Application of Orange Data Mining Approach of Agriculture Productivity Index Performance in Tamilnadu

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Abstract: This research paper attempts to identify the classification of Agriculture Productivity Index (API) with the help of fourteen major crops of Tamilnadu using four hierarchical clustering methods, viz complete, single, weighted and average linkage methods. The secondary database was collected from the Department of Economics and Statistics for a period of ten years from 2003 to 2012. The crops are categorized as cereals, pulses, oilseeds and cash crops. The states consist of thirty two districts with various agro climatic zones. Agriculture Productivity Index (API) is calculated with the use of Enedyl’s method. In this paper, the Orange data mining software is used which is an open source data visualization and data analysis for learner and experts. Interactive work flows with a large toolbox using Python programming language. In addition, to cross validate the API, the orange data mining hierarchical clustering techniques are used. The results of cluster analysis generated five clusters based on API and they are labelled as Very High, High, Moderate, Low, Very Low. They are plotted in dendrogram and are highlighted with different colours of five clusters.

Keywords: Classification, Agriculture Productivity Index, Orange Data Mining, Cluster Analysis and Dendrogram.

1. INTRODUCTION

Agriculture plays a vital role of Indian economy in past decades. Indian economy has been considered as an agrarian economy with majority of its population in villages having agriculture and allied activities as their primary occupation. So many scholars have stated, in India most of the population gives importance to agriculture because it not only provides food but also the livelihood to more than half of the population. It also supplies lots of goods and raw materials required by the non-agriculture sectors [3]. In short, agriculture plays an important role in the economic development process of India.

The economic development depends on the net agricultural productivity of an area. The productivity refers to the ratio of index of local agricultural output to the index of total input used in farm production [5]. The Agricultural productivity of an area is indicated by Agricultural productivity index (API). Based on this API the agricultural zones are classified into different categories. This classification of zones by API gains importance for its help in policy making. Among the different methods used for classifying the entire districts of Tamilnadu on the basis of API, in this research paper, traditional hierarchical clustering technique with various methods using orange data mining software is used. This software is developed by python programming language and to visualize the clustering methods with help of drawing schema of orange data mining. The Main objectives of the present research paper is (i) to estimate the Agriculture Productivity Index (API) of Tamilnadu and (ii) to classify the API performance using hierarchical clustering methods with the help of Orange data mining.

2. MATERIALS AND METHODS

2.1. Data Collection

The secondary source data was collected from the Department of Economics and Statistics, Chennai during the period of 2002-03 to 2011-12. Initially 31 districts were considered for this study, unfortunately the data available for ten years period consists only of 28 districts and the remaining three districts split up from three main districts for administrative purpose. The data of three districts
are not available for ten years period and are discarded as outliers. In this research paper, fifteen major crops are chosen based on their area, production and yield. The rest of the crops data not available for the study period. The crops are categorized as cereals, pulses, cash crops and oil seeds. Each category consists of various crops and totally fifteen major crops are cultivated in the districts of Tamilnadu and are chosen carefully. The crops are listed as follows, namely, Paddy, Cholam, Cumbu, Ragi, Maize, Bengal gram, Red gram, Green gram, Black gram, Horsegram, Tapioca, Ground nut, Gingely, Coconut and Sugarcane[6] and [7].

2.2. Agriculture Productivity Index

Many researchers have applied in their studies to calculate API index based on Enedy’s method [2]. In this research paper also, API index for twenty eight districts of Tamilnadu is calculated and used. The districts and API index is shown in Table 1. The API is calculated by considering the area of cultivation (Hectare) and production (Tons) of a particular 14 major crops in all twenty eight districts. The following proposed algorithm is used to calculate API:

Step 1: The first part is calculated to give an input matrix of production and area of all the crops in a unit area and are labelled as \( Y \), then divided by production of the selected crops in the entire area (\( Y_n \))

Step 2: The second part is calculated to give an input matrix of cultivation area of the selected crops within the districts (\( T \)) and are divided by the cultivation area of the selected crops within the entire zone.

Step 3: The API is calculated using step 1 divided by step 2 and multiplied by 100.

The formula for API is:

\[
API = \frac{Y}{Y_n} \times \frac{T}{T_n} \times 100
\]

2.3. Data Mining

Data mining is used for data cleaning, data integration, removal of outliers and knowledge discovery. In the recent years data mining applications is used for finance, authorship attribution, text mining, medical science and biological sciences etc. In this study, orange data mining software based on python programming language is used. This software consists of many statistical analysis and give results visually and efficiently. In addition, cross validation of the API using hierarchical clustering methods is used with the help of the following steps. From the orange data mining software, a schema is drawn with utmost care as per the research requirement. The step by step construction of the schema is given below and represented in figure 1.

