Assessment of Ecosystem Service Quality and Its Correlation with Landscape Patterns in Haidian District, Beijing

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Abstract: Landscape architecture with urban green space as the main research object is an evidence-based science. It is an important issue to optimize green space systems from the point of view of ecosystem services. In this paper, high-resolution (1.5 m resolution) remote sensing images are combined with data-processing software, such as ENVI, ArcGIS, and Fragstats, to evaluate ecosystem service quality and compute the landscape pattern in the Haidian District (Beijing, China), so that the relationship between the ecosystem service quality and landscape pattern can be quantitatively studied and a strategy can be provided for green space optimization in cities. The following conclusions are drawn: (1) for the evaluated quality of 14 ecosystem services in Haidian District (refer to Section Analysis of the Association of the Percentage of Patches (PLAND) Index of Forest Land and Quality of Ecosystem Service in Haidian District). Forest land is the main provider of the ecosystem service in Haidian District, while construction land only provides cultural services; (2) on the whole, the spatial distribution of the ecosystem services in Haidian District gradually decreases from the west to the east, which basically matches with the spatial distribution of the forest land. The regulating service and supporting service are matched with the distribution of the urban green space. The cultural service is closely associated with history resource points; and (3) the analysis results of the association between landscape pattern and ecosystem service quality show that the percentage of patches (PLAND) index for forest land has a significant logarithmic relationship with the regulating service and supporting service. The critical value of the PLAND index is 30. Besides the Xishan area with the most coverage of forest land, the landscape shape index (LSI) of the brushwood has a logarithmic relationship with the ecosystem service quality. The critical value of the LSI value is 50. Finally, this paper proposes an area optimization strategy of green space in Haidian District from the view of the ecosystem system service. The Xishan area is classified into the ecosystem red line to control city expansion. The regulating and supporting services can be enhanced in the north flat area by improving the patch shape index. The ecosystem service capabilities can be improved by adding the forest land in the existing green space for the southeast urban areas.

Keywords: ecosystem services quality; assessment; landscape pattern; correlation; optimization strategy; Haidian District

1. Introduction

Ecosystem services (ES) are considered to be the benefits obtained by human beings from an ecosystem. ES are generally divided into four categories: supply services, regulating services,
supporting services, and cultural services [1]. As a bridge between human beings and nature, ecosystem services have attracted more and more attention from urban construction scholars, especially for the construction of urban green space dominated by both natural attributes and human factors.

In this study, the “China National Knowledge Internet” and “Web of Science” were searched using “greenspace* ecosystem service*” as keywords, and a total 157 references were retrieved. These research works mainly focus on research progress of ecosystem service functions [2–12], the association between ecosystem services and landform evolution [13–20], and evaluation method of ecosystem services [21–48]. Meanwhile, research on applications in urban construction and practices is scarce. In the evaluation method and application, Burley proposed the multi-model habitat suitability procedure in landscape planning, then from the micro and macro level did some experiments. For example, nineteen species were studied to proposed landscape modifications and configurations in the Red River Valley, then prioritize protection levels [49]; through the impact of soil characteristics on different plant productivity in post-mining landscape configuration in Clay County, Burley addresses the development of a vegetation productivity equation for predicting plant growth potential, which provided specific guidance with landscape planning [50]. Loures focus his research on the built environment and its artificial components. Greenspace in city is recognized as strategic planning elements for achieving sustainable development, which is extremely important for citizens’ quality of life, contributing to increase land value and sustainable city development [51]. In term of research in Beijing, Cui and Xu proposed the concept of “Ideal Forest Land Equivalent” to evaluate ecosystem services of green spaces in Beijing City and give corresponding enhancement strategies for urban construction [52]. Feng studied layout optimization of agricultural lands in the flat areas of Beijing City by using the ecosystem service value [53].

In recent years, affected by urbanization, urban green spaces have been encroached on massively, so that the area of green space has decreased quickly, is of low quality, and has a chaotic layout. Consequently, the urban ecological environment is threatened and the ecosystem service is also severely affected. Therefore, quality improvement and layout optimization have become main research topics for the improvement of ecosystem services under the prerequisite of no growth of green space. This paper tries to divide research units in Haidian District and study the relationship between the ecosystem service quality and landscape pattern, in order to provide a basis for urban green space system optimization from the ecological point of view and provide feasible strategies for the improvement of urban ecosystem.

The United Nations Millennium Ecosystem Assessment (MA) regulates that the ecosystem services include supply service, regulating service, cultural service, and supporting service. Haidian District is located in the central area of Beijing City, China, and mainly depends on external systems to provide resources such as substances and energy, and does not supply substances by its self. Therefore, the supply service of substances and resources such as food and water is not regarded as the main content of the green space. This paper mainly studies the regulating service, supporting service, and cultural service of Haidian District.

The regulating service involves regulating the human ecological environment, including the regulation and control of floods, droughts, land deterioration, diseases, carbon fixation and oxygen release, cooling and humidifying, air purification, and water conservation. The carbon fixation and oxygen release service is implemented based on two principles. The first principle is to absorb and fix the CO$_2$ via plant photosynthesis and growth function. The second principle is to reduce the CO$_2$ release from fossil fuels by direct CO$_2$ absorption from plants and soils or tree shade and evaporation [54]. Cooling and humidifying are indicated in terms of two aspects. The first aspect is the tree shadow. The research results show that 20–50% of heat will be reflected to the air and 35% of heat is absorbed by tree crowns when sunlight is radiated to crowns. The second aspect is evaporation from green lands. When water is vaporized, it absorbs much energy [55]. The air is purified mainly via absorption of plants, including chemical absorption and physical absorption. Some harmful gases, such as sulfur dioxide, oxynitride, and hydrogen fluoride will mainly form organic materials via
chemical action. Some solid particles, such as dust and powder, are mainly blocked, filtered, and absorbed by leaves, especially plants with seta, fluffy, and coarse leaf surface, and plants with oil and grime on the leaf surface have better effect [56]. Urban green spaces intercept rainfall, suppress evaporation, reduce surface runoff, and increase the underground runoff to conserve contents under common action of plants, soil, and weather, and the water conservation capabilities can be quantified by regulating water capacity [57].

The supporting service is an elementary function required to ensure other ecosystem service functions, and it can influence human beings in an indirect or long-term action, e.g., soil formation, nutrient circulation, and soil conservation. The soil conservation is based on the following principle: The living mulch and withered and fallen substance layer will intercept rainfall to reduce the flushing of water drops on surface soils and corrosion of surface runoff. The plant root system can conserve soils, avoid the collapse and effusion of soils, reduce soil fertility loss, and improve soil structure [58].

