# DRIVER BEHAVIOUR CLASSIFICATION FRAMEWORK IN THE CONTEXT OF CAR FOLLOWING FOR DRIVERS IN MALAYSIA BASED ON RANDOM FOREST ALGORITHM

### MOHAMMED TALAL SALEEM

A thesis submitted in fulfillment of the requirement for the award of the Doctor of Philosophy in Electrical Engineering

Faculty of Electrical and Electronic Engineering Universiti Tun Hussein Onn Malaysia

i

MAY 2023

I dedicate this PhD thesis to my beloved family (my father, my mother and my sisters).

### ACKNOWLEDGEMENT

First and foremost, I would like to thank God Almighty for giving me the strength, knowledge, ability and opportunity to undertake this research study and to complete it satisfactorily.

My gratitude goes to my supervisor in person of Assoc. Prof. Dr. Khairun Nidzam Bin Ramli, for his patience, kindness, guidance and advice throughout the research.

In my journey towards this degree, I have found a teacher, a friend, an inspiration, Dr. Bilal Bahaa Zaidan. He has been there providing his support at all times and has given me invaluable guidance, inspiration and suggestions in my quest for knowledge. I thank him for his support and assistance.

I would also like to express my gratitude to my wonderful friends. Without their contribution, this work would have taken much longer time to be accomplished. My warmest appreciation to my beloved parents who support me with their love. My heart overflows with gratitude for my sisters.



#### ABSTRACT

Increasing road fatalities year after year is a significant challenge in many countries. However, real-time driver behaviour modelling in the car-following context for drivers in Malaysia has not been adequately studied due to issues with dataset, including availability, accuracy, completeness, diversity, data acquisition system availability, and techniques suitability. Hence, a five-phase methodology was designed to model driver behaviour in the car-following context for drivers in Malaysia. Review of previous work from literature, designing of a data collection system (DAS), profiling and analysing driver behaviour in the car-following context, classifying driver behaviour in the car-following context and solving issues related to missing LiDAR data represents the five phases of methodology, respectively. The real-time experiment on a federal highway road in Malaysia involved 30 participants. The results indicated that the proposed DAS design's efficiency, power, and capacity enabled it to collect driver behaviour data, pre-process it (on-board), and gather missing information due to road curvatures. Also, gender and age have statistically significant effects on drivers' behaviour during the car-following context for drivers in Malaysia. Female drivers are speedier (risky) and more cautious (keeping a long distance to the front car) than their male counterparts. Female drivers produced the optimum style and good stability behaviour in traffic flow and reported efficient driving style, while traffic status evaluation is difficult to be predicted when having male drivers on road. Senior drivers are regarded as safe drivers (less speedy) and are more prone to causing traffic disturbances than other groups of drivers. Middle-aged drivers reported efficient traffic flow characteristics. The classification framework showed that the Random Forest algorithm is the best technique, achieving 100% accuracy, 100% precision, and 100% recall, with speed and distance as the most effective classification features. The Random Forest algorithm can also impute the missing values of the LiDAR sensor. The result confirmed that the classification accuracy did not vary when using an imputed dataset (validation for the imputation process).



#### ABSTRAK





mengesahkan bahawa ketepatan klasifikasi tidak berbeza apabila menggunakan set data yang dikira (pengesahan untuk proses imputasi).

# CONTENTS

	TIT	LE	i
	DEC	CLARATION	ii
	DEI	DICATION	iii
	ACI	KNOWLEDGEMENT	iv
	ABS	STRACT	v
	ABS	STRAK	vi
	CO	NTENTS	viii
	LIS	T OF TABLES	xiv
	LIS	T OF FIGURES	xvi
	LIS	T OF ABBREVIATIONS	xix
	LIS	T OF APPENDICES	xxi
CHAPTER 1	INT	RODUCTION	1
	1.1	Introduction	1
	1.2	Car following context	1
	1.3	Research Background	8
	1.4	Problem Background	11
	1.5	Problem Statement	18
	1.6	Research Objectives	19
	1.7	Research Question	20
	1.8	Research Scope	20
	1.9	Research Significance	21

1.10	Thesis Outline	21
CHAPTER 2	LITERATURE REVIEW	23
2.1	Introduction	23
2.2	Topic definition	24
2.3	Operational Definition	25
2.4	Systematic Review Protocol	25
	2.4.1 Information Source	26
	2.4.2 Study Selection	26
	2.4.3 Inclusion and Exclusion Criteria	29
2.5	Literature and Taxonomy	31
	2.5.1 Review Articles on Car-Following	33
	2.5.2 Learning based Development Efforts	33
	2.5.3 Articles used Instrumented-Car Dataset	34
2.6	Literature Discussion	37
	2.6.1 Issues and Challenges	37
	2.6.1.1 Sensors Issues	37
	2.6.1.2 Driver Safety Issues	38
	2.6.1.3 Dataset Issues	39
	2.6.2 Recommendations	40
	2.6.2.1 Car Manufactures and Developers	40
	2.6.2.2 Recommendations for Researchers	42
2.7	Methodological Aspects of Previous Research	42
	2.7.1 Sociodemographic Analysis	42
	2.7.2 Sample Size	43
	2.7.3 Experiment Field	44
	2.7.4 Technique of Data collection	45
2.8	Car following Model	49
	2.8.1 Driver Style Analysis	49
	2.8.2 Behaviour Profiles	49
	2.8.3 Stability Profile	63
	2.8.4 Gender and Age Factors	63

ix

		2.8.5	TTC and	1 THW Thresholds	64
		2.8.6	DAS Av	ailability	70
		2.8.7	Accurate	e Methodologies	74
	2.9	Driver	Behavior	ur Recognition Model	74
		2.9.1	Multi-C	ass Classification Problems	75
		2.9.2	Missing	Data Effect on Classification	75
	2.10	Primar	ry Recom	mended Solutions from Literature	78
		2.10.1	DAS Ar	chitecture Design	79
		2.10.2	AI Algo	rithms	80
		2.10.3	Feature	Extraction	82
		2.10.4	Imputati	on of Missing Data	82
	2.11	Critica	ıl Analysi	s	83
	2.12	Summ	ary		86
CHAPTER 3	RES	EARC	Н МЕТН	IODOLOGY	87
	3.1	Introdu	uction		87
	3.2	Resear	ch Metho	odology Phases	88
		3.2.1	Phase O	ne of Methodology	92
		3.2.2	Phase Ty	wo of Methodology	93
			3.2.2.1	Circuit Design	93
			3.2.2.2	Digital Circuit Design	97
			3.2.2.3	Circuit Measurement	100
			3.2.2.4	Circuit Capacity Analysis	101
			3.2.2.5	Software Interface Connection	103
			3.2.2.6	Hardware Implementation Procedure	104
			3.2.2.7	Installation of DAS on Instrumented Car	114
			3.2.2.8	Select the Best Height of LiDAR	115
			3.2.2.9	Experimental Study	118
			3.2.2.10	Experimental Field	121
			3.2.2.11	Participants	122
			3.2.2.12	Verification of DAS Measurements	123

	3.2.2.13	Following Car CAN-BUS Reader Test	126
	3.2.2.14	Preliminary Data	128
	3.2.2.15	Implementing Real Time Experiment	130
3.2.3	Phase Tl	hree of Methodology	130
	3.2.3.1	Speed Profile	131
	3.2.3.2	Acceleration and Deceleration Profiles	132
	3.2.3.3	Stability Behaviour Analysis	133
	3.2.3.4	Time Acceleration Instability (TAIS)	134
	3.2.3.5	Time Integrated Acceleration Instability	134
	3.2.3.6	Time Deceleration Instability (TDIS)	135
	3.2.3.7	Time Integrated Deceleration Instability	135
	3.2.3.8	Surrogate Safety Measures	135
	3.2.3.9	Time to Collision (TTC)	136
	3.2.3.10	Time Exposed Time to Collision (TET)	137
	3.2.3.11	Time integrated Time-to-Collision (TIT)	138
	3.2.3.12	Time Headway (THW)	139
	3.2.3.13	Time Exposed Time Headway (TETH)	140
	3.2.3.14	Time Integrated Time Headway (TITH)	141
	3.2.3.15	Gender Analysis (Male VS Female)	142
	3.2.3.16	The Effect of Age on Driving Style	142
3.2.4	Phase Fo	our of Methodology	143
	3.2.4.1	Labelling Procedure	145
	3.2.4.2	Feature Generation	147
	3.2.4.3	Classification Model	148
	3.2.4.4	Measured metrics	151
3.2.5	Phase Fi	ve of Methodology	151
	3.2.5.1	Imputation Steps	152
Summ	ary		156

3.3 Summary xi

CHAPTER 4	Resu	It and discussion	157
	<i>A</i> 1	Introduction	157
	4.1	Data Classing and Dro Drocessing	159
	4.2	Data Cleansing and FIe-Flocessing	150
	4.3		158
		4.3.1 Driving Speed	158
		4.3.2 Gap Distance	159
		4.3.3 Acceleration and Deceleration Analysis	161
		4.3.3.1 Stability Parameters	161
		4.3.4 Pearson Correlation	162
	4.4	Time to Collision Metrics	162
	4.5	Time Headway Metrics	163
	4.6	The Effect of Age on Driving Behaviour	168
		4.6.1 Age Groups and FC Speed	169
		4.6.2 Age Groups and Gap Distance	170
		4.6.3 Age Groups and THW	170
		4.6.4 Age Groups and TTC	171
		4.6.5 ANOVA Test	172
	4.7	Gender Analysis	174
		4.7.1 Gender and Speed of Following Car	175
		4.7.2 Gender and Gap Distance	176
		4.7.3 Gender and Time Headway (THW)	177
		4.7.4 Gender and Time to Collision (TTC)	178
		4.7.5 Instability Analysis for Gender	179
	4.8	Driver Classification Framework	180
		4.8.1 Driver Behaviour Labelling	181
		4.8.2 Feature Generation	187
		4.8.3 Applying Different Machine Learning	187
	4.9	LiDAR Missing Data Treatment	192
	4.10	Result of Clustering Imputed Dataset	192
	4.11	Classification Accuracy of Imputed Dataset	196
	4.12	Examination of Imputed and Eliminated Datasets	198
		4.12.1 LiDAR mean Values	198

