International Conference on Mathematics, Modeling, Simulation and Statistics Application (MMSSA 2018)

Agricultural Production Evaluation and Spatial Correlation Analysis of Townships in Hainan Island

Lu Ye^{1,2}, Maofen Li^{1,2}, Xiaoli Qin^{1,3}, Yuping Li^{1,2*} and Weihong Liang^{1,2}

¹Institute of Scientific and Technical Information, Chinese Academy of Tropical Agricultural Sciences, Haikou 571101, China ² Key Lab of Tropical Crops Information Technology Application Research of Hainan Province, Haikou 571101, China ³ School of Software Engineering, Beijing University of Posts and Telecommunications, Beijing 100876, China *Corresponding author

Abstract—Using principal component analysis, natural breaks, spatial correlation analysis methods, based on the status evaluation, spatial differentiation and correlation of agricultural production of 195 townships in Hainan Island were analyzed, so as to provide a reference for formulating scientific township agricultural plans and policies. The results show that: (1) Townships with better agricultural production are located in cities and counties with better agricultural development. The major factors that affect agricultural production are area of cultivated land, area of facility agriculture, and the proportion of employees in primary industry. (2) Above 45% of townships in the first three levels of agricultural production are distributed in eastern and western cities and counties, and 50% in the fourth level are distributed in central cities and counties. (3) There are spatial agglomerations in areas with similar agricultural production. Meanwhile, some suggestions were put forward to promote the development of agricultural production in Hainan

Keywords—agricultural production evaluation of townships; principal component analysis; natural breaks; spatial correlation analysis; suggestions

I. INTRODUCTION

Agriculture is an important industrial sector of the national economy, and agricultural development is an important support for rural revitalization. As the most advanced grassroots organization in the divisions of administrative areas in China, townships are the basis and focus for solving the problems of agriculture, rural areas and farmers, and balancing urban and rural development. Hainan Province is an important production base of winter melon and vegetable, natural rubber base, southern breeding and producing seed base, tropical fruit and flower base, aquaculture and marine fishing base and regions that are free from specified animal epidemics. Studying the location and spatial correlation of agricultural production in each township in Hainan Island is crucial to manage agricultural problems in contiguous areas adapting to local conditions, and promote rural revitalization. At present, a large number of scholars have studied the spatial distribution characteristics of regional agricultural development. Xu Lian [1] used principal component analysis method to carry out comprehensive evaluation and cluster analysis of agricultural economic development level of counties in Xinjiang, and map spatial differentiation of development level. Guoping Zeng et al. [2] used spatial measurement methods to analyze and study the

spatial correlation, agglomeration characteristics and spatial dynamic evolution trend of agricultural economic development of 31 provinces and regions in China; Jiangxia Hu et al. [3] used geostatistical analysis tools to analyze the overall and partial spatial layout of agricultural development of the 22 districts and counties in Chongqing section of the Three Gorges reservoir area. Most of the scholars have carried out research on regional agricultural production from geographic units at the provincial and county level, and there are few at township level. There is no quantitative research on the agricultural production from geographic units at the township level in Hainan Island. Therefore, with the differences and spatial correlations of agricultural production in Hainan Island as the starting point, the principal component analysis and exploration spatial data analysis methods were used to evaluate status of agricultural production in Hainan Island and analyze its spatial distribution characteristics. Then some suggestions for promoting the agricultural production development of townships in Hainan Island were put forward to provide reference for government decision-making department.

II. DATAS AND METHODS

A. Research Area

Hainan Island is located on the northern edge of the tropics, which has a tropical monsoon climate. The surrounding area of Hainan Island is low and flat, the middle is high, the east is humid, and the west is semi-dry. Hainan Island has an annual average temperature of 22 to 26 degrees centigrade, and annual average rainfall of above 1500 mm, which is known as the "natural greenhouse". The research area involves 195 townships in 17 cities and counties including Haikou City, Wuzhishan City, Wenchang City, Qionghai City, Wanning City, Ding'an County, Tunchang County, Chengmai County, Lingao County, Danzhou City, Dongfang City, Ledong County, Qiongzhong County, Baoting County, Lingshui County, Baisha County and Changjiang County. The spatial and geographical differentiation of townships has formed the differentiation of agricultural production of townships in Hainan Island to a certain extent.

