



Fuzzy GMDH Network Algorithm Model for Value Chain Analysis of Sports Industry Development

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ABSTRACT

This article studies the analysis of the sports industry development value chain using the fuzzy GMDH network algorithm model. The sports industry is an important component of the modern service industry, and its development is of great significance for promoting economic growth, improving people's health levels, and promoting social progress. Value chain analysis is an important means to understand the development status of industries and optimize resource allocation. The fuzzy GMDH network algorithm model is based on data mining and machine learning technology, which can extract valuable information by processing and analyzing a large amount of data.

Keywords: Value Chain, Algorithm, Sports Industry Development, Discussion

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1. Introduction

The sports industry value chain generally contains three parts: the value chain, the value chain enterprise relationship and the value production process [1]. The value chain is the performance of the number of enterprises on the value chain, which reflects the matching degree and the situation of the value chain enterprise and the expected value. In the value chain of enterprises, the relationship between each other is cooperation and competition coexist [2]. The relationship between the composition of the value chain and the value chain relationship of enterprises is integrated into an industrial development network. The value production process is the embodiment of enterprise value, including the distribution of production value of resource utilization, which shows the relationship between enterprise input and output of value. Value chain enterprise relationship transforms organic industry network into organic value net [3]. The optimization of the industrial value chain is generally carried out in the different sub-catalogues of three dimensions, such as value chain formation, value chain enterprise relationship and value production process [4]. Each industry's understanding and application of big data must differ, and massive data needs more visualization means to use effectively. Data mining technology mainly involves the main branches of

mathematical statistics, artificial intelligence models, database technology, and visualization research. The research is extensive and a new discipline with multi-discipline, integration and interaction. It is necessary to find potentially useful information from a large amount of data with noise and find the direction of value chain optimization by scientific methods, which will inevitably choose to use data mining technology.

2. State of the Art

Most data mining technologies put forward higher requirements to the users, and the mathematical model will cause quality instability because of human factors [5]. The group method of data handling (GMDH) uses cross, mutation and selection operations and automatically establishes and confirms the model structure in the evolution principle [6]. GMDH algorithm model is a self-organizing data mining method that can achieve the best balance between memory and generalisation functions. It is the most widely used and universal modeling algorithm [7]. The GMDH algorithm has four main features. Firstly, the self-organization is strong, and there is no need to worry about the multiple linearity and correlation of the data variables. The input variables are automatically screened with the best correlation, and the model structure of production is relatively simple (Parsaie A, et al. 2015) [8]. The second is the advantage of global optimization. Under the same conditions, the system’s model is the optimal one, and it can solve the small sample problem well [9]. The third is the objectivity of model selection. With the support of computer-aided technology, the GMDH network only needs input data, operation sequence and calculation standard. The computer can directly control other structural and variable parameters, and the model selection is more objective and accurate [10]. The fourth is the inductive feature of dynamic and static integration.

Industry’s value can be viewed from two aspects: intrinsic value and market value. The intrinsic value is the net present value of cash flow realized by the industry in the foreseeable future, which reflects the industry’s profitability. In the development of a socialist market economy, the free competition market is advocated, so the market value is the unified embodiment of the intrinsic value of the industry. The industry’s value ultimately depends on the future profitability of the portfolio of assets, which is the size of the future cash flow of the industry. Therefore, research on the value chain of the sports industry was carried out in this paper. Mainly starting from the assessment of the value of the sports industry, the establishment of the GMDH model was carried out by grouping methods of data processing to help the sports industry optimize and improve the value chain, promote the quality of sports resources integration, promote the rapid development of the sports industry and lasting benefits in the development of sports industry.

3. Methodology

3.1. GMDH Algorithm

Several publications related to the users’ surveys are found in simulation literature. A dated survey by Kleine 1 and 2 examined users’ views of eleven discrete simulation languages [4]. This survey showed that it was difficult to interpret the results mainly because a few respondents were proficient in more than one language. In addition, the expertise of some respondents was difficult to specify.

