

Research Article

Traffic Collision Analysis and Prediction

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Received 10 Nov 2020, Accepted 10 Dec 2020, Available online 01 Feb 2021, **Special Issue-8 (Feb 2021)**

Abstract

The increase in road fatalities comes as bad news. This cannot be stopped but can be controlled. The Accidents may cause due to driver's health, Driver's feelings, vehicle speed, climate condition, traffic conditions, road conditions, etc. Analysis and prediction on Traffic collision has gained importance in these days. The big dataset is generated every year. The proposed system works on analysis and prediction of road accidents information data using machine learning algorithms and its efficient execution. For analysis same type of accidents are clustered together using EMM algorithm and for prediction association mining is performed using Improved Association Rule Mining (IARM) algorithm. The generated association rules are then provided to the Congestion control using Machine Framework (CCMF) and Traffic Congestion Analyzer using Map Reduce (TCAMP) algorithms to generate predictions. For efficient execution process, feature extraction technique and hadoop processing is used. The Results are compared in terms of accuracy and efficiency with existing systems.

Keywords: Road accidents, association rules, big data, hadoop, clustering, EMM, feature extraction

Introduction

The increase in road fatalities comes as bad news. This has a negative social and economic impact. This cannot be stopped but can be controlled. World Health Organization (WHO), announces the statistical study every year. 60 million people get injured and 1.60 million people died consistently due to road accidents. A center for Disease Control and Prevention (CDCP) announces the economical impact of road accidents. The accidents cause loss of 100 billion every year. The Accidents may caused due to driver's health, Driver's feelings, vehicle speed, climate condition, traffic conditions, road conditions, etc. Analysis and prediction on Traffic collision has gained importance in these days. The big dataset is generated every year. Enormous actions have been taken to enhance Road safety. Conventional strategies can't be utilized in such frameworks as the information produced is in huge volumes. There is need of such system that analyzes this data in automatic fashion. The machine learning algorithms are required for processing. By Analyzing the generated data the common accident types can be clubbed together. It will helpful for statistical analysis. The cause of accident can be predicted by machine learning algorithm. The possibility of accident can be predicted. Such predictions help to add more preventive measures. The requirement in the domain of road accidents motivates to develop a new system. The fusion of existing machine learning algorithms and big data analysis techniques can generate a better analytical report and prediction set.

The accidents may cause due to various parameters such as: climate condition, road conditions, drivers mental status, driver experience, etc. Analysis of accident cases based on such parameters helps to predict the future accident style at certain location or at certain cities. This helps to create preventive measure accordingly. Machine learning algorithm helps to analyze data using one or more parameters. The clustering algorithm clubs together the similar type of accidents. The association mining rule technique finds the patterns in a dataset. The pattern mining technique helps to extracts the dependency of two or more type of attributes that may cause and accidents. The prediction can be done on the resultant effect of an accident in the form of number of injuries and death count. For example: Driver age=50, whether condition = fog, driver drink = Not checked, Road surface=Dry may cause accident with injury. The proposed system works on analysis and prediction of road accidents information data using machine learning algorithms and its efficient execution. . For efficient execution process, feature extraction technique and Hadoop processing is used. For analysis same type of accidents are clustered together using EMM algorithm, Association Rule Mining (IARM) algorithm. The generated association rules are then provided to the Congestion control using Machine Framework (CCMF) and Traffic Congestion Analyzer using Map Reduce (TCAMP) algorithms to generate predictions

Related Work

Sarkar S ,et. al.[2] proposes a prediction system. This system predicts the possible incident in steel plant based on the related stored data. It predicts the occurrence of injury cases and their probable causes. It uses text mining technique with 3 different classification algorithms: Support Vector Machine SVM, Random Forest RF and Maximum entropy Max Ent. These classifiers generate better results in binary and multi-class prediction model. An Ensemble approach is proposed for multi-class prediction model. The Ensemble approach improves accuracy.

Flight crash investigation system is proposed by Sharma S, et.,al.[3]. This system focuses on the flight crash investigation and analysis using data mining techniques. It finds the ground/abroad fatality rate. The clustering algorithm K-Means is used along with the cosine similarity measure. The clustering results group the similar crash information in one group. Similarity finds the relation among different texts of crashes.

A railroad accident investigation reports generation system is proposed by Williams T, et.,al.[4]. This technique generate a statistical analysis report based on Similarity found among different texts of railroad Accidents. In this technique, the text form published articles is analyzed using data mining techniques. The dataset of published articles contains railway accidents. Using LDA technique topics are extracted from text. The K means clustering is applied on extracted text. The clustering results show that there is recurring themes in many major accidents. After grouping the accidents data the main causes of accidents are extracted and relation among multiple accidents is identified.