4.12.2 Mean Speed of Following Car 199

4.13 Discussion of Results	199
4.13.1 DAS Design	199
4.13.2 Driver Metrics	205
4.13.3 Benchmarking (Comparing Country with others)	206
4.13.4 Age Comparison	209
4.13.5 Gender Comparison	211
4.13.6 Classification Algorithms	213
4.14 Summary	217
Chapter 5 Conclusion and Future Work	218
5.1 Introduction	218
5.2 Conclusion	218
5.3 Achieved Objectives	219
5.4 Research Contribution	223
5.5 Research Limitations	225
5.6 Recommendations for Future Work	225
REFERENCES	227
APPENDICES	246

xiii

## LIST OF TABLES

2.1	Sensor Usage in Experimental Studies	51
2.2	Experiment Data of Experimental Studies	58
2.3	Safety Parameters and Threshold Values in the Literature	66
2.4	Cost and Complexity Analysis of DAS	73
2.5	Example Based Car Following Models	81
3.1	Circuit Analysis Parameters	100
3.2	Resource Management of FPGA Elements	102
3.3	Values of Digital Circuit Design Parameters	103
3.4	Participants Details	122
3.5	Equipment Used in Experimental Study	123
3.6	Summarisation of Labelling Parameters	141
3.7	Generated Features	147
3.8	RF Algorithm Parameters Value	149
3.9	Parameter Settings of DT Algorithm	149
3.10	Parameter Settings of SVM Algorithm	150
3.11	Parameter Settings of KNN Algorithm	150
4.1	t-Test for FC Speed for Two Drivers	159
4.2	t-Test for Gap Distance Difference Between Two Drivers	160
4.3	Driving Behaviour Characteristics for 30 Drivers	165
4.4	Surrogate Safety Measures Parameters	166
4.5	The Effect of Age on Speed Profile of Drivers	169
4.6	The effect of Age on Gap Distance Profile of Drivers	170
4.7	The Effect of Age on THW	171
4.8	The Effect of Age on TTC	172
4.9	One-Factor ANOVA Test for Speed Profile	172
4.10	ANOVA Test for GAP Distance Profile	173
4.11	ANOVA Test for THW profile	174



4.12	ANOVA Test for TTC Profile	174
4.13	Speed Profile Comparison Between Male and Female	175
4.14	14/14 Size on Male/Female Comparison	175
4.15	Equal Sample (10/10) Size and Driving Behaviour	175
4.16	Effect of Equal Sample Size (5/5) on Driving Behaviour	176
4.17	Gap Distance Profile t-Test for 30 Drivers	176
4.18	Gap Distance Profile t-Test for (14/14) Drivers	176
4. 19	Gap Distance Profile t-Test for 10/10 drivers	177
4.20	Gap Distance Profile t-Test for 5/5 Drivers	177
4.21	THW Between Male and Female Groups	177
4.22	THW for Equal Sample Distribution	177
4.23	TTC for Equal Gender Groups	178
4.24	TTC for UnEqual Gender Groups	178
4.25	Clustering Comparisons	182
4.26	Driver Behaviour Clustering	182
4.27	Classification Result Using Different Machine Learning	191
4.28	ANN Performance	191
4. 29	RMSE values for Different Machine Learning	192
4. 30	Labelling Result for Imputed Dataset	193
4. 31	Classification Comparison Between Two Datasets	196
4.32	t-Test for Eliminated and Imputed Missing LiDAR Data	199
4.33	FC speed t-Test for Imputed and Eliminated Datasets.	199
4.34	DAS Resource Comparison	203
4.35	Comparing Proposed DAS and Other Systems	204
4.36	Comparison of Classification Frameworks	216
5.1	Research Flow for Objectives, Methodology and Goals	221



# LIST OF FIGURES

1.1	Car-following Safe Distance Threshold [10]	2
1.2	ADAS Adaptation to Driver Behaviour [20]	3
1.3	Car -Following Scenario [37].	7
1.4	Car Following Behaviour Effects on Road Traffic [38]	8
1.5	Headway illustration of car following model [96]	16
2.1	Literature Review Framework	28
2.2	Study Selection Flowchart	30
2.3	Taxonomy of Final Set of Articles	32
2.4	LiDAR View and Data Points	36
2.5	Recommendation for Different Parties	41
2.6	Published Articles for Countries [2]	43
2.7	Participants in Real-Time Experiment	44
2.8	Studies Distribution According to Experiment Sites	45
2.9	Number of Studies according to Dataset Type	46
2.10	Instrumented Car Studies Distribution	47
2.11	Date of Instrumented Car Experiments	48
2.12	Number of Used Instrumented Cars in Each Experiment	48
2.13	Missing Data Due to Road Curvature	78
2.14	Schematic Diagram of Problem Statement	85
3.1	Overview of the Research Methodology Phases	90
3.2	Research Methodology Block diagram	91
3.3	Research Flow	92
3.4	Functional Block Diagram of DAS	93
3.5	Circuit Diagram of DAS	96
3.6	Main Digital Modules inside FPGA	98
3.7	DAS Circuit Design	99



3.8	Hardware Design using Platform Design Software	105
3.9	Verilog code Flowchart	106
3.10	Pin Assignment Process	109
3.11	Successful Compilation of DAS Module.	110
3.12	Succesful Implementation of DAS Module on FPGA	111
3.13	Flow Chart of Data Acquisition System Algorithm	113
3.14	Block Diagram of DAS Hardware Design Process	114
3.15	Address Memory Map of DAS Components	114
3.16	DAS Implementation on Following Car	116
3. 17	Wiring on Positioning of DAS	117
3. 18	Experiment Design	119
3. 19	On Road Experiment	120
3.20	Road of Experiment [211]	121
3. 21	GPS Speed VS OBD2 Data of the Leading Car	125
3.22	Leading Car OBDII Data Collection Device Testing [212]	126
3.23	OBDII CAN-BUS Data Compared to GPS Data	127
3.24	Correlation Between OBDII CAN-BUS and GPS Data	128
3.25	Collected Raw dataset of DAS	129
3.26	Stability of Car Following Context	134
3.27	TET and TIT [156]	138
3.28	Classification Framework Components	144
3.29	Car Following Classification Framework Process	155
4.1	Speed and Gap Distance for All Drivers	160
4.2	Gap Distance of Single Driver	164
4.3	Car Following Spiral for Single Driver	164
4.4	Sample Driving Speed Profile for FC and LC	168
4.5	TTC value for Both Male and Female Drivers	179
4.6	Instability of Unequal Gender Distribution	180
4.7	Instability of Equal Gender Distribution	180
4.8	Labelling Process	184
4.9	Clustering of Drivers to Three Different Groups	185
4.10	Separation Distance among Clustered Groups	186
4.11	Features of Machine Learning Algorithm	189
4.12	Confusion Matrix of Random Forest Algorithm	190



4.13	Driver Behaviour Clusters of Imputed Dataset	194
4.14	Distance among Clusters using Imputed Dataset	195
4.15	Confusion Matrix of Imputed Dataset	197
4.16	Drivers in Malaysia and Drivers in Different Countries	208
4.17	Speed Comparison	209

## LIST OF ABBREVIATIONS

ACC	Acceleration
ADAS	Advanced Driver Assistance System
ANOVA	Analysis of Variance
CAN bus	Control Area Network
DAS	Data Acquisition System
Dec	Deceleration
FC	Following Car
FIFO	First in First Out
FPGA	Field Programmable Gate Array
GPS	Geographical Positioning System
ITS	Intelligent Transportation System
LC	Leading Car
LiDAR	Light Detection and Ranging
MCU	Microcontroller Unit
NDS	Naturalistic Driving Study
OBD	On Board Diagnostic
OS	Operating System
TAIS	Time Acceleration Instability
TDIS	Time Deceleration Instability
TET	Time Exposed Time to Collision
TETH	Time Exposed Time Headway
THW	Time Headway
TIAI	Time Integrated Acceleration Instability
TIDI	Time Integrated Deceleration Instability
TIT	Time Integrated to Collision
TITH	Time Integrated Time Headway



TTC	Time to Collision
VANET	Vehicle Area Network

## LIST OF APPENDICES

APPENDIX	TITLE	PAGE
А	C-Code for Communication Algorithm	246
В	Verilog Code	262
С	List of Publications	264
D	Vita	265

### **CHAPTER 1**

### **INTRODUCTION**

#### 1.1 Introduction

This section and the ones that follow provide further information on the research's title and where it came from, addressing several study topics and elements. This section provides a brief description of the current state of the thesis problem and how it evolved and developed over time. It also includes the research objectives to help the reader understand the goals and aims of this thesis. The research questions and scope are detailed to describe the enquiries and the size and limits of the thesis contribution. Finally, the thesis layout provides a brief idea of the content of the subsequent chapters.



### **1.2 Car following context**

Driver behaviour is accumulative learning built on human actions when driving a car. Like any other human behaviour, driver behaviour is generated from interactions with their surroundings, such as the environment, the car as a hardware machine, and cognitive factors (i.e., refers to the driver's cognitive abilities as a human). The abovementioned factors are made up of parameters shaping the driver's actions. As a result of the interactions, each group of people, specific community, or any defined type of population produce different driving behaviour/style due to driving conditions and environmental change according to traffic type and geographical location. In terms of traffic flow status, car-following behaviour is defined as the rear car being affected by the driving status of the front car when both cars are moving in the same lane. The car-following model is one of the microcosmic driving behaviour models [1] [2]. Figure 1.1 shows the car-following scenario.

Many transportation applications depend on accurate driver behaviour modelling. ITS, microscopic modelling of traffic, and accident analysis and prevention are three key areas that could benefit from better understanding of driver behaviour [41] [3]. This section details organisations and other parties that stand to gain from advancements and improvements in this field of study.

The car-following model significantly assists in understanding factors/circumstances that influence driver behaviour and enhance traffic safety [4] [5], especially when nearing a car from behind in a variety of ecological surroundings [6], and in comprehending in what way motorists physically respond to various crucial circumstances and stream of traffic situations, such as a near-crash [7]. Understanding the causes of auto accidents and evaluating safety rules and regulations can be done by simulating driver performance, mainly mistakes, in the situation of a car-following situation in numerous simulated or actual experiments [7] [8], guaranteeing the configuration of reliable reactions to life-threatening cases [9]. Multiple metrics are represented by the characteristics that influence motorist performance in the context of car-following, such as road and real-time traffic flow situations. Models of carfollowing are changing over time and developing. Figure 1.1 presents a car-following scenario.



Figure 1. 1: Car-following Safe Distance Threshold [10]

Where, respectively, a1 and v1 represent the leading vehicle's acceleration and speed. L2 measures how close the leader and following are to one another. The accelerating speed and velocity of the car after it, respectively, are a2 and v2.

Complex traffic circumstances can be greatly influenced by different drivers with different driving styles. In the context of car-following, driver behaviour modelling can offer useful insights about traffic in terms of congestion, changing conditions, and continuous characteristics. Additionally, a car-following model can offer superior ways to end delays in busy places [4] [5] [6]. A good adaption approach for incorporating driver characteristics in ADAS can be built using elements of driver behaviour in the context of car-following. In order to maintain these technologies, satisfy people, and incorporate driving characteristics into intelligent system designs, ADAS adaption to driver behaviour is essential [11] [6] [12] [13] [14] [15] [16] [17] [18] [19]. Figure 1.2 shows how ADAS adapts to driver behaviour.