B. Data Source and Index Systems

Following the basic principles of science, system, comprehensiveness and accessibility, 8 indicators are selected



to constitute evaluation index system (TABLE I) including area of facility agriculture, irrigated area of cultivated land, sown area of farm crops, sown area of grain crops, the proportion of employees in the primary industry, number of agricultural technical service agencies, and number of farmer cooperative. By the index system, the agricultural production status of townships in Hainan Island are evaluated, the data used are from "Hainan Township Statistical Yearbook 2017".

TABLE I. EVALUATION INDEX SYSTEM OF AGRICULTURAL PRODUCTION OF TOWNSHIPS IN HAINAN ISLAND

Target layer	Indicator layer					
	Area of cultivated land(hectare)					
	Area of facility agriculture (hectare)					
	Irrigated area of cultivated land (hectare)					
Agricultural production	Sown area of farm crops (hectare)					
	Sown area of grain crops (hectare)					
	The proportion of employees in the primary industry (%)					
	Number of agricultural technical service agencies (PCS)					
	Number of farmer cooperative (PCS)					

C. Research Methods

1) Principal component analysis (PCA): PCA is a multivariate statistical method for dimension reduction that reduces multiple variables into a few principal components (Namely, integrated variables). These principal components can reflect most of the information about the original variables and they are irrelevant, which is useful for analyzing and modeling the problems.

There are many variables about agricultural production development of townships, and the correlation between variables is obvious, which means that some information repeatedly affects. It is easier to get the main influencing factors of agricultural production differences by using PCA. In this paper, the theoretical derivation of PCA is omitted here, but the detailed steps [4] for the application of PCA with MATLAB software are introduced as follows:

- a) Standardize the raw data;
- b) Calculate a matrix R of sample correlation coefficients;
- c) Calculate the eigenvalues of matrix R and corresponding eigenvectors;
- d) Select the important principal component and write the principal component expression

$$F = \lambda_1 X_1 + \lambda_2 X_2 + \dots + \lambda_n X_n \tag{1}$$

Where F represents the score of a single principal component, λ represents the eigenvector of the corresponding principal component, X represents the standardized variables of raw data;

- e) Calculate the scores of each principal component;
- f) Conduct comprehensive evaluation based on the contribution rate of each principal component.
- 2) Natural breaks (Jenks): Natural breaks classification is that set classification breaks on the natural separation between

data packets, and each classification spacing can have its own width, and the number of features in each classification is also different. Statistically, it can be measured by variance. By calculating the variance of each classification and the sum of these variances, the sum of variance is used to compare the quality of the classification. The smallest value is the optimal classification result, that is the theory of Natural breaks classification. This method works well to processing unevenly distributed data, and there are small differences within the classification and large differences between classifications, resulting in an obvious break between each classification and clustering well. These make it the default choice of classification scheme for ArcGIS [5].

3) Spatial autocorrelation analysis: Spatial autocorrelation analysis is an important indicator to measure the degree of interdependence between data at a certain location and data at the other locations, including global spatial autocorrelation and local spatial autocorrelation. The global spatial autocorrelation uses the Global Moran's I index to measure the interrelationship of spatial elements. When the z-score or p-value indicates statistical significance, if the Moran's I index value is positive the clustering trend is indicated; if the Moran's I index value is negative the dispersion trend is indicated. The calculation method is as follows:

$$\frac{\sum_{i} \sum_{j} \omega_{ij} (\mathbf{x}_{i} - \overline{\mathbf{x}}) (\mathbf{x}_{j} - \overline{\mathbf{x}}) / \sum_{i} \sum_{j} \omega_{ij}}{\sum_{i} (\mathbf{x}_{i} - \overline{\mathbf{x}})^{2} / n}$$
(2)

Where x_i and x_j respectively represent the combined scores of township i and township j, \overline{x} is the average comprehensive scores of all townships, n represents the number of townships, and ω_{ij} represents the spatial weight matrix. Local autocorrelation compensates for the neglect of regional heterogeneity by global autocorrelation. Anselin local Moran's I is used to identify spatial clustering and spatial outliers of high or low value elements with statistically significant [6-7].

