Implementation and Analysis of Advanced Clustering Algorithms

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Abstract: Clustering is data mining technique of grouping objects or data into clusters in which objects within the cluster have high similarity, but are very dissimilar to objects in the other clusters. Similarities and dissimilarities are measured on the attribute values which describe the objects. Clustering methods are used to formulate and typecast the data, for data compression and model construction, for detection of outliers etc. Common approach of all clustering methods is to find clusters centre which represent each cluster. Data set can be numeric or categorical. Numeric data can be oppressed to naturally define distance function between data points, whereas categorical data can be borrowed from either quantitative or qualitative data where observations are directly observed from counts. The work done here revolves around the implementation of selected latest clustering algorithms, a study of various pros and cons of the same, and also a comparative analysis of these clustering techniques.

Keywords: Clustering, outlier, clustering algorithm-Kmode, BIRCH, CURE, ROCK

I. INTRODUCTION

As per the work stated in [1], clustering is the grouping of a particular set of objects based on their characteristics, aggregating them according to their similarities. Regarding to data mining, this methodology partitions the data implementing a specific join algorithm, most suitable for the desired information analysis. Since clustering is a very valuable data analysis technique, it has several different applications in the sciences world. Every large data set of information can be processed by this kind of analysis, producing great results with many distinct types of data. [10]. The personal data combined with shopping, location, interest, actions, and an infinite number of indicators, can be analyzed with this methodology, providing very important information and trends. Examples of this are the market research, marketing strategies, web analytics, and a lot of others. Following are the four advanced clustering algorithms, that have been selected for implementation in the project:

K-modes, Rock, BIRCH and CURE

II. LITERATURE SURVEY

This paper presents comparison between various clustering algorithms by considering the parameters such as time, input format, data type expected as input and outlier detection.

A. Partitioning Based Clustering

All objects are considered initially as a single cluster. The objects are divided into no of partitions by iteratively locating the points between the partitions.[5]

1) K-modes algorithm: Randomly select k unique objects as the initial cluster centres (modes). In this current implementation of K-modes algorithm there are two initial mode selection methods

2) The first method selects k-distinct records from the dataset as initial k-modes. In second method we, calculate the frequencies of all categories for a category array in descending order of frequency, where Cij denotes category i of attribute j, where f(Ci,j) is frequency of category Ci,j.

3) Assume k=3, assign most frequent categories equal to the initial k-modes. Example Q1=[q1,1=c1,1, q1,2=c1,2 q1,3=c1,3 q1,4=c1,4], Q2=[q2,1=c2,1, q2,2=c2,2, q2,3=c2,3, q2,4=c2,4], Q3=[q3,1=c3,1, q3,3=c3,3, q3,4=c3,4]

4) Start with Q1. Select the record most similar to Q1 and substitute Q1 with record as first initial mode. Continue this process until Q3 is substituted

B. Hierarchical Clustering

There are two approaches to perform Hierarchical clustering techniques: Agglomerative and Divisive. In Agglomerative approach, initially one object is selected and successively merges the neighbor objects based on the distance as minimum, maximum and
average. The process is continuous until a desired cluster is formed. The Divisive approach deals with set of objects as single cluster and divides the cluster into further clusters until desired no of clusters are formed.[5]

1) Birch: It is a hierarchical clustering algorithm which uses a CF tree structure to form clusters.[11] Following are the various phases in BIRCH:
   a) Phase 1: Load data into memory by building a CF tree
   b) Phase 2 (optional): Condense into desirable range by building smaller CF trees
   c) Phase 3: Global Clustering

2) Rock: It is a hierarchical clustering algorithm which uses a link strategy to form clusters.[11] ROCK method is divided into three parts as follows:
   a) First get a random sample of the data.
   b) Obtain the goodness measure by performing link agglomerative approach on data to get the point which can be merged at each step
   c) Assign the remaining data on disk by using these points which forms the clusters
   d) Cure: CURE uses a set of representative points to cluster the data. The steps for CURE algorithm are:
      i) Draw random sample
      ii) Partition sample
      iii) Partially cluster partitions
      iv) Eliminate outliers
      v) Cluster partial clusters
      vi) Label data in disk. [12]

III. SYSTEM IMPLEMENTATION

A. Technologies Used

Python programming language for coding and flask technology is used for designing the Graphical User Interface (GUI). Python provides various libraries such as matplotlib, pyclustering, etc, that can be effectively used for designing and visualizing clusters. Flask is a web application framework written in Python. It is developed by Armin Ronacher, who leads an international group of Python enthusiasts named Pocco. Flask is based on the Werkzeug WSGI toolkit and Jinja2 template engine. The pages for the project are designed using HTML and CSS technologies.

