SOFM-based Classification of Soil and Water Conservation Regionalization in Jinyun

Tengfei Shi¹,²,³, Nan Tian⁴,*), Nan Wang¹,²,³, Gang Tian¹,²,³, and Mengyin Chen¹,²,³

¹Zhejiang Guangchuan Engineering Consulting Co. Ltd., Hangzhou, Zhejiang 310020, China
²Zhejiang Institute of Hydraulics and Estuary, Hangzhou, Zhejiang 310020, China
³Zhejiang Key Laboratory of Water Disaster Prevention and Reduction, Hangzhou 310020, China
⁴Hangzhou Academy of Forestry, Hangzhou, 310022, Zhejiang, China

Abstract. In this paper, 18 towns of Jinyun were analyzed. Natural conditions (average elevation, relative height difference, and gully density), socio-economic status (population density, and per capita disposable income), characteristics of soil erosion (area ratio of soil erosion, area ratio of soil erosion above moderate), and the present state of soil and water conservation, (vegetation coverage) were calculated. Self-organizing Feature Maps (SOFM) was used for soil and water conservation regionalization. Through the analysis of the 18 towns in Jinyun, two first-order classes and five second-order types were identified. The results showed that the classification results were consistent with the actual characteristics, and the feasibility of using SOFM for classification of soil and water conservation regionalization has been demonstrated through this study.

1 Introduction

The newly revised “Soil and Water Conservation Law” in 2011 clarified the legal status of soil and water conservation planning, and soil and water conservation regionalization, which is one of the basic tasks of the planning, also started simultaneously[1]. Regionalization of soil and water is to divide the area into several water and soil conservation areas based on natural conditions, socio-economic conditions, characteristics of soil erosion, and the current status of soil and water conservation, and to adopt a corresponding development direction (or land-use direction), and a layout of measures to prevent soil erosion for each area[2]. Therefore, soil and water conservation regionalization is an important basis for scientifically carrying out soil and water conservation work and formulating regional soil and water conservation planning[3], and will effectively guide the soil and water conservation planning and work for an extended period of time[4]. It emphasizes the guidance, the general principles, and the direction and approach of soil erosion control. Wang Zhiguo et al[5] studied soil and water conservation regionalization and its application in China, and provided a long-term guide of the country, while county-level regions still lacked in this regard.

SOFM (Self-Organizing Feature Maps) is a self-organizing feature map network proposed by Kohonen in 1981[6-7], which has the ability of topology maintenance and the characteristic of the self-organizing probability distribution and can handle a large number of inaccurate and incomplete ambiguities information, suitable for classifying multidimensional data[8]. Therefore, based on the four categories of indicators, such as natural conditions, socio-economic status, this paper conducts a study on the classification of soil and water conservation regionalization of 18 towns in Jinyun, characteristics of soil erosion, and soil and water conservation status, to provide a new thought and method for the classification of county soil and water conservation regionalization.

2 Survey of the research area

Jinyun is located in the south-central part of Zhejiang Province, northeast of Lishui City, and has jurisdiction over 3 streets (Wuyun Street, Xinbi Street, Xiandu Street), 7 towns (Huzhen Town, Xinjian Town, Shuhong Town, Dayang Town, East Du Town, Dongfang Town, Dayuan Town), and 8 townships (Qili Township, Qianlu Township, Sanxi Township, Shuangxikou Township, Rongjiang Township, Huyuan Township, Fangxi Township, Shijian Township). The total land area is 1503.52km². The landform types are mainly mountains and hills. The rivers in the territory mainly include Hao Creek, Xinjian Creek, and Yongan Creek, etc. All of them are mountain streams with short sources, rapid flows, large runoff, and low natural water storage capacity. The soil is dominated by red soil and yellow soil, and the vertical zonal distribution is obvious. Soil and water loss in the area is mainly caused by large-scale disordered development of cash fruit-land and disturbance of development of production and
construction projects. Landslides, slope disintegration erosion, and soil and water loss in thin stocked land are also the major types of loss.

3 Methods

3.1 Index system construction

This paper focuses on natural conditions (average elevation, relative height difference, and gully density, socio-economic status (population density, per capita disposable income), characteristics of soil erosion (area ratio of soil erosion, area ratio of soil erosion above moderate), and the present state of soil and water conservation, (vegetation coverage) and many other indicators are selected as the classification index system. In this study, a total of 18 townships and 8 index data reflecting water and soil conservation conditions were included to form an 18×8-dimensional data matrix.