III. RESULT AND ANALYSIS

A. Evaluation of Agricultural Production of Townships in Hainan Island

The main component analysis is carried out by using MATLAB software with the index data reflecting the agricultural production situation of 195 townships in 2017, and the retention rate of principal component information is set to 90%. As shown in TABLE II, the information content of the first six principal components has accounted for 96% of the total information, which is highly representative of the original data. According to the principal component score coefficient matrix, the linear combination expression of the first six principal components is written as follows:

 $F_1 = 0.4253X_1 + 0.2307X_2 + 0.4588X_3 + 0.5008X_4 + 0.4820X_5$

 $0.1431X_6 + 0.1655X_7 + 0.1561X_8$

 $F_2 \!\!=\!\! -0.4932 X_1 \!\!-\!\! 0.0036 X_2 \!\!-\!\! 0.4409 X_3 \!\!+\!\! 0.3079 X_4 \!\!+\!\! 0.3144 X_5 \!\!-\!\! 0.3609 X_6 \!\!-\!\! 0.1127 X_7 \!\!+\!\! 0.4751 X_8$



 $F_3 = 0.0422X_1 - 0.4259X_2 - 0.0774X_3 + 0.2685X_4 + 0.3349X_5 + 0.6219X_6 - 0.4848X_7 - 0.0694X_8$

 $F_4 \!\!=\!\! 0.1580 X_1 \!\!+\!\! 0.5012 X_2 \!\!+\!\! 0.1279 X_3 \!\!-\!\! 0.1679 X_4 \!\!-\!\! 0.2079 X_5 \!\!+\!\! 0.0410 X_6 \!\!-\!\! 0.6883 X_7 \!\!+\!\! 0.4008 X_8$

 $F_5 \!\!=\!\! -0.1792 X_1 \!\!+\!\! 0.4750 X_2 \!\!-\!\! 0.1597 X_3 \!\!+\!\! 0.1917 X_4 \!\!+\!\! 0.1725 X_5 \!\!-\!\! 0.1496 X_6 \!\!-\!\! 0.2671 X_7 \!\!-\!\! 0.7460 X_8$

 $F_6 = -0.2330X_1 + 0.5298X_2 - 0.1488X_3 + 0.0605X_4 + 0.0302X_5 + 0.6611X_6 + 0.4168X_7 + 0.1659X_8$

According to the linear combination expression of above six principal components, the scores for six principal components of agricultural production of each township in Hainan Island can be calculated. Then the comprehensive scores for agricultural production of each township are obtained through evaluated, and the scores and rankings are shown in TABLE III.

TABLE II. CHARACTERISTIC VALUE AND CONTRIBUTION RATE OF PRINCIPAL COMPONENTS

Component	Characteristic value	Contribution rate	Cumulative contribution rate			
1	2.7668	0.3458	0.3458			
2	1.2359	0.1545	0.5003			
3	1.0651	0.1331	0.6335			
4	0.9658	0.1207	0.7542			
5	0.8468	0.1058	0.8600			
6	0.7998	0.1000	0.9600			
7	0.2209	0.0276	0.9876			
8	0.0990	0.0124	1.0000			

According to the comprehensive scores of 195 townships in Hainan Island in 2017, the three townships with the highest agricultural production scores are Basuo Town, Jinjiang Town, and Liguo Town, separately located in Dongfang City, Chengmai County, and Ledong County. In 2017, the Agricultural output value of Ledong County was 8.542 billion yuan, accounting for 80.15% of the total output value of agriculture, forestry, animal husbandry and fishery in Ledong County, ranking first in Hainan Island. The agricultural output value of Chengmai County was 5.789 billion yuan, accounting for 48.46% of the total output value of agriculture, forestry, animal husbandry and fishery in Chengmai County, ranking fourth in Hainan Island. The agricultural output value of Dongfang City was 4.982 billion yuan, accounting for 71.40% of the total output value of agriculture, forestry, animal husbandry and fishery in Dongfang City, ranking eighth in Hainan Island. The agricultural development of the above cities and counties is better, the wide area of cultivated land and good location conditions of the three townships have accelerated their agricultural development. The three townships with the lowest scores are Haixiu Town, Yinggehai Town, and Chengxi Town, separately located in Haikou City, Ledong County and Haikou City. These townships have very little cultivated land, Chengxi Town is the last, and Yinggehai Town is the third last, and Haixiu Town is the eleventh to last, which restricts their agricultural development. The industry, hotels and catering services of Chengxi Town develop rapidly. Yinggehai Town

mainly develops industry. Haixiu Town is located in the suburb of Haikou City, whose hotels and catering services develop better