![Figure 1. Hierarchical clustering Schema for API](image-url)

Step 1: Select file widget and open your database in the form of file like .tab and .xls format.

Step 2: Select a data table widget and connect the file widget, then file widget is connected to distance widget.

Step 3: Select hierarchical widget and connect to distance widget.

Step 4: select one more table widget for assigning cluster output and connect to hierarchical cluster widget.
Step 3: Finally, Double click file, data table widget 1, distance, hierarchical cluster and table widget. All these widget assign their output and display the result to report window.

Step 4: Open distance map widget which shows the two dimensional hierarchical clustering map with the label of all districts (Figure 1).

Step 5: Open hierarchical widget, it shows the first, second, third and fourth method of clustering map based on euclidean distance matrix, each method chosen manually. Finally four visualization of API clustering methods is achieved (Figure 2 to 5).

After these procedures, the results are displayed, that are split into five clusters, two singleton cluster and rest split into three clusters based on their API.

2.4. Clustering Methods

The widget supports four ways of measuring distances between clusters: (i) the first method of single linkage computes the distance between the closest elements of the two clusters, (ii) The second method describes average linkage method that computes the average distance between elements of two clusters, (iii) Third method explains the weighted linkage uses the WPGMA method (Weighted Pair Group Method of Arithmetic averages), the similarity between any single and some group is simply the average of all the involved pair wise similarities and (iv) Finally, the complete linkage method computes the distance between clusters’ most distant elements [5].

3. RESULTS AND DISCUSSION

Two methods have been used to calculate API and they are Enedy’l API and hierarchical clustering methods. In the first method, API is classified as five clusters and they are labelled as Very high, High, Moderate, Low and Very Low productivity region. The very low productivity district is Kanyakumari and high productivity district is Theni. The remaining three major clusters are labelled as high, moderate and low productivity districts. The districts of Coimbatore, Cuddalore, Dharmapuri, Dindugal, Erode and Kancheepuram fall in the moderate productivity region. The low productivity districts are Karur, Madurai, Nagapattinam, Nilgiris, Pudukkottai, Perambalur, Namakkal, Salem, Ramanathapuram, Thanjavur and Sivagangai. Finally, the districts of Thiruvarur, Thiruvannamalai, Thiruvallar, Thoothukudi, Tirunellveli, Trichi, Vellore, Villupuram and Virudhunagar fall in high productivity districts. One or two districts are misclassified in all these three major clusters which is due to API and data variation (Table 1).

The second method attempts to identify the hierarchical classification of API which shows the same results as that of API performance. This technique also produces five clusters based on the input
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matrix of API. In complete linkage method, the results shows that Theni and Kanyakumari districts are singleton cluster and Theni is labelled as very high productivity district and Kanyakumari is labelled as very low productivity district. The remaining three major clusters are high, low and moderate categories. Majority of the districts fall in high category and they are Trichy, Vellore, Nilgiris, Thiruvannamalai, Coimbatore, Pudukkottai, Nammakkal, Virudhunagar, Dindukal, Cuddalore, Villupuram, Thanjavur, Salem and Madurai. The moderate categories of districts are Kancheepuram, Thiruvarur, Thoothukudi, Dharmapuri, Erode and Tirunelveli. The districts Karur, Thanjavur, Nagapattinam, Perambalur, Ramanathapuram and Sivaganga fall in low productivity (Figure 3).

**Figure 3. Hierarchical Clustering two dimensional distance map**

**Figure 3. Complete Linkage Method**

The weighted linkage method is classified with little variation over the study period. The first two clusters are singleton cluster and they are classified as very high and very low productivity namely Theni and Kanyakumari. Thoothukudi, Kancheepuram and Thiruvarur districts productions of API are in moderate category. The districts of Karur, Nagapattinam, Thiruvarur, Perambalur, Ramanathapuram and Sivaganga fall in high productivity districts. The remaining sixteen districts fall in low productivity regions (Figure 4).
The average linkage method classified as five clusters, two singleton cluster and three major clusters and they are labelled as very high, high, moderate, low and very low categories. Theni fall in very high productivity districts and Kanyakumari in very low productivity districts in this study period. The high productivity districts are Thiruvannamalai, Villupuram, Dindugal, Salem, Coimbatore, Pudukkottai, Trichy, Cuddalore, Vellore, Dharmapuri, Namakkal and Virudunagar. The districts of Thoothukudi, Kancheepuram and Thiruvalur fall in moderate production of API. The remaining districts of Karur, Nagapattinam, Thanjavur, Perambalur, Ramanathapuram and Sivaganga fall in the low categories of agriculture productivity region (Figure 5).