Cultural service indicates intangible interests, entertainment, spiritual feeling, and aesthetic experience acquired by people from the ecosystem. Cultural services are very subjective and are difficult to evaluate quantitatively. With the development of technology and the generation of big data, partial experts and scholars evaluate ecosystem cultural services by using the point of interest (POI) of photos.

2. Materials and Methods

2.1. Haidian District Overview

The Haidian District is located in the northwest area of the central area of Beijing City (Figure 1) and has an area of 430.8 km². The Haidian District has a semi-humid continental monsoon climate of a warm temperate zone. The average annual rainfall is 585 mm. The district is located at the crossing point between the edge of the northern North China Plain and the Taihang Mountains and includes the mountainous areas in the west with over 100 m elevation and the east plain. Haidian District includes about 10 large and small rivers, and the green coverage is 52.2%. The Haidian District is located at the combination belt of a shallow mountainous area, plain area, and urban constructed area, and has rich green space and a diversified landscape pattern. This district has historical cultural resources, with “Three Hills and Five Parks” as the core, and has very high ecological, cultural, and social value.

![Figure 1. Map showing the location of Haidian District.](image_url)

2.2. Method

A variety of technical methods and means were adopted in the study, and the specific technical recording route is shown in Figure 2.
Remote Sensing Interpretation
- using supervision classification in the ENVI 5.3 software
- usingibo grids in the ArcGIS software

PLAND (Percentage of Landscape)
- \[ PLAND = \frac{\sum_{i} s_i}{A} \times 100 \]
- \( s_i \) = area (m²) of patch type (class) i.
- \( A \) = total landscape area (m²).

IJI (Interspersion and Juxtaposition Index)
- \[ IJI = \frac{\sum_{i} \sum_{j} m_{ij}}{\ln(m-1) \sum_{i} s_i} \times 100 \]
- \( m_{ij} \) = total length (m) of edge in landscape between patch types (classes) i and k.
- \( m \) = number of patch types (classes) present in the landscape, including the landscape border, if present.

LSI (Interspersion and Juxtaposition Index)
- \[ LSI = \frac{0.25 \sum_{i} s_i}{A} \]
- \( s_i \) = total length (m) of edge in landscape between patch types (classes) i and k, includes the entire landscape boundary and some or all background edge segments involving class i.
- \( A \) = total landscape area (m²).

Analysis of the association between the landscape pattern and quality of the ecosystem service in Haidian District

Figure 2. The technical route on the study.
2.2.1. Data Sources and Processing

A high-resolution (1.5 m resolution) remote sensing image of the GF-2 satellite taken on 12 September 2015 was used as the data source (images purchased from the China Resources Satellite Application Center were processed by the Beijing Changdi Friends Mapping Technology Center). Geometric correction, radiometric calibration, and atmospheric correction were performed in pre-processing (Figure 3). The supervision classification in the ENVI 5.3 software (Harris Geospatial Solutions, Broomfield, CO, USA) is used to explain green space in Haidian District. With Classification of Land Utilization Conditions as the classification reference, and by combining actual conditions in the research area, the green space in Haidian District can be divided into forest land, brush, grassland, water area, construction land, and other lands. The explanation standards are shown in Table 1.

![Figure 3. The high-resolution (1.5 m resolution) remote sensing image of Haidian District obtained by the GF-2 satellite.](image-url)
| Type of Land Coverage | Determination Mark | Picture |
|-----------------------|-------------------|--------|
| Forest land           | Located in mountainous areas. The image is deep red, grainy, and has even texture. |
| Brush                 | Mainly located at the foot of hills and inside the city. This image includes deep red and shiny red and is grainy. |
| Grasslands            | Its area is small inside the city. The image is shiny red. |
| Construction land     | Distributed in the constructed urban area. The image is cyan and has distinctive geometric features. |
| Water area            | The image is deep cyan and has a distinctive boundary and fine texture. |
| Other lands           | Mainly located outside the city. The image is light gray and white. |
2.2.2. Division of Research Units

In order to study the relationship between the ecosystem service quality and landscape pattern in Haidian District, the picture was evenly divided into $4000 \times 4000$ m fishnet grids in the ArcGIS software (ESRI, Redlands, CA, USA), and a total of 42 research units were obtained (Figure 4) to study the relationship between the ecosystem service quality and landscape pattern. Compared to the administrative area division, terrain, landform, and urbanization, the grid division can eliminate influences such as man-made management and natural features, and data results are not objective.

2.2.3. Computing Method of Ecosystem Service Quality

The service quality evaluation method is a quantitative method that is frequently used for the analysis of ecosystem service, and which can objectively show structures, functions, and ecology of the ecosystem. In this paper, the carbon fixation and oxygen release, cooling and humidifying, air purification, water conservation, soil fixation and fertility conservation functions are selected, according to forest ecosystem service function evaluation specification (LY/T1721-2008) issued by the State Forestry Bureau, by combining related research work of Wu [59]. The service quality evaluation index system of the ecosystem service in Haidian District is constructed according to actual data from Beijing City.

The cultural services are expressed by using the number of POI photo with coordinate information. Flickr (SmugMug, San Francisco, CA, USA) is the largest image sharing website in the world and includes detailed geological information and text labels. Wang [60] analyzed the attraction degree of the landscape based on the Flickr website. Luo identified the scenes based on the Flickr website [61]. Xue [62] evaluated the terrain of a tourist destination based on the Flickr website. For the photographic data analyzed in this paper, the photo number is used to express the cultural service capabilities. The specific steps are as follows: download images with geological coordinate information by using the Flickr Application Programming Interface (API); select labels such as “outdoor” and “landscape”;
remove unrelated photos; and, finally, obtain 3363 scene photos from Haidian District, Beijing City, and express the cultural service capabilities by using the number of photos.

2.2.4. Computing Method of Landscape Pattern

The Fragstats 4.2 software (Oregon State University, Corvallis, OR, USA) was used to analyze the landscape pattern based on the interpreted data. According to the research results of Cen [63], three landform indices of the patch type level are selected for analysis, including percentage of landscape (PLAND) index, interspersion and juxtaposition index (IJI), and landscape shape index (LSI), for forest land. The PLAND index indicates the percentage of the patch in the landscape and describes the quality characteristics of the research area. The IJI index is used to express the general distribution of the landscape. A higher value indicates that the alternate occurrence law of different patches is more significant, and the types are distributed. The LSI shows the complexity of the shape.

3. Results

3.1. Quality of Ecosystem Services in Haidian District

3.1.1. Total Service Quality of Ecosystem Service

The land coverage data for Haidian District in 2015 (Figure 5), whose interpretation precision is over 80%, shows that the total area of the forest land, brush, grassland, water, and other lands is 23.7 km², which is 56% of the total area of Haidian District. The area of forest land is 12 km², which is half the total area of green space. The area of brush and grassland is basically the same, and the percentage of water is smaller. On the whole, the total green space in Haidian District is rich and mainly includes forest land.