GMDH algorithm	
Parameter GMDH algorithm	Nonparametric GMDH algorithm
Combinatorial COMBI	Objective Computer Clusterization OCC Multilayered International MIA
Harmonial Objective System Analysis OSA	Analogues Complexing AC

Table 1. Classification of GMDH Algorithms

GMDH algorithm is a heuristic self-organizing mathematical model proposed based on multilayer neural network theory in the late 60s of last century. It is a combination of data processing methods. It is based on polynomials and uses continuous screening combinations to distinguish nonlinear systems, which have good identifiability for nonlinear systems. The neural network with GMDH organizational structure is a feed-forward neural network, which plays a predictive function mainly in the application and is also known as GMDH neural network. The main principle is that in a system, if there are m variables X_i ($i = 1, 2, \dots, m$) and one output variable y , the K-G polynomial expression results of each fitting trajectory can be obtained according to formula (1). Among them, $a_0, a_i, a_{ij}, a_{ijk}, \dots (i, j, k = 1, 2, \dots, m)$ are the coefficients. This function can describe past data trajectories and can approximate any linear function. It can be seen from the formula that the contribution of each item in the polynomial to the fitting degree is not the same. The system takes advantage of the characteristics of GMDH neural network self-organization, constantly removes the items with less contribution to the fitting degree, and reduces the calculation scale so that the model becomes more concise and practical and the effect is better.

$$y = a_0 + \sum_{i=1}^m a_i x_i + \sum_{i=1}^m \sum_{j=1}^m a_{ij} x_i x_j + \sum_{i=1}^m a_{ijk} x_i x_j x_k + \dots \quad (1)$$

As a feedforward neural network, the main difference between a GMDH neural network and other types of neural networks is that the data training process is formed dynamically, and it will change constantly. When the neuron enters the next level to form a new neuron, the self-organization feature of the network automatically removes the neurons with poor contribution. This makes the number of neurons in each layer not fixed. Figure 1 is the GMDH network diagram. \hat{y} represents the evaluation value of the network. X_{ii} is the input variable i of the first sample, $i = 1, 2, \dots, m$. The m is the number of input variables in the sample. \hat{y}_{jk} is the evaluation value of the k neuron in layer j of the first sample, $k = 1, 2, \dots, m$. r_{jk}^2 is the evaluation index of the k neuron in layer j . The threshold in layer j is R_j .