The last method is single linkage which is classified only as three clusters. The district of Kanyakumari and Theni is singleton cluster and are labelled as very low and very high productivity region. The remaining Twenty six districts fall in moderate categories. The results of the four methods shows little variation, but the first three methods forms the same cluster and more or less fall in the respective categories and are called as natural clusters (Figure 6).
Finally the two methods are classified as five clusters based on API and are labelled as Very High, High, Moderate, Low and Very Low categories. Further, the API index make use of Neural Network Classification, Self Organizing Map, Support Vector Machine, Expectation Maximization (EM) Algorithm, DBASCAN algorithm, etc, of data mining tools are applied and the same results might vary little over the results. API is formed as five major clusters based on this study.

The following steps are interpreted and the results are shown from table 1 to table 4.

Step 1. The following table shows how the cases are clustered together at each stage of the cluster analysis in various methods.

Step2. Each method clusters are formed by merging cases and clusters a step at a time, until all cases are joined in one full-size cluster.

Step 3. In each stage, one cluster is joined with another cluster. In this research paper, all the four methods results are shown in Table 2 to Table 5.

Step 4. The Coefficients column indicates the distance between the two clusters (or cases) joined at each stage and the values depend on the proximity measure and linkage method used in the analysis.

Step 5. For a good cluster result, an unexpected jump in the distance coefficient or sudden drops in the similarity coefficient in the result tables are highlighted. This sudden change indicates the optimal stopping point for merging clusters. In this study, a four cluster solution is considered. The subsequent part of the table shows the phase at which each cluster appears first. Single cases existed before the analysis is started, so they are indicated by zeroes.

**Table1. Performance of Agriculture Productivity Index using Enedý’l Method**

| Districts       | 2002-03 | 2003-04 | 2004-05 | 2005-06 | 2006-07 | 2007-08 | 2008-09 | 2009-10 | 2010-10 | 2011-12 |
|-----------------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|
| Kancheepuram    | 114.03  | 128.3   | 109.61  | 122.65  | 108.99  | 140.52  | 142.4   | 144.04  | 143.22  | 115.15  |
| Thiruvalluvan    | 121.62  | 127.4   | 125.82  | 132.97  | 118.38  | 146.06  | 144.14  | 121.47  | 113.93  | 98.38   |
| Cuddalore       | 110.49  | 111.3   | 101.51  | 98.03   | 107.63  | 93.31   | 97.18   | 111.13  | 103.25  | 88.26   |
| Villupuram      | 76.17   | 115.69  | 108.05  | 100.85  | 100.45  | 106.75  | 97.43   | 96.63   | 108.74  | 94.7    |
| Vellore         | 109.04  | 105.28  | 106.63  | 87.43   | 89.08   | 99.13   | 80.85   | 97      | 78.94   | 92.7    |
| Thruvannamalai  | 77.78   | 89.58   | 71.77   | 84.23   | 89.13   | 118.05  | 92      | 86.89   | 88.96   | 96.57   |
| Salem           | 97.48   | 103.8   | 107.88  | 111.07  | 93.6    | 96.21   | 90.96   | 100.97  | 123.13  | 105.68  |
| Namakkal        | 124.95  | 126.99  | 113.01  | 130.71  | 138.18  | 109.58  | 107.76  | 108.88  | 103.59  | 97.45   |
| Dharmapuri      | 84.8    | 77.36   | 101.65  | 117.67  | 104.8   | 123.44  | 99.31   | 95.73   | 100.91  | 105.51  |
| Coimbatore      | 85.13   | 90.82   | 97.41   | 95.29   | 104.03  | 100.86  | 57.4    | 111.57  | 96.47   | 96.55   |
| Erode           | 80.77   | 102.4   | 125.16  | 126.71  | 116.35  | 121.11  | 122.46  | 116.55  | 120.99  | 104.04  |
| Trichy          | 109.04  | 94.36   | 80.99   | 78.59   | 90.71   | 88.87   | 80.02   | 103.41  | 95.84   | 85.09   |
| Karur           | 47.39   | 61.39   | 62.82   | 57.99   | 63.09   | 100.12  | 68.95   | 71.98   | 72.75   | 102.63  |
| Perambalur      | 92.66   | 94.06   | 87.61   | 95.39   | 83.3    | 59.59   | 44.04   | 69.86   | 78.3    | 97.46   |
| Pudukottai      | 83.28   | 83.51   | 99.99   | 102.73  | 110.02  | 82.78   | 79.14   | 86.56   | 88.51   | 99.4    |
| Thiruvarur      | 68.33   | 86.64   | 67.26   | 57.84   | 84.26   | 71.69   | 51.3    | 87.63   | 66.36   | 84.76   |
| Nagapattinam    | 62.1    | 76.31   | 59.99   | 58.91   | 98.21   | 31.19   | 36.75   | 81.28   | 91.52   | 70.21   |
| Madurai         | 111.72  | 97.83   | 108.44  | 119.78  | 88.01   | 88.97   | 96.94   | 77.29   | 117.86  | 111.27  |
| Thiruvarur      | 150.45  | 130.91  | 147.02  | 177.16  | 131.7   | 151.07  | 128.91  | 184.52  | 180.92  | 140.37  |
| Dindigul        | 110.72  | 115.06  | 116    | 101.99  | 99.07   | 109.2   | 103.94  | 115.58  | 121.59  | 113.59  |
| Ramanathapuram  | 63.7    | 63.26   | 92.09   | 68.34   | 85.24   | 55.2    | 70.87   | 66.68   | 74.98   | 82.25   |
| Virudhunagar    | 115.54  | 103.13  | 108.57  | 96.91   | 132.79  | 122.37  | 104.26  | 81.51   | 91.81   | 103.31  |
| Sivagangai      | 84.33   | 77.74   | 94.05   | 86.01   | 79.2    | 65.81   | 74.4    | 70.97   | 89.09   | 96.61   |
| Tirunelveli     | 98.72   | 101.4   | 121.26  | 124.63  | 107.95  | 131.54  | 101.57  | 126.5   | 94.36   | 116.75  |
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| District   | 2006-07 | 2007-08 | 2008-09 | 2009-10 | 2010-11 | 2011-12 | 2012-13 | 2013-14 | 2014-15 | 2015-16 |
|------------|---------|---------|---------|---------|---------|---------|---------|---------|---------|---------|
| Thoothukudi| 102.61  | 110.66  | 130.37  | 112.37  | 162.64  | 103.51  | 81.21   | 127.62  |         |         |
| Nilgiris   | 108.65  | 116.05  | 100.42  | 86.69   | 103.77  | 93.83   | 89.1    | 92.41   | 86.15   |         |
| Kanyakumari| 121.69  | 83.77   | 99.7    | 105.91  | 39.11   | 61.28   | 79.07   | 104.47  | 122.16  | 72.53   |