After calculation, the total quality of the ecosystem service in Haidian District in 2015 is described as follows: For regulating service, the carbon fixation capacity and oxygen release capacity are 92, 339, 108 kg, and 247, 206, 505 kg, respectively. The cooling capacity and humidifying capacity are 1, 178, 705, 379, and 417, 718, 842, and 3 kg, respectively. The sulfur dioxide, oxynitride, and hydrogen fluoride capacity of the purified air are 2, 368, 389, and 597 kg, 129, 312, and 450 kg, and 4, 19, and 51 kg, respectively. The stagnant dust capacity is 313, 202, 416, and 986 kg. The regulation water capacity is 14, 544, 419, and 439 kg. For the supporting service, the soil fixation capacity is 614, 729, and 832 kg. The nitrogen, phosphor and potassium retention capacity in the soil conservation are 101, 430, and 422 kg, 7, 991, and 488 kg, and 88, 521, and 96 kg, respectively. For the cultural service, total photo is 3, 363. The quality for the ecosystem services of different land coverage types are shown in Table 2. Forest land is the main provider of the ecosystem service in Haidian District, and the quality of its services is over half. The construction land only provides cultural service.
After calculation, the total quality of the ecosystem service in Haidian District in 2015 is described as follows: For regulating service, the carbon fixation capacity and oxygen release capacity are 92,339,108 kg, and 247,206,505 kg, respectively. The cooling capacity and humidifying capacity are 1,178,705,379, and 339 KJ, and 417,718,842, and 3 kg, respectively. The sulfur dioxide, oxynitride, and hydrogen fluoride capacity of the purified air are 2,368,389, and 597 kg, 129,312, and 450 kg, and 4,19, and 51 kg, respectively. The stagnant dust capacity is 313,202,416, and 986 kg. The regulation water capacity is 14,544,419, and 439 kg. For the supporting service, the soil fixation capacity is 614,729, and 832 kg. The nitrogen, phosphor and potassium retention capacity in the soil conservation are 101,430, and 422 kg, 7,991, and 488 kg, and 88,521, and 96 kg, respectively. For the cultural service, total photo is 3,363. The quality for the ecosystem services of different land coverage types are shown in Table 2. Forest land is the main provider of the ecosystem service in Haidian District, and the quality of its services is over half. The construction land only provides cultural service.

Figure 5. The green space interpretation for Haidian District.
Table 2. Quality of ecosystem services of different land cover types.

| Land Use and Land Cover Type | Carbon Fixation And Oxygen Release | Soil Fixation Capacity | Fertility Conservation Capacity | Landscape Quality |
|------------------------------|------------------------------------|------------------------|--------------------------------|------------------|
| Non-utilized land            | 0.00                               | 0.00                   | 0.00                           | 0.00             |
| Brush                        | 19,180.28                          | 51,348.66              | 200,744,800.46                 | 245,371,400.10   |
| Construction                 | 0.00                               | 0.00                   | 0.00                           | 0.00             |
| Forest land                  | 56,440.90                          | 151,101.28             | 785,154,576.94                 | 4,537,835.76     |
| Grassland                    | 14,546.55                          | 39,408.01              | 131,111,268.57                 | 15,759,32.23    |
| Water area                   | 2571.38                            | 6348.56                | 61,303,263.82                  | 576,579.58      |

Table 3. Quality of ecosystem services of unit areas of research units.

| UNIT | Carbon Fixation And Oxygen Release | Soil Fixation Capacity | Fertility Retention Capacity | Landscape Quality |
|------|------------------------------------|------------------------|------------------------------|------------------|
| Z01  | 98.86                              | 26.46                  | 1,080,370.95                 | 16,339.14       |
| Z02  | 644.02                             | 1724.16                | 824,534.47                   | 78,939.93       |
| Z03  | 1339.69                            | 3637.43                | 18,922,395.65                | 34,936.95       |
| Z04  | 110.22                             | 295.09                 | 1,536,790.67                 | 27,766.80       |
| Z05  | 992.03                             | 2655.82                | 11,897,912.59                | 147,570.93      |
| Z06  | 1754.57                            | 4697.27                | 20,826,206.51                | 2,360,797.47    |
| Z07  | 1159.69                            | 3104.67                | 15,638,070.60                | 2,012,734.15    |
| Z08  | 272.68                             | 730.01                 | 3,596,599.99                 | 3,149,254.21    |
| Z09  | 1017.63                            | 2724.30                | 13,628,418.84                | 7,499,527.02    |
| Z10  | 2444.64                            | 6544.69                | 30,499,332.87                | 8,463,897.41    |
| Z11  | 2475.51                            | 6627.34                | 33,885,723.79                | 6,184,853.58    |
| Z12  | 1254.29                            | 3337.93                | 16,053,166.64                | 4,297,271.60    |
| Z13  | 823.75                             | 2210.62                | 10,820,779.16                | 1,211,213       |
| Z14  | 39.03                              | 104.48                 | 508,925.66                   | 154,174.37      |
| Z15  | 11.04                              | 29.54                  | 52,293.31                    | 799.46          |
| Z16  | 4306.32                            | 11,528.72              | 58,485,244.22                | 2,254,90       |
| Z17  | 3445.06                            | 9222.98                | 49,908,336.01                | 133,179,818.7   |
| Z18  | 2413.15                            | 6460.81                | 33,359,198.32                | 15,028,203      |
| Z19  | 1804.30                            | 4830.40                | 23,652,766.43                | 11,478.61      |
| Z20  | 841.79                             | 2253.95                | 11,003,446.57                | 11,213,109      |

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Table 3. Cont.

