

Conflict of Interest

The authors declare no conflict of interest.

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