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**IDENTIFICATION OF FACTORS INFLUENCING INJURY
SEVERITY OF MOTORIZED TWO- WHEELER CRASHES
IN PATNA**

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PRESENTATION OUTLINE

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- Objective of the study
- Data Mining : An Overview
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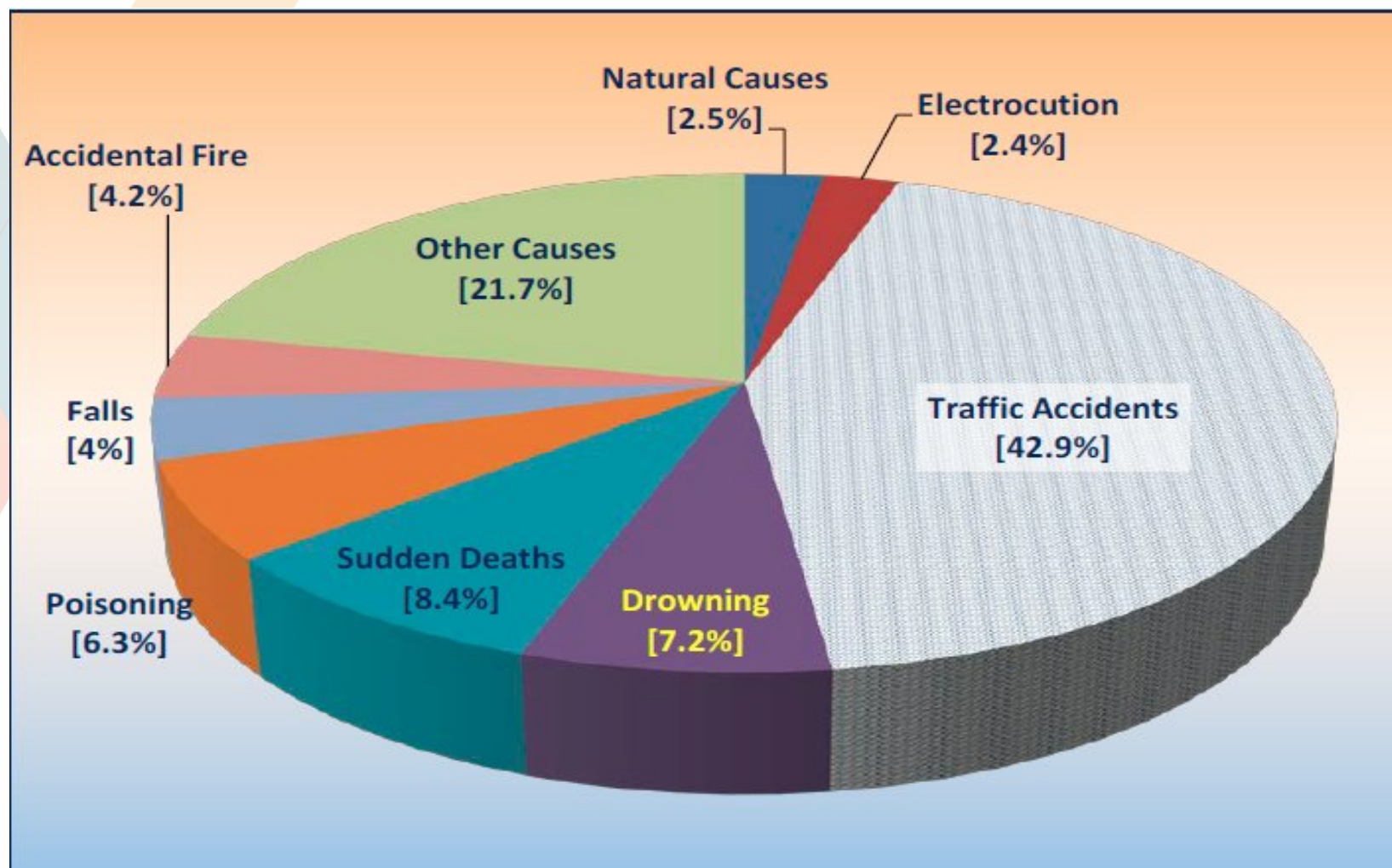
INTRODUCTION

Global Road Safety Scenario-

Global Status Report on Road Safety, (WHO, 2015)

- 1.25 million people are killed each year on the world's road.
- Leading cause of the death among 15-29 yr.
- 74% of total deaths occurs in middle income countries yet they have only 53% of total vehicles.
- 49% Of total deaths are among motorcyclists (23%), pedestrians (22%) and cyclists (4%) (VRUs).
- In 2010 UN General Assembly adopted the resolution calling for 'Decade of action for road safety (2011 - 2020)'.