Figure 1. 2: ADAS Adaptation to Driver Behaviour [20]

Figure 1.2 presents the concept of the particular flexibility of the driver. The initial phase comprises deriving the characteristics of the driver, such as naturalistic headway distance, from the driving data of the driver, vehicle, and surroundings gathered using a continuous logging drive recorder. Identification of the deviating states, such as reduced attention and bad driving behaviour on the next driving task, is the next phase. By comparing the newly acquired driving data with a driver model that is based on extracted features and takes into account the longitudinal and lateral dynamics of the car, recognition is performed. According to how much the driving situation has changed, the system delivers driver support. Information on driver state can be utilised to choose the optimum assistance approach for the motorists, such as information assistance, driving advice, collision warning, or intervention operation, in order to promote driver acceptance of the system [20].

Advantages for ITS are mostly anticipated in the area of ADAS, in which some assistance/control logics or systems, like ACC, engage with motorists and where it is important to take into account both drivers' intentions and the effects of developments on their behaviour in order to increase (a) the efficiency of the innovations, (b) road (and traffic) safeness, and (c) acceptability of technology innovations [3] [21] [22].



Traffic focus and pace are greatly influenced by speed and the distance between two vehicles [23]. Moreover, a car-following model can recognise eco-habits and create automated processes that can be incorporated into the design of smart automotive products for autonomous vehicles [24] [25] [26] [27].

In the area of car-following, machine learning-based techniques are advised for modelling driver behaviour since they are faster, require less data handling, and avoid making long-term adjustments to metrics [28]. Additionally, machine learning techniques can reveal obscure characteristics that influence driving behaviour, providing a significant advantage in designing autonomous vehicles and comprehending traffic patterns [29] [30] [31]. Because they bring practicality, sufficiency, consistency, and further data inclusion to the modelling process, datadriven approaches can take the role of hypothesis-based approaches [28]. Online intelligent solutions that instantly recognise driving style can be implemented for the advantage of insurance companies and ITS development organisations [32] [33].

It is possible to use car following models to assess the loading conditions for bridges as well as to predict and test the traffic flow. The patterns of traffic loading have not received considerable attention [34]. When using precise information for specific populations, car-following models can produce useful results. Depending on their local environmental conditions, driving customs, automobile makes and models, traffic rules and policies, types of roads, and other variables, each group of people, country, or city displays a different driving behaviour. Examining driving practises in different nations' car-following contexts is crucial [35] [36].



$$S_1 = V_0. t_1 \tag{1.1}$$

The braking distance in braking action stage  $S_2$  is as follows:

$$S_2 = V_0 \cdot t_2 - \frac{1}{6}a_1 \cdot (t_2)^2 \tag{1.2}$$

The braking distance in continuous braking stage  $S_3$  is as follows:



### REFERENCES

- [1] X. Chang, H. Li, J. Rong, Z. Huang, X. Chen, and Y. Zhang, "Effects of on-Board Unit on Driving Behavior in Connected Vehicle Traffic Flow," *Journal of Advanced Transportation*, vol. 2019, p. 12, 2019.
- [2] M. Talal, K. N. Ramli, A. A. Zaidan, B. B. Zaidan, and F. Jumaa, "Review on car-following sensor based and data-generation mapping for safety and traffic management and road map toward ITS," *Vehicular Communications*, p. 100280, 2020/07/15/ 2020.
- [3] L. Pariota and G. N. Bifulco, "Experimental evidence supporting simpler Action Point paradigms for car-following," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 35, pp. 1-15, 2015/11/01/ 2015.
- [4] T. Q. Tang, J. G. Li, H. J. Huang, and X. B. Yang, "A car-following model with real-time road conditions and numerical tests," *Measurement*, vol. 48, pp. 63-76, 2014/02/01/ 2014.
- [5] J. Wang, R. Chai, and X. Xue, "The Effects of Stop-and-go Wave on the Immediate Follower and Change in Driver Characteristics," *Procedia Engineering*, vol. 137, pp. 289-298, 2016/01/01/ 2016.
- [6] W. Wang, W. Zhang, H. Guo, H. Bubb, and K. Ikeuchi, "A safety-based approaching behavioural model with various driving characteristics," *Transportation Research Part C: Emerging Technologies*, vol. 19, pp. 1202-1214, 2011/12/01/ 2011.
- M. Saifuzzaman and Z. Zheng, "Incorporating human-factors in car-following models: A review of recent developments and research needs," *Transportation Research Part C: Emerging Technologies*, vol. 48, pp. 379-403, 2014/11/01/ 2014.
- [8] C. Deng, C. Wu, S. Cao, and N. Lyu, "Modeling the effect of limited sight distance through fog on car-following performance using QN-ACTR cognitive architecture," *Transportation Research Part F: Traffic Psychology and Behaviour*, 2018/02/03/ 2018.
- [9] L. Dimitriou, K. Stylianou, and M. A. Abdel-Aty, "Assessing rear-end crash potential in urban locations based on vehicle-by-vehicle interactions, geometric characteristics and operational conditions," *Accident Analysis & Prevention*, vol. 118, pp. 221-235, 2018/09/01/ 2018.
- [10] H. Suzuki and T. Nakatsuji, "Dynamic Estimation of Headway Distance in Vehicle Platoon System under Unexpected Car-following Situations," *Transportation Research Procedia*, vol. 6, pp. 172-188, 2015.
- [11] X. Li, X. Yan, J. Wu, E. Radwan, and Y. Zhang, "A rear-end collision risk assessment model based on drivers' collision avoidance process under influences of cell phone use and gender—A driving simulator based study," *Accident Analysis & Prevention*, vol. 97, pp. 1-18, 2016/12/01/ 2016.

- [12] Z. J. Long and J. F. Li, "An Adaptive Network Fuzzy Inference System Controller for Car Following Behavior," in *Advanced Materials Research*, 2011, pp. 1156-1161.
- [13] Y. Wu, M. Abdel-Aty, Q. Cai, J. Lee, and J. Park, "Developing an algorithm to assess the rear-end collision risk under fog conditions using real-time data," *Transportation Research Part C: Emerging Technologies*, vol. 87, pp. 11-25, 2018/02/01/ 2018.
- [14] L. Pariota, G. N. Bifulco, F. Galante, A. Montella, and M. Brackstone, "Longitudinal control behaviour: Analysis and modelling based on experimental surveys in Italy and the UK," *Accident Analysis & Prevention*, vol. 89, pp. 74-87, 2016.
- [15] M. Powelleit and M. Vollrath, "Situational influences on response time and maneuver choice: Development of time-critical scenarios," *Accident Analysis* & *Prevention*, vol. 122, pp. 48-62, 2019/01/01/ 2019.
- [16] H. Berndt and K. Dietmayer, "Driver intention inference with vehicle onboard sensors," in Vehicular Electronics and Safety (ICVES), 2009 IEEE International Conference on, 2009, pp. 102-107.
- [17] J. M. Fleming, C. K. Allison, X. Yan, N. A. Stanton, and R. Lot, "Adaptive driver modelling in ADAS to improve user acceptance: A study using naturalistic data," *Safety Science*, 2018/08/30/ 2018.
- [18] G. N. Bifulco, F. Galante, L. Pariota, M. Russo Spena, and P. Del Gais, "Data Collection for Traffic and Drivers' Behaviour Studies: A Large-scale Survey," *Procedia - Social and Behavioral Sciences*, vol. 111, pp. 721-730, 2014/02/05/ 2014.
- [19] G. N. Bifulco, L. Pariota, M. Brackstione, and M. McDonald, "Driving behaviour models enabling the simulation of Advanced Driving Assistance Systems: revisiting the Action Point paradigm," *Transportation Research Part C: Emerging Technologies*, vol. 36, pp. 352-366, 2013/11/01/2013.
- [20] S. Saigo, P. Raksincharoensak, and M. Nagai, "Estimation of Driving Performance Level Using Longitudinal and Lateral Driver Models," *IFAC Proceedings Volumes*, vol. 46, pp. 145-150, 2013/01/01/ 2013.
- [21] X. Ma and M. Jansson, "A model identification scheme for driver-following dynamics in road traffic," *Control Engineering Practice*, vol. 21, pp. 807-817, 2013/06/01/ 2013.
- [22] A. Kesting, M. Treiber, M. Schönhof, and D. Helbing, "Adaptive cruise control design for active congestion avoidance," *Transportation Research Part C: Emerging Technologies*, vol. 16, pp. 668-683, 2008/12/01/ 2008.
- [23] E. Morello, S. Toffolo, and G. Magra, "Impact Analysis of Ecodriving Behaviour Using Suitable Simulation Platform (ICT-EMISSIONS Project)," *Transportation Research Proceedia*, vol. 14, pp. 3119-3128, 2016/01/01/ 2016.
- [24] Y. Huang, E. C. Y. Ng, J. L. Zhou, N. C. Surawski, E. F. C. Chan, and G. Hong, "Eco-driving technology for sustainable road transport: A review," *Renewable and Sustainable Energy Reviews*, vol. 93, pp. 596-609, 2018/10/01/ 2018.
- [25] C. Roncoli, I. Papamichail, and M. Papageorgiou, "Model predictive control for multi-lane motorways in presence of VACS," in *Intelligent Transportation Systems (ITSC), 2014 IEEE 17th International Conference on*, 2014, pp. 501-507.
- [26] X.-M. Chen, M. Jin, Y.-s. Miao, and Q. Zhang, "Driving decision-making analysis of car-following for autonomous vehicle under complex urban

228

environment," Journal of Central South University, vol. 24, pp. 1476-1482, 2017.