B. Module Description

1) Data Cleaning: The datasets are cleaned, that is, the missing attributes are filled by finding the mean of the rest of the values in the particular column of the dataset. This is done only in case of numeric values, for categorical values, they are represented by a question mark mark.
2) **Outlier Detection:** The outliers in data mining can be detected using semi-supervised and unsupervised methods. Using outlier detection techniques, the distance based methods are used to detect outliers and label all the points as good outliers. The distance based method is one of the methods in anomaly detection. Anomalies: the set of objects are considerably dissimilar from the remainder of the data. They occur relatively infrequently. When they do occur, their consequences can be quite dramatic and quite often in a negative sense. Anomaly is a pattern in the data that does not conform to the expected behavior.

3) **Applying Algorithms:** Once dataset is cleaned, it is fed as input to each of the four clustering algorithms, Kmodes, ROCK, BIRCH and CURE.

4) **Clustering Result:** Results are then obtained for all the four clustering algorithms at once, displaying how the data from the dataset fed as input is grouped into clusters.

**C. Implementation**

1) **First page:** The first page provides a link to proceed with the uploading of the dataset file.

2) **Dataset Selection Page:** In this page, the user can choose any file containing datasets as input, and also a column on which clustering has to be performed. Further, a sample of data from that column is displayed, so that the user can find out whether the data is integer or string. Also, the data is cleaned simultaneously, and the dataset is now ready to be fed as input to each of the algorithms.

3) **Applying algorithms:** The dataset is fed as an input to all four clustering algorithms, outlier detection for the dataset is displayed, as well as the outputs of all the clustering algorithms are displayed.
The user can now view all the four clustering algorithms’ outputs, along with a box-plot representation of the data in the dataset, and can visually analyse and compare each of them.

### IV. RESULTS

Following are the clustering outputs of each of the four algorithms

**A. Birch**

BIRCH detects outliers, they can be seen evidently from fig. 6. The points scattered on the graph are of various colors, and the points with same colors represent the same cluster.
B. Rock

ROCK algorithm clusters points using links, so in the output, only links are displayed. The points that are visible in the graph represent the links formed between the points, each link represents a cluster.

![fig. 7 clustering output of rock.](image)

C. CURE

Similar to BIRCH, CURE output (fig. 8) also contains various points that are colored, and points with the same color belong to the same cluster. CURE also detects outliers.

![Fig. 8 Clustering output of CURE.](image)

D. Kmodes

Kmodes displays tiny circular blobs, each of these blobs represent a cluster. Kmodes does not detect outliers.

![Fig. 9 Clustering output of Kmodes.](image)
V. RESULT ANALYSIS

Following is the table that summarizes the observations obtained and inferences made about each of the four clustering algorithms, from the implementation of the system.

<table>
<thead>
<tr>
<th>Algorithm</th>
<th>Outlier detection</th>
<th>Time required (seconds)</th>
<th>Data types accepted as inputs</th>
<th>Input format</th>
</tr>
</thead>
<tbody>
<tr>
<td>kmodes</td>
<td>No</td>
<td>0.377</td>
<td>Both integer and string</td>
<td>1D array</td>
</tr>
<tr>
<td>BIRCH</td>
<td>Yes</td>
<td>0.386</td>
<td>Integer</td>
<td>2D array</td>
</tr>
<tr>
<td>CURE</td>
<td>yes</td>
<td>0.4178</td>
<td>Integer</td>
<td>2D array</td>
</tr>
<tr>
<td>ROCK</td>
<td>Yes</td>
<td>0.43</td>
<td>Both integer and string</td>
<td>column wise input</td>
</tr>
</tbody>
</table>

Fig. 10 Graphical representation of time required to for each algorithm to cluster data.

VI. CONCLUSIONS

Each clustering method has pros and cons over and is suitable in appropriate domain. The best approach is used for achieving best results. Comparative analysis table helps you to choose the most suited clustering method for a particular dataset depending on the type of output needed. Various important management decisions are taken based on the output given by these clustering methods. The work done here compares different clustering algorithms for datasets.

The inferences for the study on these clustering algorithms made are as follows

A. Kmodes is a partitioning based clustering algorithm, which takes both integers as well as string values as inputs. The input needs to be provided in the form of a 1D array. It is also a fast algorithm, takes very less time to cluster data. However, Kmodes algorithm does not detect outliers.

B. BIRCH is also a fast clustering algorithm, it takes less time for cluster formation, but more than Kmodes. BIRCH, however, takes only integer inputs, and not categorical. Also, input needs to be provided in the form of a 2D array. BIRCH is a hierarchical clustering algorithm. BIRCH detects outliers.

C. CURE is another hierarchical clustering algorithm, with properties similar to BIRCH, except that CURE takes more time, but it also provides a more precise output than BIRCH.

D. ROCK is also a hierarchical based algorithm, it takes the maximum amount of time to cluster the data, but handles outliers, as well as takes both string and integer inputs. Also, another advantage of ROCK is that it can directly column data as input, the input does not have to be converted in any format.
VII. FUTURE SCOPE

The system designed and built can be used in the future to cluster various kinds of data, as it is a generic system, which can be executed on any dataset given as input. It can be further used to perform any research on a particular dataset, or on any of these four algorithms.

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