Indian Road are safe...?



(NCRB, 2015)

Indian Road Safety Scenario-

Road accidents 2015, MoRTH statistics-

- ≈ 5 lacs injuries (1 accident every minute) & 1.46 lacs killed (1 death every 3.7 minutes) in 2015.
- 54.10% road accidents victims are in 15- 34 year age.
- Severity index (deaths per 100 crashes) in 2015 was 29.10.
- It is estimated that 3% GDP (100,000 crore) loss every year.

OBJECTIVE OF THE STUDY

- To identify the roadway and roadside factors influencing the severity of crashes in Indian cities like Patna.
- To explore the use of Data Mining technique in road safety particularly in Indian road conditions.

DATA MINING: AN OVERVIEW

- Extraction of knowledge from raw data is called 'Data Mining' (Han et al., 2012).
- Represents data in graphical manner so easy to understand process and results for people.
- Has been extensively used in the business, medical, social, environment and astronomical fields.
- Implementation in the traffic safety field is relatively few.

- Parametric techniques such as logistic regression and ordered probit models (Donnell and Conner, 1996: Kockelman and Kweon, 2002: Abdel Aty, 2003: Wang and Kockelman, 2005: Lemp et al., 2011) have been extensively used in severity classification.
- Researchers have used non parametric procedures such as Classification and Regression Tree (CART) and Multivariate Adaptive Regression Splines (MARS).
- Tree based models have been used in severity analysis (kuhnert et al., 2000: Tesema et al., 2005: Chang and Wang, 2006: Kashani and Mohaymany, 2011: Montella, 2011: Griselda et al., 2012: Montella et al., 2012: Kashani et al., 2014).

METHODOLOGY

Past crash data collection from FIRs



Segmentation of stretches



On site investigation & data collection



J48 & Random forest models



Decision tree generation



Identification of factors influencing severity

- Tree based models use 'Attribute Selection Measures' such as information gain concept to select the best attribute to split the root node.
- Minimum information (bits) needed to classify the attribute.
- Attribute which provides maximum information gain is considered.
- Tree pruning is done to remove the problem of over fitting.

Software- Weka 3.8.1

- Waikato Institute for Knowledge Analysis (Weka 3.8.1)
- Written in Java, developed at University of Waikato, New Zealand
- Free software.

Models Used-

- J48
- Random Forest

Data-

Secondary Data

- Two year (2014-15) was collected for police FIRs available at various police stations.
- Time, victims, vehicle involved, location etc. were noted down.

Primary Data

- Attributes like gap in median, access per km. , presence of school, petrol pump etc. were collected on site.
- Total of 16 attributes were used.

- Data was arranged in different time slots keeping in mind the traffic temporal variations in the city

Time interval	Notation
23:00 - 04:00	T1
04:00 – 06:00	T2
06:00 – 08:00	T3
08:00 – 12:00	T4
12:00 – 16:00	T5
16:00 – 20:00	T6
20:00 – 23:00	T7

Table 1 Representing time slots

Severity variations with respect to time..