| UNIT | Carbon Fixation and Oxygen Release | Regulating Service | Supporting Service | Cultural Services |
|------|----------------------------------|-------------------|--------------------|------------------|
|      | Carbon Fixation Capacity (kg)    | Cooling and Humidifying | Air Purification | Soil Conservation |
|      | Oxygen Release Capacity (kg)     | (kJ)              | Water Retention | Fertility Retention Capacity |
|      | Capacity (kg)                    | Capacity (kg)     | Population      | Capacity (kg)     |
|      | Sulfur Dioxide Absorption Capacity (kg) | Soil Fixation | Nitrogen Retention Capacity (kg) | Phosphorous Retention Capacity (kg) | Potassium Retention Capacity (kg) | Landscape Quality |
|      | Oxynitride Absorption Capacity (kg) | Water Capacity | (kg)              | (kg)              | (kg)              | Quality |
|      | Hydrogen Fluoride Absorption Capacity (kg) | Stagnant Dust capacity | (kg)              | (kg)              | (kg)              |      |
|      | Stagnant Dust capacity (kg)      | Water Retention | (kg)              | (kg)              | (kg)              |      |
|      | Soil Fixation Capacity (kg)      | Population       | (kg)              | (kg)              | (kg)              |      |
|      | Nitrogen Retention Capacity (kg) | Soil Conservation | (kg)              | (kg)              | (kg)              |      |
| Z21  | 4174.34                          | 11,375.79        | 53,256,159.48     | 27,167.69         | 4482.67           | 353.18 | 3912.15 | 0.00 |
| Z22  | 2976.66                          | 7968.99          | 38,109,493.67     | 19,447.45         | 3208.83           | 252.82 | 2800.43 | 0.04 |
| Z23  | 2280.10                          | 6104.20          | 25,808,837.66     | 15,414.64         | 2541.76           | 200.26 | 2218.27 | 0.00 |
| Z24  | 2065.43                          | 5329.48          | 20,862,880.06     | 2041.24           | 2247.01           | 177.04 | 1961.03 | 0.01 |
| Z25  | 1720.27                          | 4605.44          | 14,941,163.10     | 8790.34           | 1140.41           | 92.87  | 730.19  | 0.02 |
| Z26  | 772.21                           | 2067.34          | 9,685,283.47      | 2218.92           | 1928.53           | 157.90 | 65.92   | 0.00 |
| Z27  | 2280.10                          | 6104.20          | 19,447.45         | 3208.83           | 252.82            | 2800.43| 0.00    |      |
| Z28  | 277.14                           | 741.94           | 5353,896.42       | 1738.43           | 286.84            | 22.60  | 253.33  | 0.00 |
| Z29  | 3409.75                          | 9126.46          | 10,005,657.53     | 21,897.90         | 3613.15           | 284.67 | 3153.30 | 0.01 |
| Z30  | 2,289.91                         | 6130.46          | 22,251,268.25     | 2356.77           | 199.87            | 2213.91| 0.02    |      |
| Z31  | 2368.65                          | 6341.25          | 30,554,575.51     | 21,562.46         | 2567.81           | 202.31 | 2240.99 | 0.02 |
| Z32  | 2120.60                          | 5677.19          | 25,508,689.05     | 13,574.35         | 2536.77           | 199.87 | 2213.91 | 0.02 |
| Z33  | 1336.63                          | 3578.38          | 15,988,469.89     | 14,060.27         | 1673.23           | 131.83 | 1460.27 | 0.00 |
| Z34  | 259.69                           | 695.23           | 2,799,277.97      | 2856.16           | 245.03            | 24.94  | 265.16  | 0.00 |
| Z35  | 19.10                            | 51.13            | 242,718.12        | 19.05             | 0.00              |       |       |      |
| Z36  | 977.37                           | 2616.57          | 11,846,800.72     | 5351,967.99       | 628.62            | 69.29  | 1460.27 | 0.00 |
| Z37  | 965.42                           | 2584.59          | 11,217,703.68     | 2415.03           | 420.98            | 2896.77| 132.29  | 1.72 |
| Z38  | 1967.22                          | 5266.56          | 23,918,451.96     | 628.62            | 69.29             | 1460.27| 0.00    |      |
| Z39  | 2203.63                          | 5899.48          | 27,902,641.09     | 628.62            | 69.29             | 1460.27| 0.00    |      |
| Z40  | 2203.63                          | 5899.48          | 27,902,641.09     | 628.62            | 69.29             | 1460.27| 0.00    |      |
| Z41  | 2203.63                          | 5899.48          | 27,902,641.09     | 628.62            | 69.29             | 1460.27| 0.00    |      |
| Z42  | 2203.63                          | 5899.48          | 27,902,641.09     | 628.62            | 69.29             | 1460.27| 0.00    |      |
| AVG  | 2144.59                          | 5741.41          | 27,375,619.42     | 185.60            | 2053.92           | 0.08   |       |      |
3.1.2. Quality of Ecosystem Service in Unit Area of Research Units

The quality of the ecosystem service of unit area of 42 cells was calculated, and compared with the quality per unit area in Haidian District. The results are shown in Table 3. For the regulating service, the quality of the ecosystem service of units Z10, Z16, Z17, Z18, Z21, Z22, Z23, Z29, and Z31 are more than the average in Haidian District. Except for the regulating water capacity, the quality of units Z18 and Z23 is more than the average. Except for the humidifying capacity, the quality of unit Z30 is more than the whole average. The sulfur dioxide, hydrogen fluoride, and stagnant dust capacity absorbed by units Z11 and Z39 are lower than the average. The water regulation capacity of units Z24 and Z38 is more than the average, which indicates stronger water conservation capability. The quality of the supporting services of units Z10, Z11, Z16, Z17, Z18, Z21, Z22, Z23, Z29, Z30, Z31, Z32, and Z39 is better than the average in Haidian District. The “Three Hills and Five Parks”, important historical cultural resources in Haidian District, are located in units Z11, Z17, Z18, and Z19, and the cultural service capabilities of these four units are far stronger than those of other areas; therefore, the cultural service is closely associated with the historical resource points The ratio of the quality of the units to the average is used for data standardization in research. The total quality of the ecosystem of the area of units is shown in Figure 6. The quality of units Z10, Z11, Z16, Z17, Z18, Z19, Z21, Z22, Z29, and Z31 is higher than the average. The quality of unit Z30 is close to the average of Haidian District. The percentages of the forest land, brush, grassland, water area, construction land, and other lands are 26%, 17%, 12%, 1%, 42%, and 3%, respectively. The quality of the ecosystem service of units Z16 and Z21 is maximal, and the percentage of the forest land in these units is 83% and 61%, respectively.

![Figure 6. Total quality of ecosystem of areas of units.](image)

3.2. Spatial Distribution Features of Ecosystem Service in Haidian District

Figures 7–10 show the quality of the ecosystem service of units after standardization and is divided into five levels by the natural point break method. On the whole (Figure 7), the ecosystem service of Haidian District gradually decreases from the west to the east, and the values of the northwestern units Z16, Z17, Z18, Z21, and Z29 are maximum, which match with the distribution of forest land. The quality of the northern plain (units Z22, Z23, Z24, Z30, Z31, Z32, and Z39) and the southwestern area ahead of hills (units Z10, Z11, and Z19) is followed. The whole share of the green space in these areas is higher. The quality of the ecosystem in the southeastern urban areas is minimal, which is closely related with the share of construction lands, i.e., the urban construction strength. From these data, forest land can be seen to be the significant positive influencing factor for the quality of the ecosystem service in Haidian District, and construction land to be the main negative influencing factor.
The quality of the regulating service (Figure 8) and supporting service (Figure 9) is maximum in the western mountainous area, followed by the northern plain. The quality of the southeastern urban area is minimal, and is basically matched with the distribution of the urban green space. This indicates that the green space area (including forest land, brush, grassland, and water area) is the main factor affecting the regulating service and support service. The cultural service (Figure 10) of “Three Hills and Five Parks” (Z18) is optimal. The cultural service of the southeastern urban area is better than that of the western mountainous area. This indicates that the cultural service is closely associated with the quality and features of the green space. The very high cultural service capability of unit Z18 can significantly improve the quality of the whole ecosystem service.