- [27] L. Claussmann, M. O'Brien, S. Glaser, H. Najjaran, and D. Gruyer, "Multi-Criteria Decision Making for Autonomous Vehicles using Fuzzy Dempster-Shafer Reasoning," in 2018 IEEE Intelligent Vehicles Symposium (IV), 2018, pp. 2195-2202.
- [28] V. Papathanasopoulou and C. Antoniou, "Towards data-driven car-following models," *Transportation Research Part C: Emerging Technologies*, vol. 55, pp. 496-509, 2015/06/01/ 2015.
- [29] J. Zhang and A. El Kamel, "Virtual traffic simulation with neural network learned mobility model," *Advances in Engineering Software*, vol. 115, pp. 103-111, 2018/01/01/ 2018.
- [30] Y. Zhang, Q. Lin, J. Wang, and S. Verwer, "Car-following Behavior Model Learning Using Timed Automata," *IFAC-PapersOnLine*, vol. 50, pp. 2353-2358, 2017.
- [31] J. Liang, Z. Sha, and L. Chen, "Dynamic Neural Network-Based Integrated Learning Algorithm for Driver Behavior," *Journal of Transportation Systems Engineering and Information Technology*, vol. 12, pp. 34-40, 2012/04/01/ 2012.
- [32] T. Sato and M. Akamatsu, "Modeling and prediction of driver preparations for making a right turn based on vehicle velocity and traffic conditions while approaching an intersection," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 11, pp. 242-258, 2008/07/01/ 2008.
- [33] J. Monteil, N. OHara, V. Cahill, and M. Bouroche, "Real-time estimation of drivers' behaviour," in *Intelligent Transportation Systems (ITSC), 2015 IEEE 18th International Conference on,* 2015, pp. 2046-2052.
- [34] D. Guo and C. C. Caprani, "Traffic load patterning on long span bridges: A rational approach," *Structural Safety*, vol. 77, pp. 18-29, 2019/03/01/ 2019.
- [35] M. Zhu, X. Wang, A. Tarko, and S. e. Fang, "Modeling car-following behavior on urban expressways in Shanghai: A naturalistic driving study," *Transportation Research Part C: Emerging Technologies*, vol. 93, pp. 425-445, 2018/08/01/ 2018.
- [36] M. Treiber and A. Kesting, "Microscopic Calibration and Validation of Car-Following Models – A Systematic Approach," *Procedia - Social and Behavioral Sciences*, vol. 80, pp. 922-939, 2013/06/07/2013.
- [37] S. Wu, W. Wang, Z. Li, and L. Gao, "A Collision Warning Device Based on the Emergency Braking Behavior Prediction," in *International Conference on Man-Machine-Environment System Engineering*, 2017, pp. 415-422.
- [38] B. Chang and J. Chiou, "Cloud Computing-Based Analyses to Predict Vehicle Driving Shockwave for Active Safe Driving in Intelligent Transportation System," *IEEE Transactions on Intelligent Transportation Systems*, pp. 1-15, 2019.
- [39] Z. Camlica, A. Hilal, and D. Kulić, "Feature abstraction for driver behaviour detection with stacked sparse auto-encoders," in 2016 IEEE International Conference on Systems, Man, and Cybernetics (SMC), 2016, pp. 003299-003304.
- [40] A. Allamehzadeh and C. Olaverri-Monreal, "Automatic and manual driving paradigms: Cost-efficient mobile application for the assessment of driver inattentiveness and detection of road conditions," in 2016 IEEE Intelligent Vehicles Symposium (IV), 2016, pp. 26-31.

- [41] C. Saiprasert, S. Thajchayapong, T. Pholprasit, and C. Tanprasert, "Driver behaviour profiling using smartphone sensory data in a V2I environment," in 2014 International Conference on Connected Vehicles and Expo (ICCVE), 2014, pp. 552-557.
- [42] J. Lu, D. Filev, and F. Tseng, "Real-time determination of driver's driving behavior during car following," *SAE International Journal of Passenger Cars-Electronic and Electrical Systems*, vol. 8, pp. 371-378, 2015.
- [43] X. Geng, H. Liang, H. Xu, and B. Yu, "Influences of Leading-Vehicle Types and Environmental Conditions on Car-Following Behavior," *IFAC-PapersOnLine*, vol. 49, pp. 151-156, 2016/01/01/ 2016.
- [44] H. Zhang, C. Wu, X. Yan, and T. Z. Qiu, "The effect of fatigue driving on car following behavior," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 43, pp. 80-89, 2016/11/01/ 2016.
- [45] J. O. Brooks, M. C. Crisler, N. Klein, R. Goodenough, R. W. Beeco, C. Guirl, et al., "Speed choice and driving performance in simulated foggy conditions," Accident Analysis & Prevention, vol. 43, pp. 698-705, 2011/05/01/ 2011.
- [46] N. Lyu, Y. Cao, C. Wu, J. Xu, and L. Xie, "The effect of gender, occupation and experience on behavior while driving on a freeway deceleration lane based on field operational test data," *Accident Analysis & Prevention*, vol. 121, pp. 82-93, 2018.
- [47] N. Rhodes and K. Pivik, "Age and gender differences in risky driving: The roles of positive affect and risk perception," *Accident Analysis & Prevention*, vol. 43, pp. 923-931, 2011.
- [48] S. Oltedal and T. Rundmo, "The effects of personality and gender on risky driving behaviour and accident involvement," *Safety science*, vol. 44, pp. 621-628, 2006.
- [49] H. Gwyther and C. Holland, "The effect of age, gender and attitudes on self-regulation in driving," *Accident Analysis & Prevention*, vol. 45, pp. 19-28, 2012.
- [50] P. Cordellieri, F. Baralla, F. Ferlazzo, R. Sgalla, L. Piccardi, and A. M. Giannini, "Gender effects in young road users on road safety attitudes, behaviors and risk perception," *Frontiers in psychology*, vol. 7, p. 1412, 2016.
- [51] T. Özkan and T. Lajunen, "What causes the differences in driving between young men and women? The effects of gender roles and sex on young drivers' driving behaviour and self-assessment of skills," *Transportation research part F: Traffic psychology and behaviour*, vol. 9, pp. 269-277, 2006.
- [52] R. Zaidan, A. Alamoodi, B. Zaidan, A. Zaidan, O. Albahri, M. Talal, *et al.*, "Comprehensive driver behaviour review: Taxonomy, issues and challenges, motivations and research direction towards achieving a smart transportation environment," *Engineering Applications of Artificial Intelligence*, vol. 111, p. 104745, 2022.
- [53] E. Ramezani-Khansari, M. Tabibi, F. Moghadas Nejad, and M. Mesbah, "Comparing the effect of age, gender, and desired speed on car-following behavior by using driving simulator," *Journal of advanced transportation*, vol. 2021, 2021.
- [54] U. Gazder and K. J. Assi, "Determining driver perceptions about distractions and modeling their effects on driving behavior at different age groups," *Journal* of *Traffic and Transportation Engineering (English Edition)*, 2021.
- [55] I. Milleville-Pennel and S. Marquez, "Comparison between elderly and young drivers' performances on a driving simulator and self-assessment of their

driving attitudes and mastery," Accident Analysis & Prevention, vol. 135, p. 105317, 2020.

- [56] W. Young, A. Sobhani, M. G. Lenné, and M. Sarvi, "Simulation of safety: A review of the state of the art in road safety simulation modelling," *Accident Analysis & Prevention*, vol. 66, pp. 89-103, 2014.
- [57] K. Grove, S. Soccolich, J. Engström, and R. Hanowski, "Driver visual behavior while using adaptive cruise control on commercial motor vehicles," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 60, pp. 343-352, 2019/01/01/ 2019.
- [58] Z. Lu, T. Fu, L. Fu, S. Shiravi, and C. Jiang, "A video-based approach to calibrating car-following parameters in VISSIM for urban traffic," *International Journal of Transportation Science and Technology*, vol. 5, pp. 1-9, 2016/08/01/ 2016.
- [59] R. Balakrishna, D. Morgan, H. Slavin, and Q. Yang, "Large-Scale Traffic Simulation Tools for Planning and Operations Management," *IFAC Proceedings Volumes*, vol. 42, pp. 117-122, 2009/01/01/ 2009.
- [60] H. R. Eftekhari and M. Ghatee, "Hybrid of discrete wavelet transform and adaptive neuro fuzzy inference system for overall driving behavior recognition," *Transportation research part F: traffic psychology and behaviour*, vol. 58, pp. 782-796, 2018.
- [61] W.-H. Chen, Y.-C. Lin, and W.-H. Chen, "Comparisons of machine learning algorithms for driving behavior recognition using in-vehicle CAN bus data," in 2019 Joint 8th International Conference on Informatics, Electronics & Vision (ICIEV) and 2019 3rd International Conference on Imaging, Vision & Pattern Recognition (icIVPR), 2019, pp. 268-273.
- [62] M. Savelonas, S. Karkanis, and E. Spyrou, "Classification of Driving Behaviour using Short-term and Long-term Summaries of Sensor Data," in 2020 5th South-East Europe Design Automation, Computer Engineering, Computer Networks and Social Media Conference (SEEDA-CECNSM), 2020, pp. 1-4.
- [63] C. M. Martinez, M. Heucke, F.-Y. Wang, B. Gao, and D. Cao, "Driving style recognition for intelligent vehicle control and advanced driver assistance: A survey," *IEEE Transactions on Intelligent Transportation Systems*, vol. 19, pp. 666-676, 2017.
- [64] H. Wang, M. Gu, S. Wu, and C. Wang, "A driver's car-following behavior prediction model based on multi-sensors data," *EURASIP Journal on Wireless Communications and Networking*, vol. 2020, pp. 1-12, 2020.
- [65] Y. Wang, X. Yu, J. Guo, I. Papamichail, M. Papageorgiou, L. Zhang, et al., "Macroscopic traffic flow modelling of large-scale freeway networks with field data verification: State-of-the-art review, benchmarking framework, and case studies using METANET," *Transportation Research Part C: Emerging Technologies*, vol. 145, p. 103904, 2022.
- [66] L. Vasconcelos, L. Neto, S. Santos, A. B. Silva, and Á. Seco, "Calibration of the Gipps Car-following Model Using Trajectory Data," *Transportation Research Procedia*, vol. 3, pp. 952-961, 2014/01/01/ 2014.
- [67] B. Coifman, M. Wu, K. Redmill, and D. A. Thornton, "Collecting ambient vehicle trajectories from an instrumented probe vehicle: High quality data for microscopic traffic flow studies," *Transportation Research Part C: Emerging Technologies*, vol. 72, pp. 254-271, 2016/11/01/ 2016.

- [68] G. Guido, V. Astarita, V. Giofré, and A. Vitale, "Safety performance measures: a comparison between microsimulation and observational data," *Procedia* -*Social and Behavioral Sciences*, vol. 20, pp. 217-225, 2011/01/01/ 2011.
- [69] R. Jiang, M.-B. Hu, H. M. Zhang, Z.-Y. Gao, B. Jia, and Q.-S. Wu, "On some experimental features of car-following behavior and how to model them," *Transportation Research Part B: Methodological*, vol. 80, pp. 338-354, 2015/10/01/ 2015.
- [70] Q. Chao, J. Shen, and X. Jin, "Video-based personalized traffic learning," *Graphical Models*, vol. 75, pp. 305-317, 2013.
- [71] A. Sharma, Z. Zheng, and A. Bhaskar, "A pattern recognition algorithm for assessing trajectory completeness," *Transportation Research Part C: Emerging Technologies*, vol. 96, pp. 432-457, 2018/11/01/ 2018.
- [72] C. Sazara, R. V. Nezafat, and M. Cetin, "Offline reconstruction of missing vehicle trajectory data from 3D LIDAR," in *Intelligent Vehicles Symposium* (*IV*), 2017 IEEE, 2017, pp. 792-797.
- [73] N. van Nes, J. Bärgman, M. Christoph, and I. van Schagen, "The potential of naturalistic driving for in-depth understanding of driver behavior: UDRIVE results and beyond," *Safety Science*, 2019/01/23/2019.
- [74] L. Chong, M. M. Abbas, A. M. Flintsch, and B. Higgs, "A rule-based neural network approach to model driver naturalistic behavior in traffic," *Transportation Research Part C: Emerging Technologies*, vol. 32, pp. 207-223, 2013.
- [75] E. Paschalidis, C. F. Choudhury, and S. Hess, "Modelling the effects of stress on gap-acceptance decisions combining data from driving simulator and physiological sensors," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 59, pp. 418-435, 2018/11/01/ 2018.
- [76] S. Battiato, G. M. Farinella, G. Gallo, and O. Giudice, "On-board monitoring system for road traffic safety analysis," *Computers in Industry*, vol. 98, pp. 208-217, 2018/06/01/ 2018.
- [77] H. X. Liu and J. Sun, "Length-based vehicle classification using event-based loop detector data," *Transportation Research Part C: Emerging Technologies*, vol. 38, pp. 156-166, 2014.
- [78] X. Xie, H. van Lint, and A. Verbraeck, "A generic data assimilation framework for vehicle trajectory reconstruction on signalized urban arterials using particle filters," *Transportation Research Part C: Emerging Technologies*, vol. 92, pp. 364-391, 2018/07/01/ 2018.
- [79] H. Li, N. Chen, L. Qin, L. Jia, and J. Rong, "Queue length estimation at signalized intersections based on magnetic sensors by different layout strategies," *Transportation Research Procedia*, vol. 25, pp. 1626-1644, 2017/01/01/ 2017.
- [80] C. W. Hsu, T. H. Hsu, C. H. Chen, and Y. Y. Kuo, "A path planning achievement of car following in motion control via lidar sensing," *Industrial Electronics and Applications*, pp. 1411-1416, 2010.
- [81] K. Mohammed, M. Abdelhafid, K. Kamal, N. Ismail, and A. Ilias, "Intelligent driver monitoring system: An Internet of Things-based system for tracking and identifying the driving behavior," *Computer Standards & Interfaces*, vol. 84, p. 103704, 2023.
- [82] S. Kanarachos, S.-R. G. Christopoulos, and A. Chroneos, "Smartphones as an integrated platform for monitoring driver behaviour: The role of sensor fusion