B. Spatial Pattern of Agricultural Production of Townships in Hainan Island

With the method of Natural breaks classification, the situation of agricultural production of townships can be divided into four levels in Hainan Island, whose spatial pattern is drawn by ArcGIS software as shown in FIGURE I. The 1st level includes 11 townships, and the proportion of townships in the east, west and central regions respectively are 27%, 55% and 18%. The eastern townships are mainly distributed in Wanning City and Wenchang City, the western townships are mainly distributed in Dongfang City, Ledong County, Chengmai County and Danzhou City, and the central townships are mainly distributed in Ding'an County. The 2nd level includes 41 townships, and the proportion of townships in the east, west and central regions respectively are 37%, 51% and 12%. The eastern townships are mainly distributed in Wanning City and Haikou City, the western townships are mainly distributed in Ledong County, Chengmai County and Danzhou City, and the central townships are mainly distributed in Tunchang County. The 3rd level includes 73 townships, and the proportion of townships in the east, west and central regions respectively are 45%, 37% and 18%. The eastern townships are mainly distributed in Wenchang City, Qionghai City and Haikou City, the western townships are mainly distributed in Danzhou City, Chengmai County, Changjiang County and Lingao County, and the central townships are mainly distributed in Ding'an County and Tunchang County. The 4th level includes 70 townships, and the proportion of townships in the east, west and central regions respectively are 33%, 17% and 50%. The eastern townships are mainly distributed in Haikou City, the western townships are mainly distributed in Lingao County, and the central townships are mainly distributed in Baisha County, Baoting County, Qiongzhong County and Wuzhishan City. Overall, the number of townships in the east and west is more in the first three levels, while the number of townships in the central region is more in the fourth level. The development of agriculture has a tendency of good development in the periphery and backward development in central region.