Figure 7. Quality distribution of ecosystem service of units.

Figure 8. Quality distribution of regulating service of units.
3.3. Analysis of the Association Between the Landscape Pattern and Quality of the Ecosystem Service in Haidian District

The Fragstats software was used to calculate the landscape indices of 42 research units, and the calculated results are shown in Table 4. For the PLAND index, the values of the construction land of units Z13, Z7, Z12, and Z27 are maximal, and are 76.87, 72.26, 69.71, and 65.63, respectively, while the maximal index values of the forest land in units Z17 and Z15 is 61.14 and 58.07, respectively. The LSI values of the brush in units Z11, Z6, Z39, Z30, Z10, and Z33 are maximal, and are 76.23, 75.63, 72.93, 72.39, 71.07, and 70.77, respectively. The IJI index values of the water area in unit Z09 and of other lands in unit Z12 are maximal, and are 89.73 and 86.48. The above data shows that the PLAND index features of the forest lands and construction lands in research units are significant and the percentage of the forest lands is very different from that of the construction lands in units. The LSI features of the brush are significant, which indicates that the shapes of the brush patches are the most complicated in
the research units. The LJI indices of water areas and other lands are significant, which indicates that the water areas and grasslands are distributed sparsely in the research units.

Table 4. Landscape pattern indices of research units.

| UNIT | TYPE             | PLAND 1 | LSI 2  | IJI 3 |
|------|------------------|---------|--------|-------|
| Z01  | Other land       | 0.66    | 5.29   | 71.81 |
|      | Brush            | 14.72   | 19.54  | 55.16 |
|      | Construction land| 69.64   | 13.26  | 67.58 |
|      | Forest land      | 5.46    | 11.91  | 72.18 |
|      | Grasslands       | 9.33    | 15.17  | 61.22 |
|      | Water area       | 0.19    | 2.26   | 51.57 |
| Z02  | Other land       | 2.23    | 20.00  | 71.95 |
|      | Brush            | 4.28    | 49.04  | 62.9  |
|      | Construction land| 77.21   | 28.18  | 66.27 |
|      | Forest land      | 13.26   | 47.24  | 63.00 |
|      | Grasslands       | 2.96    | 37.35  | 69.16 |
|      | Water area       | 0.05    | 4.51   | 68.58 |
| Z03  | Other land       | 2.57    | 26.97  | 63.70 |
|      | Brush            | 4.12    | 56.82  | 72.57 |
|      | Construction land| 66.34   | 33.59  | 61.25 |
|      | Forest land      | 18.26   | 47.24  | 63.00 |
|      | Grasslands       | 5.43    | 50.63  | 73.34 |
|      | Water area       | 3.28    | 6.30   | 71.41 |
| Z04  | Other land       | 13.75   | 3.86   | 22.24 |
|      | Construction land| 58.75   | 2.21   | 65.34 |
|      | Forest land      | 27.50   | 14.11  | 57.18 |
| Z05  | Other land       | 9.20    | 32.51  | 62.00 |
|      | Brush            | 12.68   | 55.30  | 70.40 |
|      | Construction land| 58.28   | 37.07  | 75.19 |
|      | Forest land      | 11.75   | 39.18  | 78.09 |
|      | Grasslands       | 7.40    | 35.58  | 72.89 |
|      | Water area       | 0.68    | 4.41   | 63.95 |
| Z06  | Other land       | 7.00    | 33.61  | 83.14 |
|      | Brush            | 14.07   | 75.63  | 80.46 |
|      | Construction land| 51.07   | 37.20  | 78.86 |
|      | Forest land      | 16.91   | 61.30  | 81.70 |
|      | Grasslands       | 10.88   | 57.06  | 78.14 |
|      | Water area       | 0.08    | 4.52   | 57.40 |
| Z07  | Other land       | 1.11    | 19.08  | 62.11 |
|      | Brush            | 3.78    | 55.73  | 66.61 |
|      | Construction land| 72.90   | 28.59  | 51.11 |
|      | Forest land      | 16.70   | 62.65  | 60.50 |
|      | Grasslands       | 4.03    | 45.95  | 70.93 |
|      | Water area       | 1.49    | 8.39   | 69.60 |
| Z08  | Other land       | 0.47    | 8.92   | 81.27 |
|      | Brush            | 1.02    | 28.35  | 62.46 |
|      | Construction land| 92.67   | 15.67  | 56.01 |
|      | Forest land      | 5.08    | 34.65  | 48.47 |
|      | Grasslands       | 0.70    | 20.23  | 66.29 |
|      | Water area       | 0.05    | 5.78   | 58.57 |
| Z09  | Other land       | 0.63    | 12.90  | 70.82 |
|      | Brush            | 3.73    | 27.61  | 64.29 |
|      | Construction land| 60.03   | 19.32  | 75.67 |
|      | Forest land      | 32.58   | 12.67  | 67.81 |
|      | Grasslands       | 3.02    | 22.10  | 46.53 |
|      | Water area       | 0.0      | 1.22  | 37.76 |
Table 4. Cont.