- [83] J. Shen and X. Jin, "Detailed traffic animation for urban road networks," *Graphical Models*, vol. 74, pp. 265-282, 2012/09/01/ 2012.
- [84] J. Taylor, X. Zhou, N. M. Rouphail, and R. J. Porter, "Method for investigating intradriver heterogeneity using vehicle trajectory data: A Dynamic Time Warping approach," *Transportation Research Part B: Methodological*, vol. 73, pp. 59-80, 2015.
- [85] V. Gallelli, G. Guido, A. Vitale, and R. Vaiana, "Effects of calibration process on the simulation of rear-end conflicts at roundabouts," *Journal of Traffic and Transportation Engineering (English Edition)*, 2018/11/14/2018.
- [86] C. Lima Azevedo, B. Ciuffo, J. L. Cardoso, and M. E. Ben-Akiva, "Dealing with uncertainty in detailed calibration of traffic simulation models for safety assessment," *Transportation Research Part C: Emerging Technologies*, vol. 58, pp. 395-412, 2015/09/01/ 2015.
- [87] M. R. K. Siam, S. Nasrin, M. Hadiuzzaman, S. M. Muniruzzaman, and N. Haque, "VISCAL: Heuristic algorithm based application tool to calibrate microscopic simulation parameters," *Journal of Traffic and Transportation Engineering (English Edition)*, vol. 5, pp. 28-43, 2018/02/01/ 2018.
- [88] Y. Han and S. Ahn, "Stochastic modeling of breakdown at freeway merge bottleneck and traffic control method using connected automated vehicle," *Transportation Research Part B: Methodological*, vol. 107, pp. 146-166, 2018/01/01/ 2018.
- [89] J. Przybyla, J. Taylor, J. Jupe, and X. Zhou, "Estimating risk effects of driving distraction: A dynamic errorable car-following model," *Transportation research part C: emerging technologies*, vol. 50, pp. 117-129, 2015.
- [90] P. Wagner, "Analyzing fluctuations in car-following," *Transportation Research Part B: Methodological*, vol. 46, pp. 1384-1392, 2012/12/01/ 2012.
- [91] S. Yang, Y.-J. Wu, Z. Yin, and Y. Feng, "Estimating Freeway Travel Times Using the General Motors Model," *Transportation Research Record: Journal of the Transportation Research Board*, pp. 83-94, 2016.
- [92] M. Brackstone, B. Waterson, and M. McDonald, "Determinants of following headway in congested traffic," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 12, pp. 131-142, 2009/03/01/ 2009.
- [93] H. R. Terry, S. G. Charlton, and J. A. Perrone, "The role of looming and attention capture in drivers' braking responses," *Accident Analysis & Prevention*, vol. 40, pp. 1375-1382, 2008.
- [94] L. Li and X. Chen, "Vehicle headway modeling and its inferences in macroscopic/microscopic traffic flow theory: A survey," *Transportation Research Part C: Emerging Technologies*, vol. 76, pp. 170-188, 2017/03/01/2017.
- [95] A. Kendziorra, P. Wagner, and T. Toledo, "A Stochastic Car Following Model," *Transportation Research Procedia*, vol. 15, pp. 198-207, 2016/01/01/ 2016.
- [96] S. Dong, H. Wang, D. Hurwitz, G. Zhang, and J. Shi, "Nonparametric modeling of vehicle-type-specific headway distribution in freeway work zones," *Journal of Transportation Engineering*, vol. 141, p. 05015004, 2015.
- [97] W. H. Organization, *Global status report on road safety 2015*: World Health Organization, 2015.

- [98] M. F. Musa, S. A. Hassan, and N. Mashros, "The impact of roadway conditions towards accident severity on federal roads in Malaysia," *PLoS one*, vol. 15, p. e0235564, 2020.
- [99] N. Q. Radzuan, M. H. A. Hassan, K. A. Abu Kassim, I. S. Mohd Razelan, and N. A. Othman, "The Association of Socio-demographic Characteristics Towards Driver Behaviour and Traffic Fatality in Selangor, Malaysia," in *Human-Centered Technology for a Better Tomorrow*, ed: Springer, 2022, pp. 395-405.
- [100] M. Malaysia, "Annual Transport Statistics," *Ministry of Transport Malaysia*, *Putrajaya*, vol. 7, 2016.
- [101] N. Che-Him, R. Roslan, M. S. Rusiman, K. Khalid, M. G. Kamardan, F. A. Arobi, *et al.*, "Factors Affecting Road Traffic Accident in Batu Pahat, Johor, Malaysia," in *Journal of Physics: Conference Series*, 2018, p. 012033.
- [102] Y. Darma, M. R. Karim, and S. Abdullah, "An analysis of Malaysia road traffic death distribution by road environment," *Sādhanā*, vol. 42, pp. 1605-1615, 2017.
- [103] S. J. Al-Sultan, "Context Aware Drivers' Behaviour Detection System for VANET," 2013.
- [104] S. Nair, J. L. de la Vara, M. Sabetzadeh, and L. Briand, "An extended systematic literature review on provision of evidence for safety certification," *Information and Software Technology*, vol. 56, pp. 689-717, 2014/07/01/2014.
- [105] O. Oviedo-Trespalacios, V. Truelove, B. Watson, and J. A. Hinton, "The impact of road advertising signs on driver behaviour and implications for road safety: A critical systematic review," *Transportation Research Part A: Policy and Practice*, vol. 122, pp. 85-98, 2019/04/01/ 2019.
- [106] L. M. Martín-delosReyes, E. Jiménez-Mejías, V. Martínez-Ruiz, E. Moreno-Roldán, D. Molina-Soberanes, and P. Lardelli-Claret, "Efficacy of training with driving simulators in improving safety in young novice or learner drivers: A systematic review," *Transportation Research Part F: Traffic Psychology* and Behaviour, vol. 62, pp. 58-65, 2019/04/01/ 2019.
- [107] M. A. A. Altaha, "Malaysian sign language recognition framework based on sensory glove," PH.D, Universiti Pendidikan Sultan Idris, 2019.
- [108] C. Katrakazas, M. Quddus, and W.-H. Chen, "A new integrated collision risk assessment methodology for autonomous vehicles," *Accident Analysis & Prevention*, vol. 127, pp. 61-79, 2019/06/01/ 2019.
- [109] M. Jian and J. Shi, "Analysis of impact of elderly drivers on traffic safety using ANN based car-following model," *Safety science*, vol. 122, p. 104536, 2020.
- [110] Y. Ye, X. Zhang, and J. Sun, "Automated vehicle's behavior decision making using deep reinforcement learning and high-fidelity simulation environment," *Transportation Research Part C: Emerging Technologies*, vol. 107, pp. 155-170, 2019.
- [111] X. Chen, L. Zhou, and L. Li, "Bayesian network for red-light-running prediction at signalized intersections," *Journal of Intelligent Transportation Systems*, vol. 23, pp. 120-132, 2019.
- [112] Ó. Mata-Carballeira, J. Gutiérrez-Zaballa, I. del Campo, and V. Martínez, "An FPGA-Based Neuro-Fuzzy Sensor for Personalized Driving Assistance," *Sensors*, vol. 19, p. 4011, 2019.
- [113] X. Zhang, J. Sun, X. Qi, and J. Sun, "Simultaneous modeling of car-following and lane-changing behaviors using deep learning," *Transportation research part C: emerging technologies*, vol. 104, pp. 287-304, 2019.

- [114] K. Yeon, K. Min, J. Shin, M. Sunwoo, and M. Han, "Ego-Vehicle Speed Prediction Using a Long Short-Term Memory Based Recurrent Neural Network," *International Journal of Automotive Technology*, vol. 20, pp. 713-722, 2019.
- [115] E. Tivesten and M. Dozza, "Driving context influences drivers' decision to engage in visual–manual phone tasks: Evidence from a naturalistic driving study," *Journal of Safety Research*, vol. 53, pp. 87-96, 2015/06/01/ 2015.
- [116] B. Metz, A. Landau, and V. Hargutt, "Frequency and impact of hands-free telephoning while driving – Results from naturalistic driving data," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 29, pp. 1-13, 2015/02/01/ 2015.
- [117] A. Sonnleitner, M. S. Treder, M. Simon, S. Willmann, A. Ewald, A. Buchner, *et al.*, "EEG alpha spindles and prolonged brake reaction times during auditory distraction in an on-road driving study," *Accident Analysis & Prevention*, vol. 62, pp. 110-118, 2014.
- [118] T. W. Lochrane, H. Al-Deek, D. J. Dailey, and C. Krause, "Modeling driver behavior in work and nonwork zones: multidimensional psychophysical carfollowing framework," *Transportation Research Record: Journal of the Transportation Research Board*, pp. 116-126, 2015.
- [119] Z. Cao, D. Yang, K. Jiang, S. Xu, S. Wang, M. Zhu, et al., "A geometry-driven car-following distance estimation algorithm robust to road slopes," *Transportation Research Part C: Emerging Technologies*, vol. 102, pp. 274-288, 2019/05/01/ 2019.
- [120] A. K. Budhkar and A. K. Maurya, "Characteristics of lateral vehicular interactions in heterogeneous traffic with weak lane discipline," *Journal of Modern Transportation*, vol. 25, pp. 74-89, 2017.
- [121] R. Fu, Z. Li, Q. Sun, and C. Wang, "Human-like car-following model for autonomous vehicles considering the cut-in behavior of other vehicles in mixed traffic," *Accident Analysis & Prevention*, vol. 132, p. 105260, 2019.
- [122] M. Zhu, X. Wang, and J. Hu, "Impact on car following behavior of a forward collision warning system with headway monitoring," *Transportation Research Part C: Emerging Technologies*, vol. 111, pp. 226-244, 2020.
- [123] A. Kesting and M. Treiber, "Calibrating car-following models by using trajectory data: Methodological study," *Transportation Research Record*, vol. 2088, pp. 148-156, 2008.
- [124] N. Arbabzadeh, M. Jafari, M. Jalayer, S. Jiang, and M. Kharbeche, "A hybrid approach for identifying factors affecting driver reaction time using naturalistic driving data," *Transportation Research Part C: Emerging Technologies*, vol. 100, pp. 107-124, 2019/03/01/ 2019.
- [125] H. Aoki and O. Ozaki, "A Study on the Method for Predicting the Driver's Car-Following Tendency," *IFAC Proceedings Volumes*, vol. 46, pp. 319-321, 2013.
- [126] J. Li, K. Perrine, L. Wu, and C. M. Walton, "Cross-validating traffic speed measurements from probe and stationary sensors through state reconstruction," *International journal of transportation science and technology*, vol. 8, pp. 290-303, 2019.
- [127] S. Yousif and J. Al-Obaedi, "Close following behavior: Testing visual angle car following models using various sets of data," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 14, pp. 96-110, 2011/03/01/ 2011.
- [128] P. Wawage and Y. Deshpande, "Smartphone Sensor Dataset for Driver Behavior Analysis," *Data in Brief*, vol. 41, p. 107992, 2022.