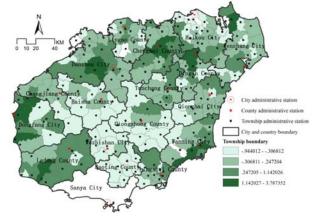


FIGURE I. SPATIAL PATTERN OF AGRICULTURAL PRODUCTION OF TOWNSHIPS IN HAINAN ISLAND



TABLE III. COMPREHENSIVE SCORES FOR AGRICULTURAL PRODUCTION OF 195 TOWNSHIPS IN HAINAN ISLAND

Name												
Town 1989	Name	Score	Name	Score	Name	Score	Name	Score	Name	Score		Score
Basuo Town 2-5163	Jinjiang Town	3.7874	Sigeng Town	0.4393	1	0.1099	Donglu Town	-0.1502	Town	-0.3405		-0.6051
Common C	Liguo Town	2.9300		0.4370		0.0927	Dongge Town	-0.1639		-0.3437	Bangxi Town	-0.6114
Leiming Town 1.5797 Jiazi Town 0.4770 Santun Town 0.0897 Town 0.1700 Town 0.1700 Town 0.1710 Town	Basuo Town	2.6132	_	0.4296	0 0	0.0902	Heqing Town	-0.1657	Xixiu Town	-0.3447	Township	-0.6175
Dingcheng Town 1.5151 Donghe Town 0.4100 Shilu Town 0.0709 Township 0.1848 Qicha Town 0.3663 Township 0.6571	Gancheng Town	1.6120		0.4278	Baoluo Town	0.0890		-0.1756	Town	-0.3448		-0.6209
Sanjia Town 1.4458 Vaxing Town 0.3951 Township 0.0524 Township 0.0531 Township 0.0533 Township 0.0553 Township 0.0553	Leiming Town	1.5797	Jiazi Town	0.4170	Xincun Town	0.0770	Qifang Town	-0.1823		-0.3525	Xinying Town	-0.6339
Sampi fown 1.3469 Hele frown 0.385 Town 0.078 Handro work 0.0201 Feepe Frown 0.385 Township 0.6539	Dingcheng Town	1.5151	Donghe Town	0.4100	Shilu Town	0.0739		-0.1840	Huiwen Town	-0.3663		-0.6371
Dacheng Town 1.3294 Yelin Town 0.3851 Longhu Town 0.0432 Town 0.0408 Zuntan Town 0.3857 Township 0.6539	Sanjia Town	1.4458	Yaxing Town	0.3951		0.0504	Bo'ao Town	-0.1848	Qicha Town	-0.3672	Nanbao Town	-0.6378
Wancheng Town 1.3022	Liji Town	1.3469	Hele Town	0.3858	Fuwen Town	0.0478	Hanlin Town	-0.2051	Fengpo Town	-0.3776	Lingshan Town	-0.6403
Jinshan Town 1.292	Dacheng Town	1.3294		0.3851	Longhu Town	0.0432	Town	-0.2068		-0.3857		-0.6539
Jissua Town 1.1420 Zhongxing Town 0.375 Zhongyuan 0.090 Duowen 0.2201 Town 0.2201 Township 0.0429 Hening Town 0.6587 Town 0.0138 Town 0.0138 Town 0.0215 Datian Town 0.4222 Ronghang Township 0.6694 Town 0.0100 Heshe Town 0.2420 Jiamao Town 0.4488 Jiangbian 0.6753 Zhongyuan 0.0003 Yangjiang Town 0.2431 Longhe Town 0.4488 Jiangbian 0.6753 Zhonghe Town 0.0004 Chahe Town 0.2431 Zhaling Town 0.4603 Baocheng Township 0.6826 Town 0.0004 Town 0.0004 Town 0.2431 Zhaling Town 0.4603 Baocheng Township 0.6854 Town 0.0004 Town 0.0004 Town 0.2431 Zhaling Town 0.4775 Town 0.0004 Town 0.00004 Town 0.0000000000000000000000000000000000	Wancheng Town	1.3022		0.3845	Fushan Town	0.0309	Town	-0.2131	Township	-0.3946	Longtang Town	-0.6573
Foluo Town 1.1238 Puqian Town 0.3083 Yacha Town 0.0138 Wanquan 0.2215 Datian Town 0.4227 Rongbarg Township 0.6694	Jinshan Town	1.2914		0.3737		0.0225	Town	-0.2182	Town	-0.4265	Eman Town	-0.6585
Wulie Town 1.0448 Changpo 0.3039 Changwag 0.0100 Heshe Town 0.2421 Jianga Town 0.4488 Jiangbian 0.6753	Jiusuo Town	1.1420		0.3705		0.0190	Town	-0.2201		-0.4297		-0.6587
Sammenpo Town 0.9491 Shishan Town 0.2846 Fengmu Town 0.0033 Town 0.9491 Shishan Town 0.2846 Fengmu Town 0.0031 Town 0.0041 Chahe Town 0.2431 Longhe Town 0.4693 Baocheng Town 0.6826	Foluo Town	1.1238		0.3083		0.0138		-0.2215	Datian Town	-0.4322	Township	-0.6694
Ruixi Town 0.8761 Xinlong 0.2846 Baimajing 70wn 0.0041 Chahe Town 0.2431 Zhaling Town 0.4739 Qunying 70wnship 70wns	Wulie Town	1.0448		0.3039	Town	0.0100		-0.2420	Jiamao Town	-0.4488		-0.6753
Huangliu Town 0.8741 Town 0.2682 Town 0.0041 Chane flown 0.2432 Zhangh flown 0.4743 Township 0.0854	Sanmenpo Town	0.9491		0.2846	Town	0.0033		-0.2431	Longhe Town	-0.4693	_	-0.6826
Yongfa Town 0.8/47 Benhao Iown 0.2682 Town -0.0046 Ianniu Iown -0.2432 Town -0.47/5 Township -0.6943	Ruixi Town	0.8761		0.2846	Town	-0.0041	Chahe Town	-0.2431	·	-0.4739	Township	-0.6854