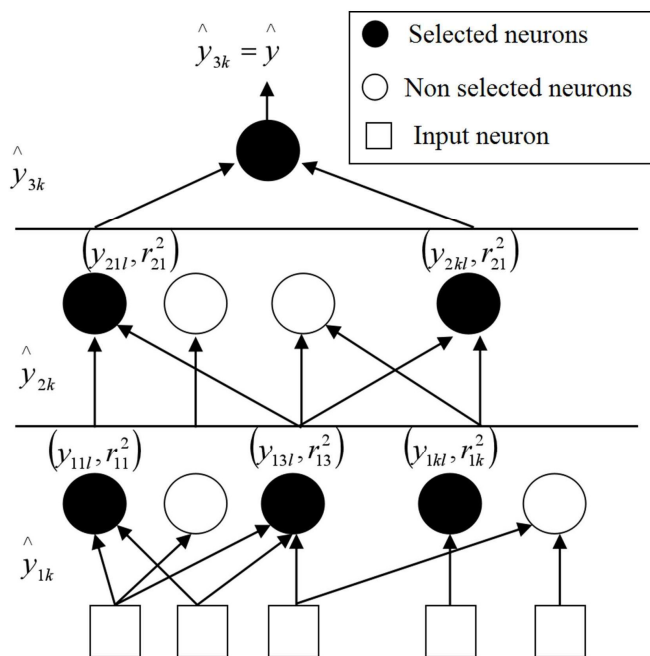


Figure 1. An iterative design model

The basic neuron of GMDH neural network is a dual input and single output structure. A polynomial of two variables and two degrees is used to represent the relationship between the input and the source. Among them, the coefficients a, b, c, d, e, f are mainly determined by the least square method. The unit output here is the same as the content of the lower units. The output of the upper two different units is the input content of the lower unit, and the output variable of the processing unit is the polynomial with two degrees of the input variable. When the number of layers in the network is more than one layer, the polynomial order will be increased by 2. Finally, the network is a multinomial expression of 2k orders. GMDH neural network has shortcomings in practical application, mainly because some structures are unstable. This is because the intermediate variable is increasing at the iteration level, and the goodness of fit with the output variable is higher. This makes the correlation between the variables in the middle too high. The recognition rate of the least two-component systems in nonlinear systems is not very good. This is because its retrieval principle is the use of gradient information, which will have the possibility of going to a local minimum to bring limitations and misleading to searching. To solve these shortcomings of the GMDH neural network, a fuzzy inference model was proposed in this paper to optimize the basic processing unit with the fuzzy inference model.

3.2. Optimize GMDH Algorithm

Reasoning is the process of drawing possibly imprecise conclusions from a data set that is not very accurate. The reasoning in human thinking is often possible and approximate. That is to say, there is a certain degree of fuzziness in human's natural thinking. Fuzziness is a transitional stage, which shows the intersection and integration of things in performance, attributes and other parameters. This is the natural state of the existence of things and an important research content in the study of artificial intelligence. Fuzzy reasoning generally uses two-valued logic or multi-valued logic to complete. Among them, the most important theory is composition rules that the conditional statement "if x is A, y is B" is converted to fuzzy relation proposed by L.A. Zade 70s in the last century. On this basis, the fuzzy theory with different fuzzy logic methods with fuzzy truth values is introduced. Fuzzy inference is introduced to replace the basic processing unit in GMDH algorithm in order to improve the effectiveness of the algorithm.

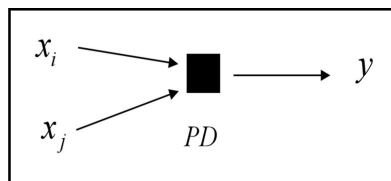


Figure 2. GMDH network basic processing unit

Figure 2 shows a neuron of fuzzy inference GMDH model. The fuzzy model here mainly contains k fuzzy rules. The expression of rule k ($1 \leq k \leq K$) is R_k : If x_1 is A_1^k and x_2 is A_2^k Then y is y^k . Among them, x_1, x_2 stand for input, and y is the input of the model. A_1^k, A_2^k are the membership functions of the input variables x_1, x_2 . The Gauss function is chosen here, shown in formulas (2) and (3). Among them are the parameters of the model.

$$u_{1k}(x_1) = \exp\left\{-\frac{(x_1 - a_{1k})^2}{b_{1k}}\right\} \quad (2)$$

$$u_{2k}(x_2) = \exp\left\{-\frac{(x_2 - a_{2k})^2}{b_{2k}}\right\} \quad (3)$$

Figure 3 shows a normal distribution graph of the Gauss function and it is shaped like an inverted clock. The parameter a is the peak value of the Gauss curve, and b is the corresponding abscissa, and c is the RMS width of Gauss, which controls the width of the function.

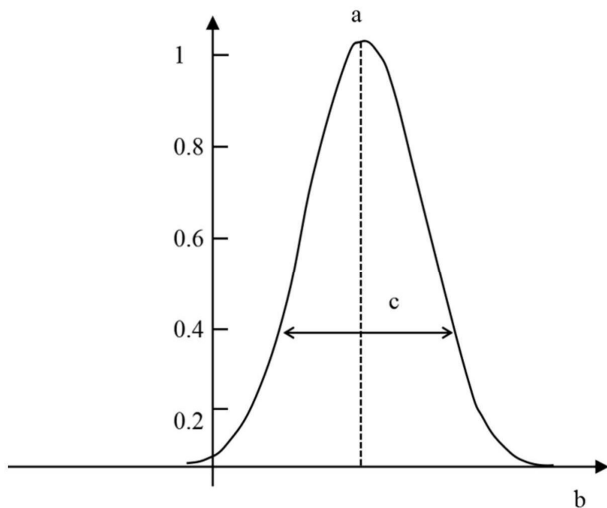


Figure 3. The normal distribution curve of Gauss function

The topological structure of the fuzzy inference model is composed of four layers. The first layer is the input layer, which is the direct connection between the neurons and the input variables. The second layer is the fuzzification layer. All nodes in this layer are divided into k groups, and each node represents the first half of a fuzzy rule. Each node is used to calculate the membership value of the input variable. The fuzzy inference layer in the third layer is mainly applied to the product principle to calculate the excitation intensity of each fuzzy rule. The formula is $u_k(x) = \prod_{i=1}^2 u_{ik}(x_i)$. The defuzzification calculation is carried out on the fourth layer to output the calculated results.