Table 2. Complete Linkage Method

| Stage | Cluster Combined | Coefficients |
|-------|-----------------|--------------|
|       | Cluster 1       | Cluster 2    |
| 1     | 5               | 27           | 895.108   |
| 2     | 7               | 19           | 1053.786  |
| 3     | 3               | 5            | 1427.626  |
| 4     | 22              | 24           | 1536.558  |
| 5     | 10              | 15           | 1651.247  |
| 6     | 3               | 12           | 1758.597  |
| 7     | 7               | 21           | 1916.753  |
| 8     | 11              | 25           | 1928.179  |
| 9     | 4               | 7            | 2193.477  |
| 10    | 1               | 2            | 2198.118  |
| 11    | 4               | 16           | 2477.804  |
| 12    | 14              | 22           | 2547.627  |
| 13    | 9               | 11           | 2596.316  |
| 14    | 3               | 10           | 2732.713  |
| 15    | 8               | 23           | 2947.112  |
| 16    | 14              | 17           | 3045.297  |
| 17    | 3               | 4            | 3180.016  |
| 18    | 3               | 6            | 4048.495  |
| 19    | 8               | 9            | 4329.282  |
| 20    | 14              | 18           | 4653.400  |
| 21    | 8               | 26           | 4947.746  |
| 22    | 13              | 14           | 5889.735  |
| 23    | 3               | 8            | 5903.125  |
| 24    | 1               | 3            | 9670.552  |
| 25    | 13              | 28           | 11614.014 |
| 26    | 1               | 13           | 14270.224 |
| 27    | 1               | 20           | 38243.332 |