| UNIT | TYPE          | PLAND ¹ | LSI ²  | IJI ³  |
|------|---------------|---------|--------|--------|
| Z10  | Other land    | 3.69    | 35.47  | 64.50  |
|      | Brush         | 19.51   | 71.07  | 65.47  |
|      | Construction land | 41.04 | 41.86  | 62.22  |
|      | Forest land   | 29.31   | 39.20  | 68.13  |
|      | Grasslands    | 6.13    | 39.65  | 63.47  |
|      | Water area    | 0.34    | 5.53   | 66.49  |
| Z11  | Other land    | 6.78    | 42.92  | 76.93  |
|      | Brush         | 17.16   | 76.23  | 73.49  |
|      | Construction land | 29.15  | 46.22  | 74.22  |
|      | Forest land   | 19.74   | 59.23  | 77.81  |
|      | Grasslands    | 17.00   | 61.61  | 75.86  |
|      | Water area    | 10.16   | 7.61   | 64.43  |
| Z12  | Other land    | 1.37    | 17.36  | 68.83  |
|      | Brush         | 3.76    | 52.12  | 75.55  |
|      | Construction land | 69.71 | 27.17  | 56.17  |
|      | Forest land   | 17.04   | 60.77  | 66.76  |
|      | Grasslands    | 7.50    | 38.24  | 74.70  |
|      | Water area    | 0.61    | 7.24   | 71.63  |
| Z13  | Other land    | 0.64    | 13.10  | 54.00  |
|      | Brush         | 2.55    | 46.25  | 61.54  |
|      | Construction land | 81.42 | 22.31  | 46.99  |
|      | Forest land   | 13.30   | 51.07  | 48.23  |
|      | Grasslands    | 2.09    | 31.59  | 62.93  |
|      | Water area    | 0.01    | 3.53   | 44.49  |
| Z14  | Other land    | 0.73    | 2.83   | 77.26  |
|      | Brush         | 3.26    | 9.80   | 65.93  |
|      | Construction land | 77.45 | 6.17   | 78.75  |
|      | Forest land   | 15.82   | 8.90   | 69.48  |
|      | Grasslands    | 2.74    | 9.02   | 72.13  |
| Z15  | Brush         | 0.39    | 1.27   | 0      |
|      | Construction land | 41.48 | 3.78   | 49.97  |
|      | Forest land   | 58.07   | 1.46   | 70.58  |
|      | Grasslands    | 0.06    | 1.00   | 0      |
| Z16  | Other land    | 1.74    | 25.37  | 66.3   |
|      | Brush         | 3.82    | 44.58  | 66.83  |
|      | Construction land | 39.39 | 30.06  | 72.36  |
|      | Forest land   | 52.36   | 15.65  | 75.41  |
|      | Grasslands    | 2.67    | 27.77  | 43.62  |
|      | Water area    | 0.01    | 1.84   | 67.15  |
| Z17  | Other land    | 2.80    | 23.24  | 73.89  |
|      | Brush         | 9.82    | 58.59  | 70.65  |
|      | Construction land | 20.68 | 28.41  | 64.97  |
|      | Forest land   | 61.14   | 26.42  | 79.77  |
|      | Grasslands    | 5.38    | 36.42  | 56.66  |
|      | Water area    | 0.19    | 3.00   | 72.52  |
| Z18  | Other land    | 2.86    | 28.31  | 80.39  |
|      | Brush         | 7.67    | 65.49  | 77.71  |
|      | Construction land | 40.62 | 34.19  | 71.91  |
|      | Forest land   | 35.95   | 41.70  | 83.50  |
|      | Grasslands    | 8.10    | 47.45  | 82.63  |
|      | Water area    | 4.80    | 8.28   | 77.04  |
### Table 4. Cont.

| UNIT  | TYPE           | PLAND \(^1\) | LSI \(^2\) | IJI \(^3\) |
|-------|----------------|--------------|------------|------------|
| Z19   | Other land     | 1.26         | 19.18      | 75.62      |
|       | Brush          | 6.75         | 60.58      | 76.18      |
|       | Construction land | 53.82     | 31.35      | 68.00      |
|       | Forest land    | 21.57        | 60.89      | 76.07      |
|       | Grasslands     | 13.27        | 49.66      | 75.18      |
|       | Water area     | 3.33         | 9.19       | 80.47      |

| Z20   | Other land     | 0.80         | 9.71       | 64.46      |
|       | Brush          | 3.61         | 48.89      | 68.00      |
|       | Construction land | 78.21     | 22.55      | 61.80      |
|       | Forest land    | 12.54        | 45.40      | 64.00      |
|       | Grasslands     | 4.05         | 36.16      | 68.03      |
|       | Water area     | 0.79         | 8.38       | 80.11      |

| Z21   | Other land     | 0.17         | 9.79       | 81.42      |
|       | Brush          | 7.56         | 33.29      | 55.43      |
|       | Construction land | 17.15     | 20.68      | 73.75      |
|       | Forest land    | 54.28        | 21.00      | 43.87      |
|       | Grasslands     | 20.85        | 31.27      | 38.91      |
|       | Water area     | 0            | 1.10       | 56.98      |

| Z22   | Other land     | 1.25         | 25.77      | 75.74      |
|       | Brush          | 10.46        | 63.30      | 66.81      |
|       | Construction land | 34.89     | 27.07      | 64.65      |
|       | Forest land    | 41.75        | 32.59      | 68.48      |
|       | Grasslands     | 11.54        | 43.28      | 58.92      |
|       | Water area     | 0.10         | 4.05       | 70.47      |

| Z23   | Other land     | 4.14         | 32.12      | 79.3       |
|       | Brush          | 12.16        | 69.05      | 76.88      |
|       | Construction land | 42.18     | 33.47      | 80.30      |
|       | Forest land    | 31.83        | 42.12      | 83.52      |
|       | Grasslands     | 8.65         | 42.55      | 76.83      |
|       | Water area     | 1.03         | 9.87       | 79.97      |

| Z24   | Other land     | 1.53         | 25.38      | 85.72      |
|       | Brush          | 13.19        | 66.45      | 74.40      |
|       | Construction land | 48.25     | 30.65      | 74.54      |
|       | Forest land    | 24.85        | 41.59      | 82.58      |
|       | Grasslands     | 11.09        | 47.94      | 75.34      |
|       | Water area     | 1.09         | 10.56      | 77.30      |

| Z25   | Other land     | 1.00         | 17.27      | 86.23      |
|       | Brush          | 11.48        | 64.90      | 71.43      |
|       | Construction land | 56.13     | 31.37      | 71.38      |
|       | Forest land    | 18.60        | 41.01      | 74.63      |
|       | Grasslands     | 12.21        | 40.58      | 73.43      |
|       | Water area     | 0.59         | 8.51       | 85.9       |

| Z26   | Other land     | 1.80         | 17.71      | 81.11      |
|       | Brush          | 6.52         | 61.30      | 65.23      |
|       | Construction land | 66.46     | 37.10      | 64.17      |
|       | Forest land    | 13.59        | 62.54      | 59.55      |
|       | Grasslands     | 11.50        | 45.05      | 67.74      |
|       | Water area     | 0.14         | 3.71       | 65.32      |

| Z27   | Other land     | 0.34         | 6.30       | 75.93      |
|       | Brush          | 3.81         | 54.67      | 59.47      |
|       | Construction land | 81.03     | 26.96      | 59.26      |
|       | Forest land    | 10.15        | 55.17      | 50.45      |
|       | Grasslands     | 4.43         | 34.36      | 65.64      |
|       | Water area     | 0.23         | 4.98       | 72.53      |
Table 4. Cont.