The calculation formula of the input value is $y = \frac{\sum_{k=1}^k u_k(x)\omega_k}{\sum_{k=1}^k u_k(x)}$. The mixed projection method is used

to estimate the parameters of the $a_{1k}, a_{2k}, b_{1k}, b_{2k}$ model here.

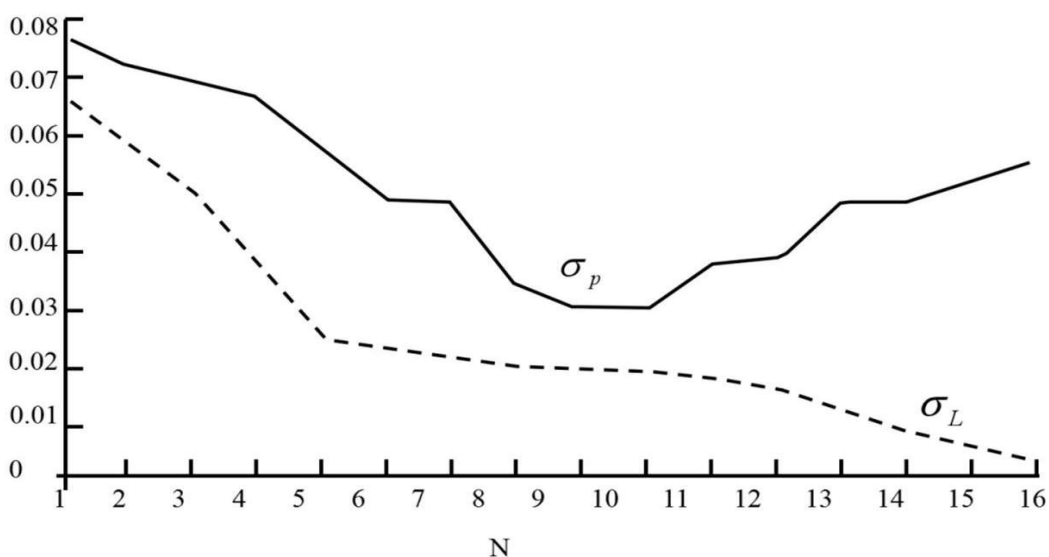


Figure 4. Minimum fitting variance

In the modeling of self-organizing data mining, the training samples are usually divided into different categories. This is to make the generated model have a certain balance in generalization ability and complexity. Prior knowledge must be able to control the complexity of the model effectively. In the modeling of the GMDH algorithm, based on this principle, it is necessary to use the effective external information so that the best model can be selected from the given data sample. The external information here is the information data that has not been used in the parameter estimation of the model. Figure 4 is the least fit variance map. Among them, σ_p abscissa represents the complexity, and the σ_L ordinate is the least fitting square error. The least-square error in the selection data set is the minimum square error in the training set. With the increasing complexity of the model, the number of variables contained in the model and the maximum index of the polynomial corresponding to the model will increase. The minimum squared error calculated in the training data set becomes smaller. It is impossible to determine whether the model has over-fitting or not only by this information, so it is necessary to use the external criterion to calculate the least square error when selecting the excluded training samples. The lowest value σ_p can be obtained, which is the corresponding minimum value. In self-organizing data mining, each step will select many models. When it is not necessary to improve the external criterion at a certain stage, the model is the optimal complexity model can be considered, and the best balance of fitting generalization of training samples can be realized to end the modeling process of the GMDH algorithm.

