An Accurate Diabetes Prediction System Based on K-means Clustering and Proposed Classification Approach

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Abstract

Diabetes prediction system is very useful system in the healthcare field. An accurate system for diabetes prediction is proposed in this paper. The proposed system used K-nearest neighbor algorithm for eliminating the undesired data, thus reducing the processing time. However, a proposed classification approach based on Decision Tree (DT) to assign each data sample to its appropriate class. By experiments, the proposed system achieved high classification result which is 98.7\% comparing to the existing system using Pima Indians Diabetes (PID) dataset.

Keywords: Diabetes, PID, KNN, Decision Tree, Classification.

INTRODUCTION

Diabetes mellitus is a syndrome characterized by metabolic disorder and abnormal rise in the concentration of blood sugar caused by insulin deficiency, or low insulin sensitivity of tissues, or both of them. Diabetes leads to serious complications or even premature death. However, to diagnosing diabetes, several time consuming tests and analyzing critical factors are done. Now days, machine learning algorithms are used to classify and diagnosis the diseases, in order to eliminate the problem and reduce the required cost. Besides that, using the machine learning algorithm lead to meaningful and accurate decisions. [1]

Medical data sets that contain irrelevant data (noise) are used to train and evaluate the machine learning algorithms. The noise are affects the decision results of the used algorithm. [2]

This paper analyses and overcome the accompanied problems of the diabetes through removing the noise and predicting the diabetics using medical data set and machine learning algorithms.

RELATED WORKS

Several researcher have develop and design a systems for diabetes prediction based on various algorithms and methods. V. Anuja et al. [3] proposed a system for diabetes disease classification using Support Vector Machine (SVM). The authors used Pima Indian diabetes dataset for evaluation. The obtained accuracy was 78\% base on using the Radial Basis Function (RBF) kernel of SVM as the classifier. Aiswarya et al. [4] used J48 Decision Tree and Naïve Bayes as a classifiers for classify the diagnosis of diabetes. Pima Indian diabetes dataset is used in the proposed system and the classification results was 74.8\%, 79.5\% for J48 Decision Tree and Naïve Bayes respectively. Rajesh et al. [5] proposed a system for diabetes classification based on using C4.5 algorithm for classification. The authors achieved classification rate of 91\% by evaluating the training data through data feature relevance analysis. Harleen et al. [6] proposed a system based on a technique in data mining for diabetes disease prediction. The proposed system has three main steps which are: preprocessing, feature extraction and parameter evaluation. In preprocessing step, the empty and anomalies sets are removed from the used dataset. Besides that, the helpful hidden patterns and relationships of the dataset are explored in the feature extraction step in order to improve the decision making result. Furthermore, the proposed system evaluated based on using J48, Naïve Bayes and the achieved rates are 73.8\%, 76.3\% respectively. In addition, Ravi et al. [7] fuzzy c means clustering and support vector machine for developing diabetes mellitus prediction. The authors used a dataset that consists of 768 cases and the obtained result was 59.5\%. In [8] Krishnaveni et al. proposed a six various techniques to predict diabetic disease. The used techniques are Discriminant analysis, KNN Algorithm, Naïve Bayes, SVM with Linear Kernel function, and SVM with RBF Kernel function. The obtained results of the proposed system for the used techniques are 76.3\% using discriminant analysis, 71.1\% using KNN Algorithm, 76.1\% using Naïve Bayes, 74.1\% using SVM with Linear Kernel function, 74.1\% using SVM with RBF Kernel function. However, several authors in [9] [10] [11] are used various methods in order to get the best prediction rate.

THE DATASET [12]

Pima Indians Diabetes (PID) dataset of National Institute of Diabetes and Digestive and Kidney Diseases. PID is composed of 768 instances as shown in Table 1. Eight numerical attributes are represent each patient in data set.
Table 1: PID Dataset.

<table>
<thead>
<tr>
<th>No.</th>
<th>Name</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>Number of times pregnant</td>
</tr>
<tr>
<td>2</td>
<td>Plasma glucose concentration two hours</td>
</tr>
<tr>
<td>3</td>
<td>Diastolic blood pressure</td>
</tr>
<tr>
<td>4</td>
<td>Triceps skin fold thickness</td>
</tr>
<tr>
<td>5</td>
<td>2-Hours Serum insulin</td>
</tr>
<tr>
<td>6</td>
<td>Body mass index</td>
</tr>
<tr>
<td>7</td>
<td>Diabetes pedigree function</td>
</tr>
<tr>
<td>8</td>
<td>Age</td>
</tr>
</tbody>
</table>

Table 2 illustrates all the statistical datum of each feature vector in the PID dataset.

Table 2: Statistical Datum of PID Dataset.