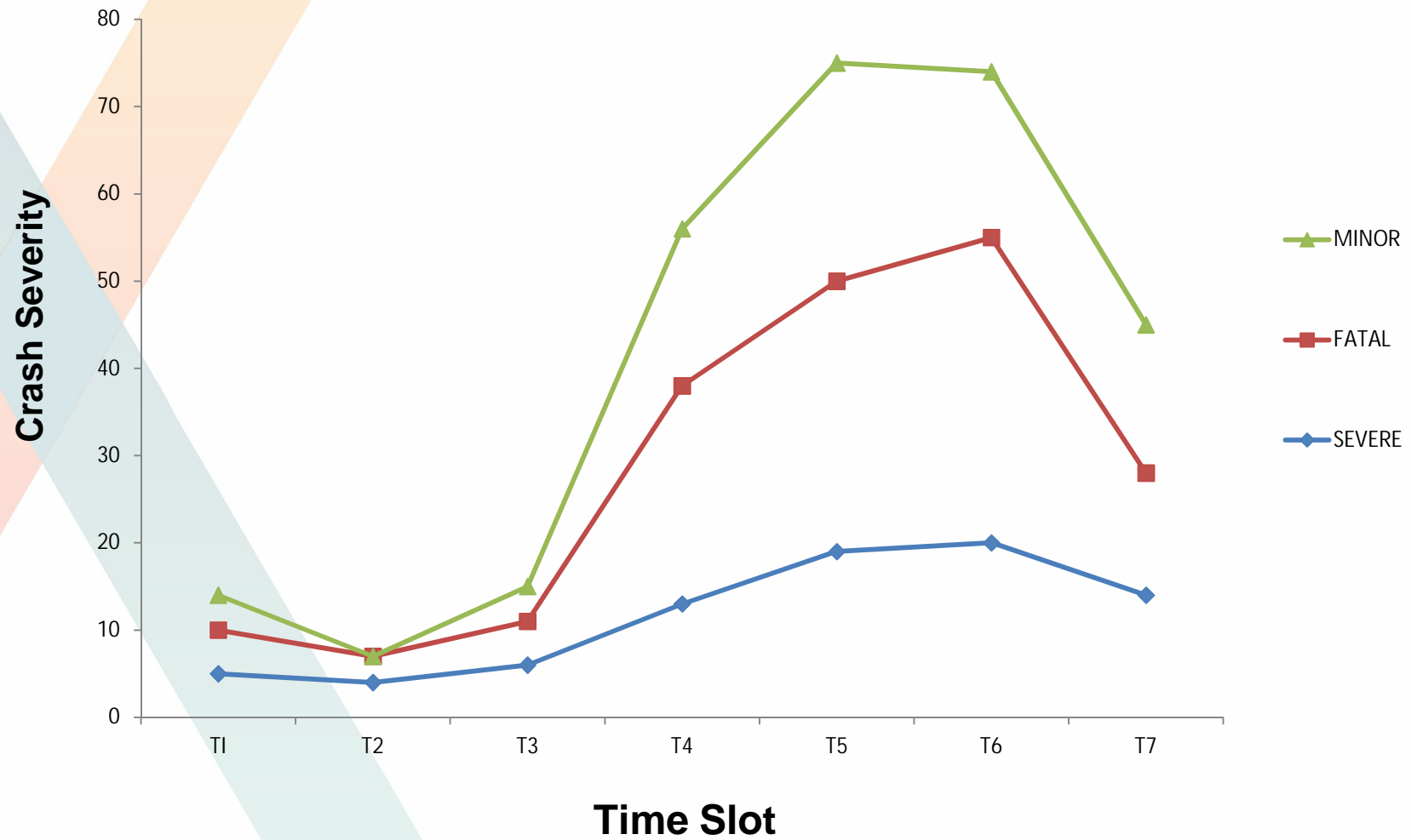


Fig. 1 Representing Severity variations v/s time slots

RESULTS

- Total 219 data point was used for the analysis.
- 80% split was used i.e. 80% for training and 20% data for testing purpose.
- Weka's default parameter's value were used.

Overall Accuracy of Models

S. No.	Model Used	Kappa Statistics	Accuracy in Percentage
1	J48	0.3189	54.545
2	Random Forest	0.3704	59.09

Confusion Matrix Representation-

Predicted class

Actual
Class

	Yes	No	Total
Yes	TP	FN	P
No	FP	TN	N
Total	P'	N'	

•J48 Confusion Matrix

a	b	c
6	3	5
5	10	3
2	2	8

a = severe

b = Minor

c = fatal

J48: Detailed accuracy by class

TP Rate	Precision	ROC Area	Class
0.429	0.462	0.692	Severe
0.556	0.667	0.703	Minor
0.667	0.500	0.725	Fatal

Table 2 Representing values of different accuracy measures by class

Random Forest

- Confusion Matrix

a	b	c
9	13	2
2	13	3
4	4	4

- Detailed Accuracy by Class

TP Rate	Precision	ROC area	Class
0.643	0.600	0.649	Severe
0.722	0.650	0.792	Minor
0.333	0.444	0.628	Fatal

CONCLUSIONS

- J48 model was identified as good in predicting fatal crashes having high TP rate as 0.667.
- Random forest model was identified as good in predicting the minor crashes and sever crashes in the city having TP rate 0.722 and 0.643 respectively.
- Kappa values of J48 and Random forest model were observed as 0.32 and 0.37 which falls in fair agreement range (Landis and Koch, 1977).

- No. of access/km was found to be single most important attribute in predicting crash severity.
- Time of the day, land use, median openings, shoulder conditions, parked vehicles, warning signs, length of the stretch, street lights and turning traffic were found to be significant.

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Thank You.!!