4. Result Analysis and Discussion

In this paper, based on the basic data of sports industry in M Province, the GMDH algorithm based on optimized value chain was simulated and tested. Construction of fuzzy GMDH network model was carried out based on Knowledge miner 5.0 software. Firstly, sample data collection was carried out. For the value evaluation of the sports industry, the input of the model represents the indicators of the value-driving factors of the sports industry, and the output is the value of the sports industry in the training samples. September 1, 2016, was selected as the basis point, and sports industry-related enterprise data in M province were selected as a sample. The indicators were extracted to get the sample data for this paper. Then, the sample data were pre-processed to map the data to the (0, 1) range. The raw data were normalized to reduce the dynamic changes in the data processing process to increase the effectiveness of the evaluation results. Although the GMDH network has good data recognition and self-organization ability, data can also be trained without being processed; if the input data preprocessing can reduce the process and range of data recognition, the results are more practical and accurate. The formula used in data preprocessing is

$$x_i = \frac{x_i - x_{i,\min}}{x_{i,\max} - x_{i,\min}}$$
 Among them, the x_i represents the data of the i row in any column. $x_{i,\min}$ is the minimum value of all the data in the column in which x_i is located, and $x_{i,\max}$ is the maximum value of all the data in the column in which x_i is located.

$$A: \begin{pmatrix} y_1; x_{11}, x_{12}, \dots, x_{1n}, \\ (y_2; x_{21}, x_{22}, \dots, x_{2n}, \\ \dots \dots \dots \\ (y_s; x_{s1}, x_{s2}, \dots, x_{sn}, \end{pmatrix} \tag{4}$$

$$B: \begin{pmatrix} y_{s+1}; x_{s+1,1}, x_{s+2,2}, \dots, x_{s+1,n}, \\ \dots \dots \dots \\ (y_m; x_{m1}, x_{m2}, \dots, x_{mn}, \end{pmatrix} \tag{5}$$

Based on the construction of GMDH network, the model is applied to fuzzy reasoning. The selected sample data are trained as input and output to establish a fuzzy GMDH value evaluation model. The processed sample data are divided into training samples and test samples. Sample data sequence is set as $\{y_i, x_{ij} \mid (i = 1, 2, \dots, m), (j = 1, 2, \dots, n)\}$. The number of network input signals is n and the output

variable is y , and the input variable is x . The training sample data set A, and the test sample data set B are obtained, shown in formulas (4) and (5). The sequence $\{y_i, x_{ij}\}$ generates the sample set W , which contains data samples with m inputs and outputs, $N_w = m \cdot 80\%$ of them are training samples, and the rest are test sample data. Sample A selects any X_i in the N inputs of the sports industry data. When the input variables are set, the corresponding y can be obtained as the output variable. In the basic processing unit fuzzy reasoning model, $n(n-1)/2$ neurons can be generated. This can get the first layer of the initial network. Screening criteria can be used in neuronal screening. Assuming that that the R_j is the threshold of layer j . When $r_{jk}^2 < R_j$, the neuron is retained as the next input, and the neuron that does not satisfy the condition is deleted. Finally, the value evaluation model of the sports industry established in the form of self-organization based on fuzzy GMDH network can be obtained, which is connected with the output layer directly connected with the neurons retained by the output layer.