Hou'an Town 0.7481 Nada Town 0.2547 Changhua Town 0.000/4 Sanical Town 0.2314 Town 0.4858 Township 0.0470 Township Town 0.7073 Town 0.2547 Town 0.2547 Town 0.2548 Township Town 0.7131 Town 0.2472 Mutang Town 0.0259 Wenluo Town 0.2643 Township Town 0.5026 Zhayun 0.7177 Tuncheng Town 0.7120 Laocheng Town 0.2345 Bohou Town 0.0483 Nanjaio Town 0.6587 Town 0.2234 Dongying Town 0.0483 Nanjaio Town 0.6587 Town 0.1888 Beida Town 0.0483 Nanjaio Town 0.6513 Longquan Town 0.1888 Beida Town 0.0660 Shangen Town 0.6413 Town 0.1880 Jiuzhou Town 0.0689 Town 0.6413 Town 0.1880 Jiuzhou Town 0.0689 Town 0.6102 Yanfeng Town 0.1685 Town 0.1587 Jiale Town 0.0833 Town Town 0.5702 Xinpo Town 0.1587 Jiale Town 0.1008 Yingzhou Town 0.5305 Township 0.7956 Town 0.5305 Township 0.7956 Town 0.5305 Township 0.7956 Town 0.5305 Township 0.7881 Town 0.5305 Township 0.7881 Town 0.5006 Town 0.5006 Town 0.5441 Township 0.7881 Town 0.5006 Town 0.5006 Town 0.5006 Town 0.5379 Jiaji Town 0.1512 Nankun Town 0.1008 Town 0.3150 Town 0.5305 Township 0.7956 Town 0.5379 Jiaji Town 0.1512 Nankun Town 0.1008 Town 0.3150 Town 0.5061 Haixiu Town 0.8873 Town 0.5066 Town 0.5067 Town 0.5067 Town 0.5067 Township 0.08873 Town 0.5068 Town 0.5068 Town 0.08873 Town 0.08873 Town 0.0807 Town 0.0807 Town 0.0807 Town 0.0841 Town 0.08873 Town 0.08470 Town 0.08470 Town 0.0140 Town 0.0127 Dapo Town 0.01280 Town 0.0335 Hongmao 0.0600 Town 0.0600 Town 0.0000 Town 0.04470 Jianfeng 0.1164 Bolian Town 0.1463 Dazhipo 0.3356 Hongmao 0.6000 Town 0.6000 Town 0.0000 Town 0.04470 Jianfeng 0.1164 Bolian Town 0.1463 Dazhipo 0.3356 Hongmao 0.6000 Town 0.6000 Town 0.00	Huangliu Town	0.8747	Benhao Town	0.2682	Town	-0.0046	Tanniu Town	-0.2432	Town	-0.4775	Township	-0.6943
Dalu Town 0.745	Yongfa Town	0.8121	Wenru Town	0.2662	Town	-0.0074		-0.2514	Town	-0.4859	Township	-0.6986
Tuncheng Town 0.7120	Hou'an Town	0.7481		0.2547		-0.0184		-0.2602	Township	-0.4976	Town	-0.7073
Xinxing Town 0.6120 Town 0.2345 Bohol Town -0.0434 Town -0.2734 Town -0.3200 Li an Town -0.7239	Dalu Town	0.7131	Town	0.2472	Mutang Town	-0.0259		-0.2643	Town	-0.5026		-0.7177
Ranking Town 0.6587 Town 0.2234 Town -0.0485 Town -0.2798 Pengial Town -0.3260 Township -0.7260	Tuncheng Town	0.7120	Town	0.2345		-0.0434	Town	-0.2734		-0.5200		-0.7239
Description October	Xinxing Town	0.6587	Town	0.2234		-0.0483	Town	-0.2798	Penglai Town	-0.5260		-0.7260
Clanjia fown Color Clange Clang	Baoyou Town	0.6513		0.1888	Beida Town	-0.0560		-0.2808		-0.5264	Jinbo Township	-0.7375
Wencheng Town 0.5702 Xinpo Town 0.1587 Jiale Town -0.1008 Yingzhou Town -0.3068 Gongpo Town -0.5522 Fulong Township -0.7956	Qianjia Town	0.6413	Town	0.1880		-0.0689		-0.2982		-0.5305	Maogan Township	-0.7881
Zhizhong Town 0.5443 Poxin Town 0.1541 Tanmen Town -0.1073 Tongzha Town -0.3091 Paipu Town -0.5527 Wangxia Township -0.8745	Lincheng Town	0.6102		0.1685		-0.0833		-0.3002		-0.5441	Township	-0.7888
Nanly Town 0.5379 Jiaji Town 0.1512 Nankun Town -0.1083 Huangtong Town -0.3150 Changhao Township -0.5681 Haixiu Town -0.8761	Wencheng Town	0.5702	Xinpo Town	0.1587	Jiale Town	-0.1008	Town	-0.3068		-0.5522	Township	-0.7956
Wanchong Town 0.5215 Hongqi Town 0.1405 Xinzhu Town -0.1134 Wenjiao Town -0.3207 Sandao Town -0.5745 Yinggehai Town -0.8873 Dongcheng Town 0.5069 Lingkou Town 0.1364 DongjiaoTow n -0.1170 Taya Town -0.3235 Huishan Town -0.5845 Chengxi Town -0.9440 Guangpo Town 0.4960 Renxing Town 0.1281 Dafeng Town -0.1280 Xichang Town -0.3262 Longqiao Town -0.5845 Chengxi Town -0.5845 Dongshan Town 0.4911 Damao Town 0.1227 Dapo Town -0.1328 Shibi Town -0.3304 Da'an Town -0.6000 Dongs'ao Town 0.4470 Jianfeng 0.1164 Rolian Town -0.1463 Dazhipo -0.3356 Hongmao -0.6009	Zhizhong Town	0.5443	Poxin Town	0.1541		-0.1073	Town	-0.3091	Paipu Town	-0.5527		-0.8745
Name	Nanly Town	0.5379	Jiaji Town	0.1512	Nankun Town	-0.1083	Town	-0.3150	Changhao Township	-0.5681		-0.8761
Town		0.5215	• .	0.1405		-0.1134		-0.3207		-0.5745		-0.8873
Dongshan Town 0.4900 Town 0.1281 Daireng Town -0.1280 Town -0.3262 Town -0.3363		0.5069	Town	0.1364		-0.1170	1	-0.3235		-0.5845	Chengxi Town	-0.9440
Dong'so Town 0.4470 Jianfeng 0.1164 Bolian Town -0.1463 Dazhipo -0.3356 Hongmao -0.6009	Guangpo Town			0.1281				-0.3262	Town	-0.5845		
	Dongshan Town	0.4911		0.1227	Dapo Town	-0.1328		-0.3304		-0.6000		
	Dong'ao Town	0.4470		0.1164	Bolian Town	-0.1463		-0.3356		-0.6009		