- [129] G. N. Bifulco, L. Pariota, F. Simonelli, and R. Di Pace, "Development and testing of a fully adaptive cruise control system," *Transportation Research Part C: Emerging Technologies*, vol. 29, pp. 156-170, 2013.
- [130] X. Ros-Roca, L. Montero, and J. Barceló, "Notes on Using Simulation-Optimization Techniques in Traffic Simulation," *Transportation Research Procedia*, vol. 27, pp. 881-888, 2017/01/01/ 2017.
- [131] L. Lu, Y. Lin, Y. Wen, J. Zhu, and S. Xiong, "Federated clustering for recognizing driving styles from private trajectories," *Engineering Applications* of Artificial Intelligence, vol. 118, p. 105714, 2023.
- [132] T. Bellet, P. Mayenobe, J.-C. Bornard, D. Gruyer, and B. Claverie, "A computational model of the car driver interfaced with a simulation platform for future Virtual Human Centred Design applications: COSMO-SIVIC," *Engineering Applications of Artificial Intelligence*, vol. 25, pp. 1488-1504, 2012/10/01/ 2012.
- [133] E. Rendon-Velez, P. M. van Leeuwen, R. Happee, I. Horváth, W. F. van der Vegte, and J. C. F. de Winter, "The effects of time pressure on driver performance and physiological activity: A driving simulator study," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 41, pp. 150-169, 2016/08/01/ 2016.
- [134] J. Wang, J. Wu, X. Zheng, D. Ni, and K. Li, "Driving safety field theory modeling and its application in pre-collision warning system," *Transportation Research Part C: Emerging Technologies*, vol. 72, pp. 306-324, 2016/11/01/ 2016.
- [135] C. W. Hsu, T. H. Hsu, and K. J. Chang, "Implementation of car-following system using LiDAR detection," in *ITS Telecommunications (ITST)*, 2012 12th International Conference on, 2012, pp. 165-169.
- [136] M. R. Ghahroudi and R. Sabzevari, "Multisensor data fusion strategies for advanced driver assistance systems," in *Sensor and Data Fusion*, ed: IntechOpen, 2009.
- [137] G. Singh, D. Bansal, and S. Sofat, "A smartphone based technique to monitor driving behavior using DTW and crowdsensing," *Pervasive and Mobile Computing*, vol. 40, pp. 56-70, Sep 2017.
- [138] P. Fernandes, R. Tomás, F. Acuto, A. Pascale, B. Bahmankhah, C. Guarnaccia, et al., "Impacts of roundabouts in suburban areas on congestion-specific vehicle speed profiles, pollutant and noise emissions: An empirical analysis," *Sustainable Cities and Society*, vol. 62, p. 102386, 2020.
- [139] X. Wang, Q. Zhou, M. Quddus, and T. Fan, "Speed, speed variation and crash relationships for urban arterials," *Accident Analysis & Prevention*, vol. 113, pp. 236-243, 2018.
- [140] X. Ma and I. Andréasson, "Behavior measurement, analysis, and regime classification in car following," *IEEE transactions on intelligent transportation systems*, vol. 8, pp. 144-156, 2007.
- [141] S. Das and A. K. Maurya, "Time Headway Analysis for Four-Lane and Two-Lane Roads," *Transportation in Developing Economies*, vol. 3, p. 9, 2017/04/04 2017.
- [142] M. S. Horswill, A. Hill, and L. Silapurem, "The development and validation of video-based measures of drivers' following distance and gap acceptance behaviours," *Accident Analysis & Prevention*, vol. 146, p. 105626, 2020.

- [143] P. G. Michael, F. C. Leeming, and W. O. Dwyer, "Headway on urban streets: observational data and an intervention to decrease tailgating," *Transportation research part F: traffic psychology and behaviour*, vol. 3, pp. 55-64, 2000.
- [144] J. Shen and G. Yang, "Crash Risk Assessment for Heterogeneity Traffic and Different Vehicle-Following Patterns Using Microscopic Traffic Flow Data," *Sustainability*, vol. 12, p. 9888, 2020.
- [145] M. Brackstone, M. McDonald, and B. Sultan, "Dynamic behavioral data collection using an instrumented vehicle," *Transportation Research Record*, vol. 1689, pp. 9-16, 1999.
- [146] S. Ossen and S. P. Hoogendoorn, "Heterogeneity in car-following behavior: Theory and empirics," *Transportation research part C: emerging technologies*, vol. 19, pp. 182-195, 2011.
- [147] J. Wang, K. Li, and X.-Y. Lu, "Chapter 6 Comparative Analysis and Modeling of Driver Behavior Characteristics," in *Advances in Intelligent Vehicles*, Y. Chen and L. Li, Eds., ed Boston: Academic Press, 2014, pp. 159-198.
- [148] E. G. Mantouka, E. N. Barmpounakis, and E. I. Vlahogianni, "Identifying driving safety profiles from smartphone data using unsupervised learning," *Safety Science*, vol. 119, pp. 84-90, 2019/11/01/ 2019.
- [149] B. Sultan, "The study of motorway operation using a microscopic simulation model," Thesis (Ph.D), University of Southampton, 2000.
- [150] M. Benmimoun, F. Fahrenkrog, A. Zlocki, and L. Eckstein, "Incident detection based on vehicle CAN-data within the large scale field operational test "euroFOT"," in 22nd Enhanced Safety of Vehicles Conference (ESV 2011), Washington, DC/USA, 2011.
- [151] R. Elvik, "Why some road safety problems are more difficult to solve than others," *Accident Analysis & Prevention*, vol. 42, pp. 1089-1096, 2010.
- [152] E. L. Harbeck and A. I. Glendon, "How reinforcement sensitivity and perceived risk influence young drivers' reported engagement in risky driving behaviors," *Accident Analysis & Prevention*, vol. 54, pp. 73-80, 2013.
- [153] E. Amini, M. Tabibi, E. R. Khansari, and M. Abhari, "A vehicle type-based approach to model car following behaviors in simulation programs (case study: Car-motorcycle following behavior)," *IATSS research*, vol. 43, pp. 14-20, 2019.
- [154] A. Duret, C. Buisson, and N. Chiabaut, "Estimating individual speed-spacing relationship and assessing ability of Newell's car-following model to reproduce trajectories," *Transportation research record*, vol. 2088, pp. 188-197, 2008.
- [155] E. R. Khansari, M. Tabibi, and F. Moghadas Nejad, "Lane-based car-following behaviour based on inductive loops," in *Proceedings of the Institution of Civil Engineers-Transport*, 2017, pp. 38-45.
- [156] M. M. Minderhoud and P. H. L. Bovy, "Extended time-to-collision measures for road traffic safety assessment," *Accident Analysis & Prevention*, vol. 33, pp. 89-97, 2001/01/01/ 2001.
- [157] W. Janssen and L. Nilsson, *An experimental evaluation of in-vehicle collision avoidance systems*: Statens Väg-och Trafikinstitut., VTI särtryck 181, 1992.
- [158] J. R. Sayer, M. L. Mefford, and R. W. Huang, "The effects of lead-vehicle size on driver following behavior: Is ignorance truly bliss?," 2003 DRIVING ASSESSMENT CONFERENCE, 24-7-2003.
- [159] J. R. Sayer, M. L. Mefford, and R. W. Huang, "The effects of lead-vehicle size on driver following behavior: Is ignorance truly bliss?," 2003.

- [160] C. R. Bennett, "A speed prediction model for rural two-lane highways," 1994.
- [161] M. Parker, "THE EFFECT OF HEAVY GOODS VEHICLES AND FOLLOWING BEHAVIOUR ON CAPACITY AT MOTORWAY ROADWORK SITES," *Traffic engineering & control*, 1996.
- [162] A. Joshi, S. Kale, S. Chandel, and D. K. Pal, "Likert scale: Explored and explained," *British journal of applied science & technology*, vol. 7, p. 396, 2015.
- [163] J. Yan, Z. Zhang, K. Lin, F. Yang, and X. Luo, "A hybrid scheme-based onevs-all decision trees for multi-class classification tasks," *Knowledge-Based Systems*, vol. 198, p. 105922, 2020.
- [164] Z. Gao, S.-C. Fang, X. Gao, J. Luo, and N. Medhin, "A novel kernel-free least squares twin support vector machine for fast and accurate multi-class classification," *Knowledge-Based Systems*, vol. 226, p. 107123, 2021.
- [165] M. Simoncini, L. Taccari, F. Sambo, L. Bravi, S. Salti, and A. Lori, "Vehicle classification from low-frequency GPS data with recurrent neural networks," *Transportation Research Part C: Emerging Technologies*, vol. 91, pp. 176-191, 2018.
- [166] X.-H. Zhou, C. Zhou, D. Lui, and X. Ding, *Applied missing data analysis in the health sciences*: John Wiley & Sons, 2014.
- [167] A. Alamoodi, B. Zaidan, A. Zaidan, O. Albahri, J. Chen, M. Chyad, et al., "Machine learning-based imputation soft computing approach for large missing scale and non-reference data imputation," *Chaos, Solitons & Fractals*, vol. 151, p. 111236, 2021.
- [168] A. Farhangfar, L. A. Kurgan, and W. Pedrycz, "A novel framework for imputation of missing values in databases," *IEEE Transactions on Systems, Man, and Cybernetics-Part A: Systems and Humans,* vol. 37, pp. 692-709, 2007.
- [169] W.-C. Lin and C.-F. Tsai, "Missing value imputation: a review and analysis of the literature (2006–2017)," *Artificial Intelligence Review*, vol. 53, pp. 1487-1509, 2020.
- [170] I. A. Gheyas and L. S. Smith, "A neural network-based framework for the reconstruction of incomplete data sets," *Neurocomputing*, vol. 73, pp. 3039-3065, 2010.
- [171] A. Jadhav, D. Pramod, and K. Ramanathan, "Comparison of performance of data imputation methods for numeric dataset," *Applied Artificial Intelligence*, vol. 33, pp. 913-933, 2019.
- [172] L. Gruenwald, H. Chok, and M. Aboukhamis, "Using data mining to estimate missing sensor data," in *Seventh IEEE international conference on data mining workshops (ICDMW 2007)*, 2007, pp. 207-212.
- [173] S. P. Venthuruthiyil and M. Chunchu, "Vehicle path reconstruction using Recursively Ensembled Low-pass filter (RELP) and adaptive tri-cubic kernel smoother," *Transportation Research Part C: Emerging Technologies*, vol. 120, p. 102847, 2020.
- [174] A. E. B. El Masri, H. Artail, and H. Akkary, "Toward self-policing: Detecting drunk driving behaviors through sampling CAN bus data," in 2017 *international conference on electrical and computing technologies and applications (ICECTA)*, 2017, pp. 1-5.
- [175] T. Chen, Y. D. Wong, X. Shi, and Y. Yang, "A data-driven feature learning approach based on Copula-Bayesian Network and its application in