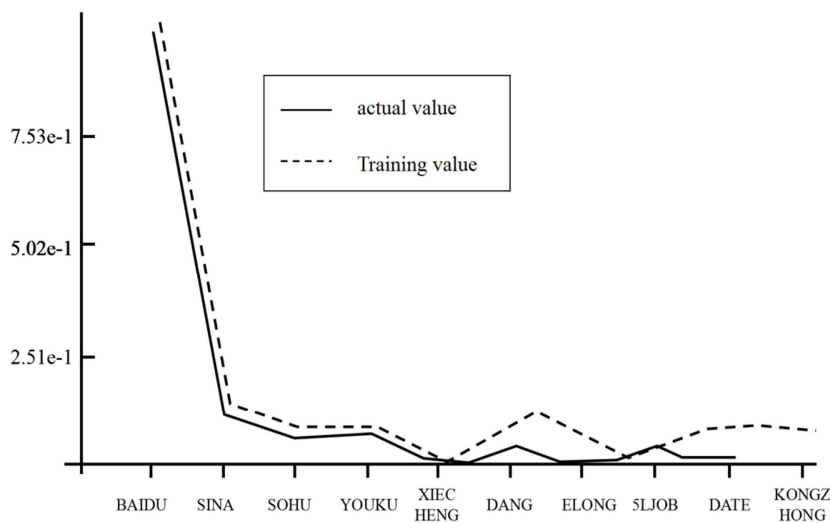


Figure 5. GMDH Comparison of data fitting process

In order to verify the practicability of the model, the basic GMDH network model and fuzzy GMDH network model were selected in this paper for comparative analysis, which provided scientific

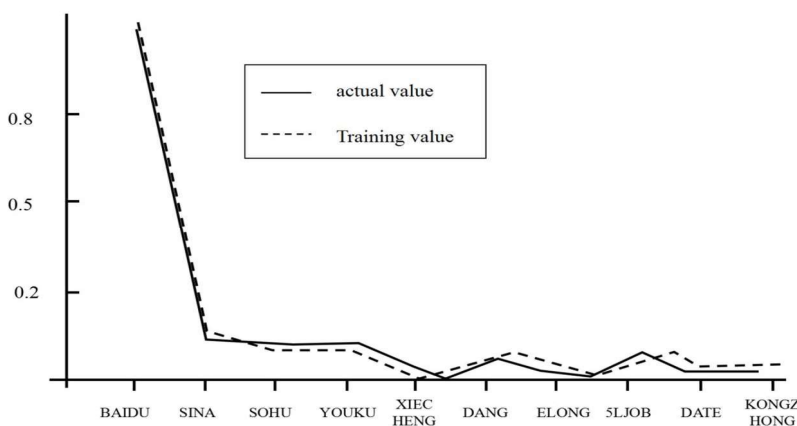


Figure 6. Comparison chart of data fitting process in fuzzy GMDH network model

basis for the study of sports industry development to provide industrial value. The basic GMDH network model is a linear output model. The result is that $y = -6.987e - 2X5 + 9.528e - 1X11 + 3.934e - 2$. The residual square sum of the prediction is 0.321 and the average absolute error percentage is 23.01%. The approximate error variance is 0.0187. The data fitting process is shown in Fig.5. Among them, the solid line represents the actual value, and the dotted line is the training value. It can be seen from the data that the fitting effect is not very good.

In the simulation test, the structure of the fuzzy GMDH network model is $y = -9.815e - 1X12 + 5.7879e - 1$. The predicted value is 0.1785132, and the predicted value after reduction is 445031.1900003. The actual value is 45930.7300001 and the error is -1.95324%. The data fitting process is shown in Figure 6. The solid line represents the actual value, and the dotted line is the training value. It can be seen from the data that the fitting effect is better.

5. Conclusion

The advantages of group method of data handling (GMDH) are that it can actively realize global optimization, adapt to solve small sample data, have strong self-organization and can automatically select and build concise model structure. The high growth of the sports industry determines the uncertainty of the future. The history of the sports industry is not long, and the data are limited, so it is difficult to evaluate and develop the value of the sports industry. Therefore, in this paper, the GMDH algorithm based on an optimized value chain was put forward to study the value of the sports industry to provide a scientific basis for the prediction of its development. Based on the basic structure and process of the GMDH model, the advantages and disadvantages of the algorithm were analyzed. The fuzzy inference was introduced to replace the basic processing unit in the GMDH algorithm to improve the effectiveness of the algorithm. The fuzzy GMDH network was used to simulate the sports industry in M Province, and the degree of fit between the basic GMDH algorithm and the fuzzy GMDH network was compared. The results of this paper are as follows: the fuzzy GMDH algorithm based on the value chain can provide a more accurate prediction and evaluation basis for the development of the sports industry; the prediction accuracy is good, and the gap between fitting degree and prediction value is small. This proves that the study is successful. Of course, the results also show that the algorithm still has improved space. Therefore, further improving the model structure of the GMDH algorithm is the focus of future research.

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