| UNIT | TYPE          | PLAND 1 | LSI 2 | IJI 3 |
|------|---------------|---------|-------|-------|
| Z28  | Other land    | 0.19    | 7.16  | 86.48 |
|      | Brush         | 3.77    | 24.65 | 72.16 |
|      | Construction land | 79.70   | 13.84 | 76.01 |
|      | Forest land   | 6.61    | 20.91 | 75.89 |
|      | Grasslands    | 7.79    | 17.07 | 74.05 |
|      | Water area    | 1.93    | 7.00  | 71.89 |
| Z29  | Other land    | 1.36    | 20.30 | 67.91 |
|      | Brush         | 16.19   | 53.69 | 60.01 |
|      | Construction land | 21.40  | 23.51 | 63.30 |
|      | Forest land   | 54.58   | 27.55 | 53.28 |
|      | Grasslands    | 6.46    | 42.68 | 47.44 |
|      | Water area    | 0.02    | 2.33  | 80.08 |
| Z30  | Other land    | 2.51    | 25.43 | 84.94 |
|      | Brush         | 16.96   | 72.39 | 75.23 |
|      | Construction land | 41.78  | 35.48 | 71.48 |
|      | Forest land   | 26.34   | 45.49 | 80.24 |
|      | Grasslands    | 11.61   | 47.93 | 73.9  |
|      | Water area    | 0.80    | 9.14  | 75.18 |
| Z31  | Other land    | 3.41    | 28.62 | 71.28 |
|      | Brush         | 13.50   | 68.49 | 77.8  |
|      | Construction land | 38.33  | 31.50 | 81.03 |
|      | Forest land   | 27.53   | 43.89 | 82.87 |
|      | Grasslands    | 13.81   | 49.84 | 76.46 |
|      | Water area    | 3.41    | 12.14 | 75.42 |
| Z32  | Other land    | 5.30    | 34.84 | 72.40 |
|      | Brush         | 10.76   | 69.86 | 76.61 |
|      | Construction land | 39.31  | 37.89 | 86.12 |
|      | Forest land   | 19.70   | 39.12 | 83.56 |
|      | Grasslands    | 23.02   | 41.24 | 81.32 |
|      | Water area    | 1.91    | 8.47  | 84.55 |
| Z33  | Other land    | 5.46    | 25.44 | 58.27 |
|      | Brush         | 11.97   | 70.77 | 63.58 |
|      | Construction land | 60.34  | 39.33 | 73.77 |
|      | Forest land   | 11.32   | 46.34 | 72.04 |
|      | Grasslands    | 10.56   | 44.27 | 66.33 |
|      | Water area    | 0.35    | 6.61  | 68.59 |
| Z34  | Other land    | 0.16    | 6.52  | 67.95 |
|      | Brush         | 9.67    | 24.17 | 57.96 |
|      | Construction land | 57.61  | 20.82 | 67.87 |
|      | Forest land   | 8.57    | 18.97 | 63.05 |
|      | Grasslands    | 23.93   | 21.21 | 62.07 |
|      | Water area    | 0.06    | 1.21  | 28.38 |
| Z35  | Other land    | 1.97    | 2.57  | 49.8  |
|      | Brush         | 2.75    | 7.69  | 75.92 |
|      | Construction land | 73.61  | 5.64  | 76.48 |
|      | Forest land   | 15.65   | 8.01  | 73.66 |
|      | Grasslands    | 6.01    | 6.57  | 75.51 |
| Z36  | Other land    | 0.20    | 3.70  | 66.07 |
|      | Brush         | 24.45   | 39.98 | 62.19 |
|      | Construction land | 42.54  | 26.83 | 40.74 |
|      | Forest land   | 25.95   | 24.15 | 45.84 |
|      | Grasslands    | 6.86    | 28.59 | 41.42 |
|      | Water area    | 0.0     | 1.17  | 59.21 |
The association between the landscape and quality of ecosystem service in different units was studied. The results show that the PLAND index of the forest land and the LSI of the brush are significantly associated with the quality of the ecosystem service. This paper mainly studies two associations.

3.3.1. Analysis of the Association of the Percentage of Patches (PLAND) Index of Forest Land and Quality of Ecosystem Service in Haidian District

The association between the PLAND index of the forest land and the quality of the ecosystem service in the research units is shown in Figures 11–24. The PLAND index has a significant logarithmic relationship with the regulating service and supporting service, however has no significant association with the cultural service (Figure 24). When the PLAND value is between 30 and 40, the regulating
services, such as carbon fixation and oxygen release, cooling and humidifying, and air purification, Figures 11–19 result. When the PLAND value is more than 40, the growth trend will slow down. The regulation water capacity and soil fixation and fertility retention service (Figures 20–23) will result when the PLAND value is between 20 and 30. When the PLAND value is more than 30, the growth will slow down. It is concluded that the quality of the regulating service and supporting service grows quickly when the forest land area is 30% of the landscape area. When the proportion of the forest land is less than 30%, with growth of the proportion of the forest land, the quality of the regulating and supporting service grows quickly. When the proportion is over 30%, the quality growth will slow down.

**Figure 11.** Association between the percentage of patches (PLAND) index for forest land, and carbon fixation capacity.

**Figure 12.** Association between forest land PLAND index and oxygen release capacity.
Figure 13. Association between forest land PLAND index and oxygen cooling capacity.

Figure 14. Association between forest land PLAND index and humidifying capacity.

Figure 15. Association between forest land PLAND index and sulfur-dioxide absorption capacity.
Figure 16. Association between forest land PLAND index and hydrogen-fluoride absorption capacity.

Figure 17. Association between forest land PLAND index and stagnant dust capacity.

Figure 18. Association between forest land PLAND index and oxynitride absorption capacity.
Figure 19. Association between forest land PLAND index and water regulation capacity.

Figure 20. Association between forest land PLAND index and soil fixation capacity.

Figure 21. Association between forest land PLAND index and oxynitride absorption capacity.
Figure 22. Association between the forest land PLAND index and phosphorous retention capacity.

Figure 23. Association between the forest land PLAND index and potassium retention capacity.

Figure 24. Association between the forest land PLAND index and photo number.
3.3.2. Analysis of Landscape Shape Index (LSI) of Brush and Quality of Ecosystem Service in Haidian District

Figure 25 show the relationship between the LSI of brush of research units and the quality of ecosystem service in the units. The results show that the LSI of the brush and regulating service (Figures 25–33) and supporting service (Figures 34–37) show significant exponential growth trends. The cultural service (Figure 38) grows. When the LSI value is 50, the regulating service and supporting service start to grow quickly. It is concluded that the landscape is optimized with 50 as the critical LSI value. The values of units Z16, Z17, Z21, and Z29 in the curve do not satisfy the growth trend. By studying these four units, they are located in the western mountainous areas, and the proportion of the forest land is high (PLAND values are 52.36, 61.14, 54.28, and 54.58, respectively). The quality of the provided ecosystem service is dominant. At this time, it is not associated with the shape index of the brush patches. Therefore, the research results show that the shape index of the brush is exponentially associated with the quality of the ecosystem service, except in the Xishan area with most forest land in Haidian District, and 50 is also the critical value of the LSI.