<table>
<thead>
<tr>
<th>Attribute</th>
<th>Min value</th>
<th>Max value</th>
<th>Mean value</th>
<th>Standard division</th>
</tr>
</thead>
<tbody>
<tr>
<td>1</td>
<td>0</td>
<td>17</td>
<td>3.845</td>
<td>3.37</td>
</tr>
<tr>
<td>2</td>
<td>0</td>
<td>199</td>
<td>120.859</td>
<td>31.973</td>
</tr>
<tr>
<td>3</td>
<td>0</td>
<td>122</td>
<td>69.105</td>
<td>19.356</td>
</tr>
<tr>
<td>4</td>
<td>0</td>
<td>99</td>
<td>20.536</td>
<td>15.952</td>
</tr>
<tr>
<td>5</td>
<td>0</td>
<td>846</td>
<td>79.799</td>
<td>115.244</td>
</tr>
<tr>
<td>6</td>
<td>0</td>
<td>67.1</td>
<td>31.993</td>
<td>7.884</td>
</tr>
<tr>
<td>7</td>
<td>0.078</td>
<td>2.42</td>
<td>0.427</td>
<td>0.331</td>
</tr>
<tr>
<td>8</td>
<td>21</td>
<td>81</td>
<td>33.241</td>
<td>11.76</td>
</tr>
</tbody>
</table>

THE PROPOSED SYSTEM

The proposed diabetes prediction system has two main stages that work together to achieve the desired results. The first stage of the proposed system is the data preparation, and the second one is the classification. However, the input into the system is the PID dataset and the output will be one class which represent the healthy or the diabetic. Figure 1 illustrates the diagram of the proposed system stages.

Data Preparation

In this stage of the proposed system the input data is processed through number of steps in order to improve the system performance. First of all, data reduction is applied on the input dataset to eliminate the noisy and inconsistent data. K-means clustering algorithm is performed on the input dataset in order to partition data to k clusters. In each cluster the most appropriate features will assigned based on its centroid. The process of data preparation stage is shown in Algorithm 1.

Algorithm 1: Data Preparation

**Input:** PID dataset
**Output:** Prepared dataset

**Begin**
**Step1:** Load the PID dataset
**Step2:** Remove the noisy and inconsistent data
**Step3:** Run K-means clustering
**Step4:** Count samples number of healthy and diabetes for each cluster
**Step5:** Remove the small size group in each cluster // Prepared dataset
**Step6:** Return (Prepared dataset)
**End**

Classification

In the classification stage, each input sample of the data that came from the previous stage will be assigned to whether healthy or diabetic. In the proposed system, a proposed classification approach based on using several Decision Trees (DTs) is used as in Figure 2.

![Proposed Classification Approach](image)

In the proposed approach, the input data is divided into number of subsets. The divided subsets must cover all the input set and any input data sample could be used in more than one divided subsets. After that, each divided subsets is classified by one decision tree, then the results of all the used decision trees are collected. In addition, the voting process is taking place be selectin the most frequent result of the decision trees. The main
steps of the proposed classification approach is sowed in Algorithm 2.

Algorithm 2: Classification

Input: Prepared dataset

Output: Classification result

Begin
Step1: Load the input dataset
Step2: Divide the input data into number of subsets
Step3: Run a decision tree classifier on each subset
Step4: Collect the all results of decision tree classifiers
Step5: Apply voting majority on the collected results //select the most frequent result
Step6: Return (Classification result)
End

EXPERIMENTAL AND DISCUSSION

In this research paper, the proposed system code written by Matlab 2016a, and run in Microsoft Windows 10 environment. In another hand, the performance of any classification system could negatively affected by the duplicate, noisy, uncertain, and inconsistent data. The data preparation stage of the proposed system address this problem by using k-mean clustering algorithm. It leads to reduce the time consumption rate of the system. An example of removing the inconsistent and noisy data based on applying K-mean clustering is shown in Figure 3.

Table 2: Number of Healthy and Diabetes Samples in Each Cluster.

<table>
<thead>
<tr>
<th>Clusters</th>
<th>1</th>
<th>2</th>
<th>3</th>
<th>4</th>
<th>5</th>
<th>6</th>
<th>7</th>
<th>8</th>
<th>9</th>
<th>10</th>
</tr>
</thead>
<tbody>
<tr>
<td>Healthy</td>
<td>129</td>
<td>22</td>
<td>8</td>
<td>48</td>
<td>67</td>
<td>3</td>
<td>35</td>
<td>70</td>
<td>114</td>
<td>4</td>
</tr>
<tr>
<td>Diabetic</td>
<td>15</td>
<td>48</td>
<td>39</td>
<td>45</td>
<td>36</td>
<td>2</td>
<td>21</td>
<td>4</td>
<td>41</td>
<td>17</td>
</tr>
</tbody>
</table>

In another hand, the proposed system achieved an efficient results comparing to the existing systems that work for diabetic classification as illustrated in Table 4.

Table 3: Experiment Results of the Proposed System.

<table>
<thead>
<tr>
<th>Criteria</th>
<th>Result</th>
</tr>
</thead>
<tbody>
<tr>
<td>Sensitivity</td>
<td>98%</td>
</tr>
<tr>
<td>Specificity</td>
<td>98.2%</td>
</tr>
<tr>
<td>Accuracy</td>
<td>98.7%</td>
</tr>
<tr>
<td>Time (Second)</td>
<td>1.28</td>
</tr>
</tbody>
</table>

CONCLUSION

A fast and accurate diabetes prediction system is proposed in this paper. The proposed system used 768 instances within 8 attributes for each one of PID dataset. The used data is preprocessed in order to remove the unwanted data, and lead to faster processing time. Moreover, the dividing technique of the dataset into subset, made an optimal classification result. The proposed system focused on the features analysis and classification parts. The propositions of these parts lead to an optimal achievements. The results of experiments illustrated
the effects of using the algorithms of the proposed system through achieving a higher classification rate that the other systems.

REFERENCES