Sarkar S,et.,al,[5] Works on prediction of occurrence of accidents and its outcome such as injury, near miss, fatal death, property damage, etc. . And finds the inter relationship of factors causing accidents. The two machine learning algorithms : support vector machine (SVM) and artificial neural network (ANN) are used. The parameter passed to this algorithm is optimized using genetic algorithm and particle swarm optimization. After these algorithms association rules are extracted with the help of decision tree algorithm with PSO and SVM. This technique extracts the root cause behind the injury.

Verma A[6] proposes a analysis tool for steel plant incident data. It explores the hidden factors and patterns form the description. It also identifies the anomaly in incidence reporting. The data is in case report text format. It uses singular value decomposition (SVD) and expectationmaximization (EM) algorithm. This paper only focuses on grouping of similar type of accident data.

Williams T. et.al[7] proposes a system to analyze road accidents based on text mining techniques such as: probabilistic topic modeling and k-means clustering. The system works on major accidents that are

occurred in the same fashion. Parameters those are analysed in the system are: track defects, grade crossing accidents, wheel defects, and switching accidents.

Ghazizadeh et.al[8] proposes a technique to analyze national highway complaint dataset. The data is analyzed at 2 levels: fatal incident and injury. latent semantic analysis (LSA) and hierarchical clustering technique is used to cluster complaints.

F. Abdat[9] proposes a system that analyzes recurrent accidents caused due to Movement Disturbance. This is called as Occupational Accident with Movement Disturbance (OAMD) scenarios. The dataset is in the form of descriptive text from. A Bayesian Network (BN)-based model is used to extract informative text. Then Most Probable Explanation (MPE) is extracted by creating clusters based on the similarity measurements.

Babu S.N., et.al.[1] works on road accidents prediction theory based on various parameters like driver-age, experience, vehicle type, whether condition, road conditions, etc. The system uses Congestion control using Machine Framework (CCMF) and Traffic Congestion Analyzer using Map Reduce(TCAMP) algorithms for prediction on road accidents. Initially the system forms clusters based on the clusters the association rules are extracted. Using association rules predictions are performed. Lots of parameters are used for mining accidental data. The attribute reduction will be useful for accuracy improvement.

Analysis And Problem Formulation

Lot of work has been done on road accident analysis using text mining technique. Most of the system generates a statistical analysis by clustering algorithm. The rule extraction helps to analyse the patterns and helps to predict the future occurrence of accidents. There is need to generate analytical report from the big accidental database efficiently and generate a road accident predictions by considering more than one factor at a time that causes accidents.

The problem statements can be defined in three folds:

1. Generate an analytical report from accidental database.
2. Generate predictions on accidents using association rule mining.
3. To improve system efficiency for processing big data.

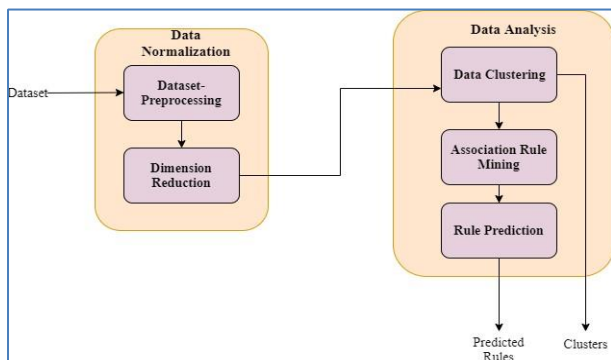
Proposed Methodology

A. Architecture

Following fig.1 describes the architecture of the system. The accident information dataset is input to the system. The Prediction rules and clusters are the output of system. System mainly categorized in 2 sections: Data normalization and data analysis. Data normalization is treated as a preprocessing step whereas in data analysis phase actual data mining

techniques are applied such as data clustering, association rule mining and rule prediction algorithms.

FIGURE 1: SYSTEM ARCHITECTURE



B. System Working:

The data processing is mainly described in following 4 sections:

1. Data Preprocessing:

In data preprocessing the noisy data is removed. The dataset contains raw information of all type of accidents. The unwanted information from dataset is removed.

The dataset may contain missing values. The missing values are filled using binning and linear regression technique.[7]

2. Dimension reduction:

A Wrapper technique: CFS subset evaluator is used to reduce the dimension count. The reduced dimension count helps to improve system efficiency. This finds the optimal feature set based on the classifier performance.

3. Data Clustering

The whole dataset of road accidents is initially divided in number of clusters based vehicle type and then the cluster is divide in subgroups using parameter like : time, drivers experience, climate etc. The Enhanced ExpectationMaximization algorithm is used for data clustering.[9] this clustering algorithm focuses on grouping of similar members based on probability distribution.

4. Association Rule Mining

From the clustered data association among data is extracted using Improved Association Rule Mining (IARM) algorithm[3]. This technique extracts the strong association using support value. The rule are extracted based on vehicle class and road accident parameters.