C. Spatial Correlation Analysis of Agricultural Production of Townships in Hainan Province

- 1) Global spatial autocorrelation: With the global Moran's I index, we analyze the global spatial correlation of township agricultural production. In 2017, the global Moran's I index of township agricultural production is 0.2371, the z-score is 5.8894, and the P-value is 0, which indicate that the agricultural production situation of townships in Hainan Island is positively correlated with the spatial distribution, and spatial agglomeration occurs in areas with similar development. That is to say, in the townships with better agricultural production, the agricultural production in nearby townships is also better, and vice versa.
- 2) Local spatial autocorrelation: With the anselin local Moran's I tool, the clustering map for township agricultural production of Hainan Island in 2017 is drawn, and the spatial autocorrelation is further analyzed, as shown in FIGURE II. The High-High region includes 14 townships, mainly concentrated in the area bordering Chengmai County, Ding'an County and Haikou City. The Low-Low region includes 5 townships, mainly distributed around the administrative center of Haikou City, and the area of Dongfang city away from the coastal to the central part. There are 2 townships in the High-Low region, mainly concentrated in Ledong County and Dongfang City. There are 4 townships in the Low-High region, mainly concentrated in Dongfang City and Ledong County.

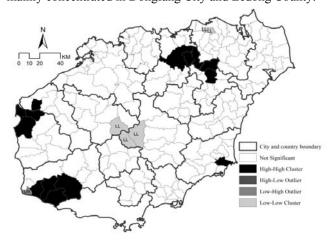


FIGURE II. LISA CLUSTER MAP OF AGRICULTURAL PRODUCTION OF TOWNSHIPS IN HAINAN ISLAND

D. Conclusion

Seen from the above analysis, we can get the following conclusions:

a) The townships with better agricultural production are mostly located in Chengmai County, Danzhou City, Wanning City, Wenchang City and Dongfang City, which have better agricultural development. The factors that have a greater impact on the development of agricultural production are the area of cultivated land, the area of facility agriculture and the proportion of employees in the primary industry.