3.2 Data processing

SOFM is a neural network clustering method. It performs network training without supervision. It discovers and extracts its intrinsic features from a large amount of input data through the self-organization of the network structure. The input data distribution topology map is formed on the network output node weighted vector space, which reflects a certain distribution rule of the input data, and can automatically cluster the input data distribution topology function, select linkdist in the distance function, and set the neighborhood radius to 1.0 during the learning process until a meaningful map is formed.

(1) Initialization. Given a small initial value, choose the neighborhood radius and learning rate.
(2) Input samples, and normalize the weight input vector X.
(3) Find the minimum Euclidean distance and search for the winning neuron.
(4) Modify the connection weight of the selected neuron and the adjacent neuron.
(5) Provide a new input vector and repeat the above learning process until a meaningful map is formed.

Through training, the winning neuron in the final output layer and the weights in its neighborhood approximate the input vectors, and pattern classification is achieved. For the specific algorithm, please refer to the instruction of the neural network toolbox in Matlab software.

4 Results and analysis

In this study, a total of 18 townships and 8 index data reflecting soil and water conservation conditions were included, forming an 18×8-dimensional data matrix. Table 1 lists all the characteristic values.

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The 8 index data reflecting the soil and water conservation situation are read into Matlab software as a multi-dimensional matrix, and the basic data must be first standardization. Then, enter the Matlab neural network toolbox, select the SOFM network, select hextop in the topology function, select linkdist in the distance function, set the learning rate to 0.1, set the learning frequency to 2000, set the learning rate to 0.02 during the adjustment stage, and set the neighborhood radius to 1.0 during the adjustment stage[11]. The number of neurons in the competition layer starts from S=2 and then increases by 1 until S=10. From different classification results, considering the actual situation of soil and water conservation in Jinyun, when S=2 and S=5, the divided number of categories is significant. Therefore, using the two-level classification method, when S=2, Jinyun is divided into two first-level soil and water conservation divisions; when S=5, Jinyun is divided into five second-level soil and water conservation divisions (Table 2).

Table 2. Regionalization table of soil and water conservation types in Jinyun

| Soil and Water Conservation Regionalization | District | Area (/km²) |
|--------------------------------------------|----------|-------------|
| I-1 Center-Hilly Basin-Living Environment Maintenance Zone | Wuyun St., Xiandu St., Xini St., Shuhong Town | 205.46 |
| I-2 North-Hill Basin-Living Environment and Water Quality Maintenance Zone | Dongfang Town, Huizhen Town | 310.35 |
| II-1 East-Hill Mountain Ecological Maintenance Zone | Qianlu Township, Sanxi Township, Rongjiang Township, Shuangxiou Township, Dayuan Town, Huyuan Township | 339.92 |
| II-2 Southeast-Mountain-Water Conservation Zone | Fangxi Township, Shijian Township, Dayang Town | 228.54 |
| II-3 West-Hill Mountain Ecological Maintenance Zone | Xinjian Town, Qili Township, Dongdu Town | 365.25 |

When the first-level division is adopted, it is divided into two types of zones. The first is the Hilly Basin-Living Environment and Water Quality Maintenance Zone, located in the north-central part of Jinyun; the second is Hill Mountain-Water Conservation and Ecological Maintenance Zone, located in the southeast of Jinyun.

When the second-level partition is adopted, it is divided into five types of zones(Figure 1), and the characteristics of each type are as follows:

I-1 Center-Hilly Basin-Living Environment Maintenance Zone, this zone includes Wuyun Street, Xiandu Street, Xini Street, and Shuhong Town, with a land area of 205.46 km². The regional topography is dominated by hills and basins. This zone is a concentrated area of residential, commercial, and industrial layout in Jinyun, with convenient transportation and developed economy. Therefore, the leading function of soil and water conservation is the maintenance of living environment.
I-2 North-Hilly Basin-Living Environment and Water Quality Maintenance Zone, this zone includes Dongfang Town and Huzhen Town, with a land area of 310.35km². The regional topography is dominated by hills and basins, and Haoxi is the main river. This zone includes Huzhen Town, the sub-center of Jinyun, and Jinyun Industrial Park, so the leading functions of soil and water conservation are living environment and water quality maintenance.