comparative investigation on risky lane-changing and car-following maneuvers," *Accident Analysis & Prevention*, vol. 154, p. 106061, 2021.

- [176] J. Liu, K. Han, X. M. Chen, and G. P. Ong, "Spatial-temporal inference of urban traffic emissions based on taxi trajectories and multi-source urban data," *Transportation Research Part C: Emerging Technologies*, vol. 106, pp. 145-165, 2019.
- [177] N. Virojboonkiate, P. Vateekul, and K. Rojviboonchai, "Driver identification using histogram and neural network from acceleration data," in 2017 IEEE 17th International Conference on Communication Technology (ICCT), 2017, pp. 1560-1564.
- [178] X. Liu, Y. Lan, Y. Zhou, C. Shen, and X. Guan, "A real-time explainable traffic collision inference framework based on probabilistic graph theory," *Knowledge-Based Systems*, vol. 212, p. 106442, 2021.
- [179] G. Qi, A. A. Ceder, Z. Zhang, W. Guan, and D. Liu, "New method for predicting long-term travel time of commercial vehicles to improve policymaking processes," *Transportation Research Part A: Policy and Practice*, vol. 145, pp. 132-152, 2021.
- [180] X. Feng and J. Hu, "Research on the identification and management of vehicle behaviour based on Internet of things technology," *Computer Communications*, vol. 156, pp. 68-76, 2020.
- [181] C. Gámez Serna and Y. Ruichek, "Dynamic speed adaptation for path tracking based on curvature information and speed limits," *Sensors*, vol. 17, p. 1383, 2017.
- [182] E. M. Hernández-Pereira, D. Álvarez-Estévez, and V. Moret-Bonillo, "Automatic classification of respiratory patterns involving missing data imputation techniques," *Biosystems Engineering*, vol. 138, pp. 65-76, 2015.
- [183] R. Razavi-Far, B. Cheng, M. Saif, and M. Ahmadi, "Similarity-learning information-fusion schemes for missing data imputation," *Knowledge-Based Systems*, vol. 187, p. 104805, 2020.
- [184] M. H. Mohamed, A. H. Abdel-rahiem, and M. M. Abdelsamea, "Scalable algorithms for missing value imputation," *International Journal of Computer Applications*, vol. 87, 2014.
- [185] L. Xingguang, C. Dianren, and C. Lei, "A high-speed data acquisition system based on FPGA," in 2009 International Conference on Test and Measurement, 2009, pp. 290-293.
- [186] W. Fei, W. Zhijie, C. Hong, and X. Yi, "High-speed data acquisition system based on FPGA/SoPC," in *IEEE 2011 10th International Conference on Electronic Measurement & Instruments*, 2011, pp. 24-27.
- [187] Y. Fan, "FPGA-based data acquisition system," in 2011 IEEE International Conference on Signal Processing, Communications and Computing (ICSPCC), 2011, pp. 1-3.
- [188] M. Ron, P. Burget, and V. Hlaváč, "Parameter continuity in time-varying Gauss–Markov models for learning from small training data sets," *Information Sciences*, vol. 595, pp. 197-216, 2022.
- [189] P. Li, Z. Liu, B. Anduv, X. Zhu, X. Jin, and Z. Du, "Diagnosis for multiple faults of chiller using ELM-KNN model enhanced by multi-label learning and specific feature combinations," *Building and Environment*, vol. 214, p. 108904, 2022.
- [190] A. U. Osarogiagbon, F. Khan, R. Venkatesan, and P. Gillard, "Review and analysis of supervised machine learning algorithms for hazardous events in

drilling operations," *Process Safety and Environmental Protection*, vol. 147, pp. 367-384, 2021.

- [191] C. Rao and V. N. Gudivada, *Computational analysis and understanding of natural languages: principles, methods and applications:* Elsevier, 2018.
- [192] S. Misra, H. Li, and J. He, "Noninvasive fracture characterization based on the classification of sonic wave travel times," *Machine Learning for Subsurface Characterization*, pp. 243-287, 2020.
- [193] J. Ferreira, E. Carvalho, B. V. Ferreira, C. de Souza, Y. Suhara, A. Pentland, *et al.*, "Driver behavior profiling: An investigation with different smartphone sensors and machine learning," *PLoS one*, vol. 12, p. e0174959, 2017.
- [194] Y. Zhang, P. Ni, M. Li, H. Liu, and B. Yin, "A new car-following model considering driving characteristics and preceding vehicle's acceleration," *Journal of advanced transportation*, vol. 2017, 2017.
- [195] Y. Xie, Q. Ni, O. Alfarraj, H. Gao, G. Shen, X. Kong, et al., "DeepCF: A Deep Feature Learning-Based Car-Following Model Using Online Ride-Hailing Trajectory Data," Wireless Communications and Mobile Computing, vol. 2020, 2020.
- [196] U. Garciarena and R. Santana, "An extensive analysis of the interaction between missing data types, imputation methods, and supervised classifiers," *Expert Systems with Applications*, vol. 89, pp. 52-65, 2017.
- [197] K. Kanxheri, M. Barbanera, G. Ambrosi, G. Silvestre, S. Biondi, R. Ridolfi, et al., "The Microstrip Silicon Detector (MSD) data acquisition system architecture for the FOOT experiment," *Journal of Instrumentation*, vol. 17, p. C03035, 2022.
- [198] J. Mbihi, U. S. OTAM, B. L. Moffo, and C. E. G. NGOUNOU, "A novel FPGA-Based Multi-Channel Signal Acquisition System Using Parallel Duty-Cycle Modulation and Application to Biologic Signals: Design and Simulation," *Journal of Electrical Engineering, Electronics, Control and Computer Science*, vol. 7, pp. 13-20, 2020.
- [199] A. Sivakumar, K. A. Jain, and A. I. Maalouf, "Voice Controlled Servo Motor Using an Android Application," in 2020 IEEE 6th World Forum on Internet of Things (WF-IoT), 2020, pp. 1-2.
- [200] E. Rzaev, A. Khanaev, and A. Amerikanov, "Neural Network for Real-Time Object Detection on FPGA," in 2021 International Conference on Industrial Engineering, Applications and Manufacturing (ICIEAM), 2021, pp. 719-723.
- [201] V. Kudryavtsev, L. Shekhtman, V. Kaminskiy, I. Nikolaev, N. Muchnoi, S. Nikitin, *et al.*, "The GEM-based detector for tracking the Compton-scattered photons in the Laser Polarimeter facility at VEPP4-M collider," in *Instrumentation for Colliding Beam Physics: INSTR-20*, 2020, pp. 63-64.
- [202] M. Akiyama and T. Saito, "Influence of Radio Waves Generated by XBee Module on GPS Positioning Performance," in 2020 IEEE International Conference on Consumer Electronics-Taiwan (ICCE-Taiwan), 2020, pp. 1-2.
- [203] R. P. Ramadhan, A. R. Ramadhan, S. A. Putri, and M. I. C. Latukolan, "Prototype of CanSat with Auto-gyro Payload for Small Satellite Education," in 2019 IEEE 13th International Conference on Telecommunication Systems, Services, and Applications (TSSA), 2019, pp. 243-248.
- [204] T. S. Tai, H. Zuo, and S. He, "3D LIDAR based on FPCB mirror," *Mechatronics*, vol. 82, p. 102720, 2022.

- [205] W. Wu and F. Huang, "Long Range Wireless Alarm System Based on LoRa and TOF LiDAR," in 2021 International Symposium on Computer Technology and Information Science (ISCTIS), 2021, pp. 55-58.
- [206] T. Xie, J. Zhu, C. Jiang, Y. Jiang, W. Guo, C. Wang, *et al.*, "Situation and prospect of light and miniature UAV-borne LiDAR," in *XIV International Conference on Pulsed Lasers and Laser Applications*, 2019, pp. 205-216.
- [207] V. Matus, C. A. Azurdia-Meza, S. Céspedes, P. Ortega, S. Montejo-Sánchez, J. Rojas, et al., "Implementation of a low-cost vehicular VLC system and CAN bus interface," in 2018 11th International Symposium on Communication Systems, Networks & Digital Signal Processing (CSNDSP), 2018, pp. 1-5.
- [208] M. Farrugia, J. P. Azzopardi, E. Xuereb, C. Caruana, and M. Farrugia, "The usefulness of diesel vehicle onboard diagnostics (OBD) information," in 2016 17th International Conference on Mechatronics-Mechatronika (ME), 2016, pp. 1-5.
- [209] G. Bekaroo and A. Santokhee, "Power consumption of the Raspberry Pi: A comparative analysis," in 2016 IEEE International Conference on Emerging Technologies and Innovative Business Practices for the Transformation of Societies (EmergiTech), 2016, pp. 361-366.
- [210] S. A. Khajehoddin, M. Karimi-Ghartemani, P. K. Jain, and A. Bakhshai, "A resonant controller with high structural robustness for fixed-point digital implementations," *IEEE Transactions on Power Electronics*, vol. 27, pp. 3352-3362, 2011.
- [211] Google. (August 25, 2020). *Google Map*. Available: https://www.google.com/maps/dir/Sungai+Besi+Toll+Plaza+Southbound,+Pl aza+Tol+Sungai+Besi,+Kuala+Lumpur-Seremban+Expressway,+Taman+Serdang+Perdana,+Seri+Kembangan,+Sela ngor/Nilai+Toll+Plaza,+Lebuhraya+Utara-Selatan,+Nilai,+Negeri+Sembilan/@2.9389806,101.6818617,12z/data=!3m1!
  - <u>4b1!4m13!4m12!1m5!1m1!1s0x31cc4bf348a1454f:0xdbfbceefc7b8c50c!2m</u> 2!1d101.7061224!2d3.0390443!1m5!1m1!1s0x31cdc681d96e0589:0xc04719 7baf61a476!2m2!1d101.7975624!2d2.8335786
- [213] B. Djordjević, A. S. Mane, and E. Krmac, "Analysis of dependency and importance of key indicators for railway sustainability monitoring: A new integrated approach with DEA and Pearson correlation," *Research in Transportation Business & Management*, vol. 41, p. 100650, 2021.
- [214] X. Qu, Y. Yang, Z. Liu, S. Jin, and J. Weng, "Potential crash risks of expressway on-ramps and off-ramps: A case study in Beijing, China," *Safety Science*, vol. 70, pp. 58-62, 2014/12/01/ 2014.
- [215] R. Hamzeie, P. T. Savolainen, and T. J. Gates, "Driver speed selection and crash risk: Insights from the naturalistic driving study," *Journal of safety research*, vol. 63, pp. 187-194, 2017.
- [216] B. Donmez, L. N. Boyle, and J. D. Lee, "The impact of distraction mitigation strategies on driving performance," *Human factors*, vol. 48, pp. 785-804, 2006.