Table 3. Weighted Linkage Method

| Stage | Cluster Combined | Coefficients |
|-------|-----------------|--------------|
|       | Cluster 1       | Cluster 2    |
| 1     | 5               | 27           | 29.918    |
| 2     | 7               | 19           | 32.462    |
| 3     | 22              | 24           | 39.199    |
| 4     | 3               | 21           | 40.113    |
| 5     | 10              | 15           | 40.636    |
| 6     | 11              | 25           | 43.911    |
| 7     | 5               | 12           | 45.986    |
| 8     | 3               | 4            | 46.797    |
| 9     | 1               | 2            | 46.884    |
| 10    | 7               | 16           | 50.202    |
| 11    | 9               | 11           | 52.833    |
| 12    | 8               | 23           | 54.287    |
| 13    | 17              | 18           | 55.956    |
| 14    | 3               | 7            | 56.073    |
| 15    | 5               | 6            | 56.427    |
| 16    | 5               | 10           | 59.430    |
| 17    | 14              | 22           | 59.451    |
| 18    | 9               | 26           | 75.207    |
| 19    | 3               | 8            | 77.419    |
| 20    | 14              | 17           | 78.596    |
| 21    | 13              | 14           | 94.654    |
| 22    | 1               | 9            | 99.601    |
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Table 4. Average Linkage Method

| Stage | Cluster Combined | Cluster Combined | Coefficients |
|-------|------------------|------------------|--------------|
|       | Cluster 1        | Cluster 2        |              |
| 1     | 5                | 27               | 29.918       |
| 2     | 7                | 19               | 32.462       |
| 3     | 3                | 5                | 35.097       |
| 4     | 3                | 12               | 38.429       |
| 5     | 22               | 24               | 39.199       |
| 6     | 7                | 21               | 39.296       |
| 7     | 10               | 15               | 40.636       |
| 8     | 4                | 7                | 42.677       |
| 9     | 11               | 25               | 43.911       |
| 10    | 3                | 16               | 44.170       |
| 11    | 14               | 22               | 46.052       |
| 12    | 1                | 2                | 46.884       |
| 13    | 4                | 9                | 47.195       |
| 14    | 3                | 10               | 48.637       |
| 15    | 14               | 17               | 50.553       |
| 16    | 3                | 6                | 51.202       |
| 17    | 4                | 23               | 52.154       |
| 18    | 4                | 11               | 55.074       |
| 19    | 14               | 18               | 57.375       |
| 20    | 4                | 8                | 57.499       |
| 21    | 3                | 28               | 59.703       |
| 22    | 4                | 26               | 61.784       |
| 23    | 13               | 14               | 63.392       |
| 24    | 1                | 4                | 67.599       |
| 25    | 1                | 3                | 73.694       |
| 26    | 1                | 20               | 82.461       |
| 27    | 1                | 13               | 95.276       |

Table 5. Single Linkage Method

| Stage | Cluster Combined | Cluster Combined | Coefficients |
|-------|------------------|------------------|--------------|
|       | Cluster 1        | Cluster 2        |              |
| 1     | 5                | 27               | 14.959       |
| 2     | 7                | 19               | 31.190       |
| 3     | 22               | 24               | 50.790       |
| 4     | 3                | 21               | 70.846       |
| 5     | 10               | 15               | 91.164       |
| 6     | 11               | 25               | 113.120      |
| 7     | 5                | 12               | 135.700      |
| 8     | 3                | 4                | 158.606      |
| 9     | 1                | 2                | 182.048      |
| 10    | 7                | 16               | 207.674      |
| 11    | 14               | 22               | 234.127      |
| 12    | 9                | 11               | 260.754      |
| 13    | 8                | 23               | 287.897      |
| 14    | 3                | 7                | 315.787      |
| 15    | 17               | 18               | 343.765      |
| 16    | 6                | 10               | 374.332      |
| 17    | 5                | 6                | 408.883      |
| 18    | 9                | 26               | 445.903      |
| 19    | 14               | 17               | 486.623      |
| 20    | 13               | 14               | 530.351      |
| 21    | 8                | 9                | 574.451      |
| 22    | 3                | 5                | 630.653      |
4. CONCLUSION

The application of Orange data mining shows the result visually in a very effective manner. This study determined on estimation of API and classified the index using Orange hierarchical clustering methods. In both the methods, results are same with little variation due to database and different methods of classification. Classification results are obtained by Data mining methods and API from various districts of Tamilnadu. In this study, agriculture productivity index data shows slight fluctuation over the periods of ten years with twenty eight districts of Tamilnadu. The oscillation is due to shortages of rainfall, indecisively dates of opening and closing of river water, overdue monsoons, real estate business, industrialization, government policies and various types of soils. Finally, the research concludes five types of classification achieved using API and data mining techniques during the study period of 2003-2012 with the entire districts of Tamilnadu. Agriculture Productivity indices are labelled as Very High, High, and Moderate, Low and Very Low productivity districts of Tamilnadu. A generalization of the results is under investigation to obtain a set of five classification of API for any given year.

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