5. Rule Prediction

Congestion control using Machine Framework(CCMF) and Traffic Congestion Analyzer using Map Reduce(TCAMP) algorithms are used for prediction.

The generated clusters of EM algorithm based on vehicle type are given to the input to CCMF algorithm. This algorithm finds the clusters of relevant parameters. The cluster is in the form of tree. Using the generated clusters and association rules the TCAMP algorithm predicts the possibility of road accidents.

This is a hadoop based map reduce program. The map reduce technique improves the efficiency of execution.

C. Algorithms

1. CCMF algorithm

Input: Training dataset T and attributes/parameters.P

Output: Multiple clusters based on parameters of vehicle type using decision Tree.

Processing:

1. If (count(T) is NULL) Stop
2. Else if (count(P) is NULL) Stop
3. Else if (|T| OR |P|) is 1 only parameter is considered in the dataset and one node is formed a parent node.
4. Else
 - i. For $p_1 \in P$ and $P \in T$
 - ii. If ($p_1 \in VT_k$)
 - iii. $split(T) = p_1$;

2. TCAMP Algorithm

Input Traffic data set Output predicting the accidents

Processing:

1. Apply pre-processing using binning and linear regression
2. Apply dimensionality reduction using PCA
3. Create data clusters using Enhanced ExpectationMaximization
4. apply Association rules mining using IARM.
5. For vehicleclass (V)
6. For Dc(i) to MAX do
7. Apply Association rule on parameter P(i).
8. Display Prediction set PS.

D. Mathematical Modeling:

The System S can be defined in set theory form as,

$S = \{I, O, F\}$ where,

$I = \{I_1, I_2\}$, Set of inputs

I_1 = Traffic data set

I_2 = parameters for analysis

$O = \{O_1, O_2, O_3\}$, Set of outputs

O_1 = Clusters of accidental data

O_2 = Association rules

O_3 = Accidental condition predictions

$F = \{F_1, F_2, F_3, F_4, F_5, F_6, F_7, F_8, F_9, F_{10}, F_{11}\}$, Set of Functions

F_1 = Upload data

F_2 = Data Preprocessing

F_3 = Binning and linear regression

F_4 = Dimension reduction

F_5 = Data Clustering

F_6 = Enhanced Expectation-Maximization algorithm

F_7 = Association Rule Mining

F_8 = Improved Association Rule Mining (IARM) algorithm

F_9 = Rule Prediction

F_{10} = Congestion control using Machine Framework

F_{11} = Traffic Congestion Analyzer using Map Reduce

F_{12} = View Result

Result And Analysis

The system is implemented on Ubuntu 18.04 with 4GB RAM and I3 processor. The system is implemented in java using jdk 1.8 environments. For single node Hadoop implementation Hadoop-3.1.1 is used.

A. Dataset:

The data is downloaded from government website[10]. This website contains road accident information from different states, with specific year, and with respect to various parameters. The parameters of dataset are enlisted in the following table:

Table 1 : Dataset Parameter Description

Parameter	Value
Driver age	<20, [21-27], [28-60]>61
Driver sex	M, F
Driver Experience	<1, [2-4], >5
Vehicle age	[1-2], [3-4], [5-6] >7
Vehicle type	Car, Trucks, Motorcycles, other
Light condition	Daylight, Twilight, Public lighting, Night
Whether Condition	Normal weather, Rain, Fog, Wind, Snow
Road Condition	Highway, Ice Road, Collapse Road, Unpaved Road
Time	[00-6], [6-12], [12-18], [18-00]
City	Agra, Mumbai, ...
Number of injuries	1, [2-5], [6-10] >10
Number of death	1, [2-5], [6-10] >10

B. Performance Measures:

The system performance is measured in terms of :

1. Time: The time required for processing is captures for analysis of prediction system with single node hadoop and without hadoop.
2. Memory: The memory required for processing is captured for analysis using hadoop and without hadoop.
3. Precision: The Accuracy of system is measured in terms of precision. The precision can be calculated as:

$$\text{Precision} = AC \frac{A_o \cap A_p}{A_o} \quad (1)$$

Where A_o is the original number of accidents count

A_p is the total number of correctly predicted accidents count

C. Implementation Status:

The dataset is collected from the government website and removed the noisy data. The Expectation maximization algorithm is applied on dataset and clusters are generated.

Conclusions

The proposed system analyzes the accident dataset and finds the clusters form the data. The road accident may caused due to various parameters like climate, road condition, driver status ,etc. The system extracts association rules from the data using IARM algorithm. Based on the rules and accident type road accident predictions are done using CCMF and TCAMP algorithm. To improve system efficiency feature selection and map reduce strategy is used. In future the system can be tested on different dataset like flight crashes, industrial accident analysis, etc.

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