- b) In Hainan Island, more than 50% of townships in the first level are distributed in the western cities and counties. More than 50% of townships in the second level are also distributed in the western cities and counties. 45% of townships in the third level are distributed in the eastern cities and counties. 50% of townships in the fourth level are distributed in the central cities and counties. Most of townships in the eastern and western are distributed in the first three levels, while most of townships in the central region are distributed in the fourth level.
- c) The agricultural production situation of townships in Hainan Island is positively correlated with spatial distribution, and there is spatial agglomeration in areas with similar development. The townships of High-High cluster are mainly distributed in the area bordering Chengmai County, Ding'an County and Haikou City. The townships of Low-Low cluster are mainly distributed around the administrative center of Haikou City and the area of Dongfang City away from the central part of the coastal area.

IV. SUGGESTIONS ON THE DEVELOPMENT OF AGRICULTURAL PRODUCTION OF TOWNSHIPS IN HAINAN ISLAND

A. Strengthening the Construction of Townships Infrastructure

The township department in Hainan Island should strengthen the infrastructure construction of township social development, break the barriers to urban and rural talent mobility, and improve the quality of township agricultural talents. Strengthening the infrastructure construction of township production is helpful to improve production efficiency. Strengthening the construction of township transportation facilities can help improve the efficiency of agricultural products transportation and the speed of interconnectivity between townships.

B. Exploiting the Advantages of Cultivated Land According to Local Conditions

It is helpful to make full use of existing cultivated land resources, which can actively exert the agriculture production potential of townships with large-scale farmland, accelerate the adjustment of industrial structure, plant superior crops, break the boundaries of counties, concentrate on developing facilities agriculture, increase effective irrigation area, and create efficient agriculture.

C. Actively Promoting the Development of Integrated Industries Such as Leisure Agriculture and Rural Tourism

The township department should actively explore agricultural culture, developing leisure agriculture, rural tourism and other integrated industries, which are good for solving the employment problem of township labor and conducive to personnel and information exchange in urban and rural. Obviously, these are helpful to promote agricultural brands, inherit agricultural culture and expand agricultural functions, so as to improve the comprehensive benefits of agriculture and achieve sustainable development of agriculture.



D. Accelerating the Development of Ecological Recycling Agriculture

Taking ecological recycling agriculture as an important direction to transform agricultural production mode, the township should focus on supporting ecological agriculture recycling projects, comprehensive utilization of livestock and poultry waste, livestock and poultry standardized breeding projects, arable land protection and upgrading projects, etc. which will promote the organic development of agriculture and upgrade supply quality and efficiency of agricultural products.

ACKNOWLEDGMENT

This research is financially supported by Hainan Natural Science Fund "The Analysis on Spatial and Temporal Differences of Social Economy development for Townships in Hainan Province" (717239) and Basic scientific research project of Chinese Academy of Tropical Agricultural Sciences "The Technology Innovation Team on Big Data Research and Service for Tropical Agriculture — Big Data Acquisition and Processing for China Tropical Agriculture" (1630072017001).

REFERENCES

- X. Lian, Evaluation and spatial differentiation of county level agricultural economy development in Xinjiang, Journal of Arid Land Resources and Environment, vol. 30, pp. 73-81, 2016.
- [2] G. P. Zeng, H. Y.Luo and Y. Q. Cao, Spatial distribution and correlation of agriculture economic development in China: Based on the panel data in 1985-2008 of 31 provinces, autonomous region and municipality, Journal of Hunan Agricultural University(Social Sciences), vol. 11, pp. 1-6, 2010.
- [3] J. X. Hu and C. H. Wen, Study on spatial distribution characteristics of agricultural development in the Three Gorges Reservoir Area, based on the statistical analysis of geography, Journal of Henan Agricultural University, vol. 50, pp. 248-253, 2016.
- [4] J. W. Zhuo, Application of MATLAB in Mathematical Modeling, Beihang University Press, September 2014.
- [5] [US] Price, Y. L. Li, etc. ArcGIS Geographic Information System Tutorial (Fourth Edition), Electronic Industry Press, September 2009.
- [6] B. Meng, J. F. Wang, W. Z. Zhang and X. H. Liu, Evaluation of Regional Disparity in China Based on Spatial Analysis, Scientia Geographica Sinica, vol. 25, pp. 11-18, 2005.
- [7] J. Lian, X. J. Li, H. L. Gong and Y. H. Sun, Analysis of Agricultural Economy Spatial Characteristics of Beijing Townships Based on ESDA, Areal Research and Development, vol. 29, pp. 130-135, 2010.