![Image](carbon fixation capacity)

**Figure 25.** Association between the landscape shape index (LSI) of brush, and carbon fixation capacity.

![Image](oxygen release capacity)

**Figure 26.** Association between brush LSI and oxygen release capacity.
Figure 27. Association between brush LSI and cooling capacity.

Figure 28. Association between brush LSI and humidifying capacity.

Figure 29. Association between brush LSI and sulfur-dioxide absorption capacity.
Figure 30. Association between brush LSI and hydrogen-fluoride absorption capacity.

Figure 31. Association between brush LSI and stagnant dust capacity.

Figure 32. Association between brush LSI and oxynitride absorption capacity.
Figure 33. Association between brush LSI and water regulation capacity.

Figure 34. Association between brush LSI and soil fixation capacity.

Figure 35. Association between brush LSI and nitrogen retention capacity.
Figure 36. Association between brush LSI and phosphorous retention capacity.

Figure 37. Association between brush LSI and potassium retention capacity.

Figure 38. Association between brush LSI and photo number.
4. Discussion

4.1. Association between Landscape Pattern and Ecosystem Service

Research on the ecosystem of urban green spaces can facilitate the protection of the urban ecological system and improve the residential environment. The quantitative evaluation of the ecosystem is the important prerequisite for the protection and improvement of the ecosystem environment. From the view of the ecosystem service, by studying the association between the landscape pattern and service quality, the quantitative ratio of the land coverage type is the important influencing factor for the quality of the ecosystem service. Tang, Shao et al. [65] studied the quality of the ecosystem service in the southern areas of Guizhou Province, China, and proposed that a higher forest land coverage will indicate better ecosystem service condition. Additionally, Zhang et al. [66] studied the karst region in the northwest of Guangxi Province, China, and found that the forest land and brush are the main providers of the ecosystem service, accounting for about 70% of the total service. Furthermore, Cui and Xu [54] studied different ecosystems in Beijing and found that forest land provides the maximal ecosystem service. This research conclusion is consistent with the results of the present study. A high-resolution (1.5 m resolution) remote sensing image is studied in this paper. The data precision is far higher than that in past research. Therefore, the relationships determined in the present quantitative research are more reliable than those of past research. The research results show that the forest land PLAND index has a significant logarithmic correlation with the regulating service and supporting service, with the critical PLAND index value being 30. When this value is less than 30, with growth of the forest land proportion, the quality of the regulating and supporting service will grow quickly. After 30 days, the quality growth will slow down. According to regulations in China’s “Forest Law of the People’s Republic of China”, the forest coverage rate shall reach 30% in China, which matches the present research results. The present research results show that the more complicated landscape shape index will bring a higher quality of ecosystem service under certain conditions. With Ningbo City, China, as one example, Cen concluded that the complexity of the forest land patch will affect the water conservation and soil conservation. The present research results show that the shape index of the brush is exponentially associated with the quality of the ecosystem service, except in the Xishan area with most forest land in Haidian District, and 50 is also the critical value of the LSI value.

4.2. Optimization Strategy of Green Space in Haidian District

According to the present research results, from the view of the ecosystem service, this paper proposes an optimization strategy for the green space in Haidian District, Beijing City. The ecosystem service functions are better in the western mountainous areas with higher forest coverage. Therefore, these areas should be protected and an ecological red line should be drawn to strictly control city expansion. The regulating and supporting services are better in the northern plain area. Under the prerequisite of protecting the ecosystem, the ecosystem service is further enhanced by improving the patch shape index. The cultural service is better and the regulating and supporting services are worse in the southeast of the city. By referring to the research results, the forest land proportion should be added in the existing green space to improve the ecosystem service capability of the urban area and enhance the service capability of the urban ecosystem.

5. Conclusions

Using a high-resolution (1.5 m resolution) remote sensing image from the GF-2 satellite as the foundation, the quality of the ecosystem service in Haidian District, Beijing, China, was evaluated, and the research units were divided to study the association between the landscape pattern and ecosystem service. The following conclusions are drawn:
The research results show that forest land is the main provider of the ecosystem service in Haidian District, while construction land only provides cultural service. For the total quality of the unit area of the ecosystem service, the quality of units Z10, Z11, Z16, Z17, Z18, Z19, Z21, Z22, Z29, and Z31 is higher than the quality of unit Z30 approximates the whole average in Haidian District;

On the whole, the ecosystem service spaces of Haidian District are divided into the western mountainous area, the northern plain, and the southwestern urban area, and decrease from the west to the east. These are roughly matched with the spatial distribution of the forest land. The regulating service and supporting service are maximum in the western mountainous area, followed by the northern plain. The southwestern urban area has the minimal regulating service and supporting service. This is consistent with the distribution of the urban green space. The cultural service capabilities in the research unit where there are important historical cultural resources in Haidian District—namely, the “Three Hills and Five Parks”—are far stronger than those of other areas. Therefore, the cultural service is closely associated with the historical resource points;

The PLAND index of the forest land has a significant logarithmic relationship with the regulating service and supporting service in the analysis on association between the landscape pattern and ecosystem service quality. The critical PLAND index value is 30. When the PLAND value is smaller than 30, with growth of the proportion of the forest land, the quality of the regulating and supporting service will grow quickly. When the value is over 30, the quality growth will slow down. Additionally, the research results show that the shape index of the brush is exponentially associated with the quality of the ecosystem service, except in the Xishan area with most forest land in Haidian District (the quality of the ecosystem service of the forest land is dominant, and at this time it is not associated with the shape index of the brush spot). The critical LSI value is 50;

Finally, this paper proposes an area optimization strategy for green space in Haidian District, Beijing City, from the view of the ecosystem system service. The Xishan area is classified as the ecosystem red line to control city expansion. The regulating and supporting services can be enhanced in the northern flat area by improving the patch shape index. The ecosystem service capabilities can be improved by adding forest land in the existing green space for the southeastern urban areas.

This paper studies the quality of the ecosystem service, however, does not cover research on biological diversity conservation. This will be studied later. The research results show that the distribution of the regulating and supporting service is roughly the reverse of that of the cultural service. Therefore, it is concluded that the ecosystem services are coordinated and balanced with each other, and the relation mechanism shall be further studied to provide theoretical support for urban construction decisions.

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