![Zoning map of soil and water conservation types in Jinyun based on the SOFM network.](image)

**5 Conclusions**

1. It is feasible to use the SOFM network model to classify the soil and water conservation regionalization. The two-level classification method is adopted, and the results are finally divided into 2 first-level types and 5 second-level types. The results reflect the leading functions of different water and soil conservation types.

2. When constructing a classification indicator system, indicators are selected from multiple aspects such as natural conditions, socio-economic conditions, soil erosion characteristics, and the present state of soil and water conservation, to avoid errors caused by simply selecting a few indicators to affect the classification results, so that the classification results are more reasonable.

3. The automatic classification method of the SOFM network model is simpler than the traditional mathematical classification method and more objective than the artificial classification method. The final division results also reflect the characteristics of soil and water conservation in various types of zones more clearly, indicating that the SOFM network model is an effective method for dividing soil and water conservation regionalization.

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| Name of the townships | average elevation /(m) | relative height difference /(m) | gully density/ (km/km²) | population density / (person/km²) | per capita disposable income/ (yuan) | area ratio of soil erosion/ (%) | area ratio of soil erosion above moderate/ (%) | vegetation coverage/ (%) |
|-----------------------|------------------------|---------------------------------|------------------------|-----------------------------------|-----------------------------------|-------------------------------|-------------------------------|---------------------------|
| Wuyun St.             | 303.75                 | 377                             | 0.0691                 | 1625.22                           | 21819                            | 16.45                         | 11.96                         | 0.69                       |
| Xiandu St.            | 523.85                 | 839                             | 0.0502                 | 215.56                            | 28164                            | 23.72                         | 18.23                         | 0.6                       |
| Xinbi St.             | 402.82                 | 648                             | 0.0421                 | 1705.17                           | 29400                            | 14.63                         | 8.61                          | 0.61                       |
| Xinjian Town          | 588.5                  | 943                             | 0.4180                 | 396.59                            | 21630                            | 6.05                          | 4.54                          | 0.75                       |
| Huzhen Town           | 688.07                 | 1058                            | 0.3286                 | 354.59                            | 26415                            | 22.63                         | 14.28                         | 0.7                       |
| Dongdu Town           | 521.13                 | 880                             | 0.0855                 | 259.22                            | 26388                            | 9.28                          | 7.76                          | 0.7                       |
| Shuhong Town          | 525.9                  | 807                             | 0.0785                 | 287.38                            | 6198                             | 26.71                         | 22.11                         | 0.67                       |
| Dongfeng Town         | 551.84                 | 841                             | 0.0939                 | 291.75                            | 24321                            | 23.14                         | 17.02                         | 0.72                       |
| Dayuan Town           | 682.21                 | 950                             | 0.0982                 | 254.20                            | 14760                            | 21.78                         | 19.82                         | 0.85                       |
| Dayang Town           | 898.45                 | 1169                            | 0.3273                 | 84.58                             | 15630                            | 12.67                         | 10.81                         | 0.78                       |
| Qili Township         | 523.49                 | 770                             | 0.1106                 | 304.40                            | 18435                            | 5.45                          | 4.39                          | 0.64                       |
| Qianlu Township       | 675.1                  | 944                             | 0.0617                 | 163.37                            | 15960                            | 31.98                         | 20.66                         | 0.78                       |
| Huyuan Township       | 710.08                 | 972                             | 0.0825                 | 229.04                            | 16680                            | 35.85                         | 30.43                         | 0.72                       |
| Shuangxiku Township   | 602.63                 | 708                             | 0.0679                 | 334.83                            | 18300                            | 19.91                         | 17.07                         | 0.82                       |
| Rongjiang Township    | 634.01                 | 837                             | 0.0669                 | 303.58                            | 15234                            | 16.58                         | 14.84                         | 0.7                       |
| Sanxi Township        | 658.13                 | 746                             | 0.0487                 | 180.41                            | 18927                            | 13.72                         | 11.30                         | 0.82                       |
| Fangxi Township       | 575.5                  | 793                             | 0.0817                 | 130.20                            | 16200                            | 11.62                         | 10.41                         | 0.77                       |
| Shijian Township      | 708.59                 | 897                             | 0.0662                 | 142.32                            | 17580                            | 14.06                         | 12.80                         | 0.78                       |