- [217] X. Xu, X. Wang, X. Wu, O. Hassanin, and C. Chai, "Calibration and evaluation of the Responsibility-Sensitive Safety model of autonomous car-following maneuvers using naturalistic driving study data," *Transportation research part C: emerging technologies*, vol. 123, p. 102988, 2021.
- [218] K. Vogel, "A comparison of headway and time to collision as safety indicators," Accident Analysis & Prevention, vol. 35, pp. 427-433, 2003/05/01/ 2003.
- [219] J. C. Hayward, "Near miss determination through use of a scale of danger," 1972.
- [220] M. Zhu, Y. Wang, Z. Pu, J. Hu, X. Wang, and R. Ke, "Safe, efficient, and comfortable velocity control based on reinforcement learning for autonomous driving," *Transportation Research Part C: Emerging Technologies*, vol. 117, p. 102662, 2020.
- [221] Q. Meng and X. Qu, "Estimation of rear-end vehicle crash frequencies in urban road tunnels," *Accident Analysis & Prevention*, vol. 48, pp. 254-263, 2012.
- [222] A. H. Jamson, N. Merat, O. M. Carsten, and F. C. Lai, "Behavioural changes in drivers experiencing highly-automated vehicle control in varying traffic conditions," *Transportation research part C: emerging technologies*, vol. 30, pp. 116-125, 2013.
- [223] J. Wang, K. Li, and X.-Y. Lu, "Comparative Analysis and Modeling of Driver Behavior Characteristics," in *Advances in Intelligent Vehicles*, ed: Elsevier, 2014, pp. 159-198.
- [224] E. Abolfazli, B. Besselink, and T. Charalambous, "Reducing time headway in platoons under the MPF topology in the presence of communication delays," *IFAC-PapersOnLine*, vol. 53, pp. 15267-15274, 2020/01/01/ 2020.
- [225] F. W. Siebert, M. Oehl, and H.-R. Pfister, "The influence of time headway on subjective driver states in adaptive cruise control," *Transportation research part F: traffic psychology and behaviour*, vol. 25, pp. 65-73, 2014.
- [226] G. F. B. Piccinini, C. M. Rodrigues, M. Leitão, and A. Simões, "Driver's behavioral adaptation to Adaptive Cruise Control (ACC): The case of speed and time headway," *Journal of safety research*, vol. 49, pp. 77. e1-84, 2014.
- [227] B. Derrick, D. Toher, and P. White, "Why Welch's test is Type I error robust," *The Quantitative Methods in Psychology*, vol. 12, 2016.
- [228] A. Adavikottu, N. R. Velaga, and S. Mishra, "Modelling the effect of aggressive driver behavior on longitudinal performance measures during carfollowing," *Transportation research part F: traffic psychology and behaviour*, vol. 92, pp. 176-200, 2023.
- [229] I. Niño-Adan, I. Landa-Torres, E. Portillo, and D. Manjarres, "Influence of statistical feature normalisation methods on K-Nearest Neighbours and K-Means in the context of industry 4.0," *Engineering Applications of Artificial Intelligence*, vol. 111, p. 104807, 2022.
- [230] A. Likas, N. Vlassis, and J. J. Verbeek, "The global k-means clustering algorithm," *Pattern recognition*, vol. 36, pp. 451-461, 2003.
- [231] D. L. Davies and D. W. Bouldin, "A cluster separation measure," *IEEE transactions on pattern analysis and machine intelligence*, pp. 224-227, 1979.
- [232] G. Wang, Z. Wang, W. Chen, and J. Zhuang, "Classification of surface EMG signals using optimal wavelet packet method based on Davies-Bouldin criterion," *Medical and Biological Engineering and Computing*, vol. 44, pp. 865-872, 2006.

- [233] T. Pholprasit, W. Choochaiwattana, and C. Saiprasert, "A comparison of driving behaviour prediction algorithm using multi-sensory data on a smartphone," in 2015 IEEE/ACIS 16th International Conference on Software Engineering, Artificial Intelligence, Networking and Parallel/Distributed Computing (SNPD), 2015, pp. 1-6.
- [234] T. Ersal, H. J. Fuller, O. Tsimhoni, J. L. Stein, and H. K. Fathy, "Model-based analysis and classification of driver distraction under secondary tasks," *IEEE transactions on intelligent transportation systems*, vol. 11, pp. 692-701, 2010.
- [235] M. Belgiu and L. Drăguţ, "Random forest in remote sensing: A review of applications and future directions," *ISPRS journal of photogrammetry and remote sensing*, vol. 114, pp. 24-31, 2016.
- [236] C. Yan, F. Coenen, and B. Zhang, "Driving posture recognition by joint application of motion history image and pyramid histogram of oriented gradients," *International journal of vehicular technology*, vol. 2014, 2014.
- [237] A. El Maghraoui, Y. Ledmaoui, O. Laayati, H. El Hadraoui, and A. Chebak, "Smart Energy Management: A Comparative Study of Energy Consumption Forecasting Algorithms for an Experimental Open-Pit Mine," *Energies*, vol. 15, p. 4569, 2022.
- [238] V. Kotu and B. Deshpande, *Data science: concepts and practice*: Morgan Kaufmann, 2018.
- [239] M. Hofmann and R. Klinkenberg, *RapidMiner: Data mining use cases and business analytics applications:* CRC Press, 2016.
- [240] F. Pedregosa, G. Varoquaux, A. Gramfort, V. Michel, B. Thirion, O. Grisel, et al., "Scikit-learn: Machine learning in Python," the Journal of machine Learning research, vol. 12, pp. 2825-2830, 2011.
- [241] Q. Ren, D. Zhang, X. Zhao, L. Yan, and J. Rui, "A novel hybrid method of lithology identification based on k-means++ algorithm and fuzzy decision tree," *Journal of Petroleum Science and Engineering*, vol. 208, p. 109681, 2022.
- [242] G. James, D. Witten, T. Hastie, and R. Tibshirani, *An introduction to statistical learning* vol. 112: Springer, 2013.
- [243] J. Yao and Y. Ye, "The effect of image recognition traffic prediction method under deep learning and naive Bayes algorithm on freeway traffic safety," *Image and Vision Computing*, vol. 103, p. 103971, 2020.
- [244] S. Chen, G. I. Webb, L. Liu, and X. Ma, "A novel selective naïve Bayes algorithm," *Knowledge-Based Systems*, vol. 192, p. 105361, 2020.
- [245] H. S. AL-Rubaiee, K. Alomar, R. Qiu, and D. Li, "Tuning of Customer Relationship Management (CRM) via Customer Experience Management (CEM) using sentiment analysis on aspects level," 2018.
- [246] E. Alpaydin, *Machine learning: the new AI*: MIT press, 2016.
- [247] T. Hastie, R. Tibshirani, J. H. Friedman, and J. H. Friedman, *The elements of statistical learning: data mining, inference, and prediction* vol. 2: Springer, 2009.
- [248] C. M. Bishop and N. M. Nasrabadi, *Pattern recognition and machine learning* vol. 4: Springer, 2006.
- [249] M. Sokolova and G. Lapalme, "A systematic analysis of performance measures for classification tasks," *Information processing & management*, vol. 45, pp. 427-437, 2009.
- [250] C. C. Robusto, "The cosine-haversine formula," *The American Mathematical Monthly*, vol. 64, pp. 38-40, 1957.

- [251] H. A. Ameen, A. K. Mahamad, S. Saon, R. Q. Malik, Z. H. Kareem, M. A. Bin Ahmadon, *et al.*, "Identification of Driving Safety Profiles in Vehicle to Vehicle Communication System Based on Vehicle OBD Information," *Information*, vol. 12, p. 194, 2021.
- [252] S. Bao, L. Wu, B. Yu, and J. R. Sayer, "An examination of teen drivers' carfollowing behavior under naturalistic driving conditions: With and without an advanced driving assistance system," *Accident Analysis & Prevention*, vol. 147, p. 105762, 2020.
- [253] M. G. Jasinski and F. Baldo, "A method to identify aggressive driver behaviour based on enriched gps data analysis," in *The ninth international conference on advanced geographic information systems, applications, and services*, 2017, pp. 97-102.
- [254] N. Lin, C. Zong, M. Tomizuka, P. Song, Z. Zhang, and G. Li, "An overview on study of identification of driver behavior characteristics for automotive control," *Mathematical Problems in Engineering*, vol. 2014, 2014.
- [255] O. Bagdadi and A. Várhelyi, "Jerky driving—an indicator of accident proneness?," *Accident Analysis & Prevention*, vol. 43, pp. 1359-1363, 2011.
- [256] S. Das, A. Budhkar, A. K. Maurya, and A. Maji, "Multivariate Analysis on Dynamic Car-Following Data of Non-lane-Based Traffic Environments," *Transportation in Developing Economies*, vol. 5, pp. 1-13, 2019.
- [257] M. Z. Jan, J. C. Munoz, and M. A. Ali, "A novel method for creating an optimized ensemble classifier by introducing cluster size reduction and diversity," *IEEE Transactions on Knowledge and Data Engineering*, 2020.
- [258] L. Shannon, V. Cojocaru, C. N. Dao, and P. H. Leong, "Technology scaling in FPGAs: Trends in applications and architectures," in 2015 IEEE 23rd Annual International Symposium on Field-Programmable Custom Computing Machines, 2015, pp. 1-8.
- [259] G. M. Björklund, "Driver irritation and aggressive behaviour," Accident Analysis & Prevention, vol. 40, pp. 1069-1077, 2008.
- [260] T. Ayres, L. Li, D. Schleuning, and D. Young, "Preferred time-headway of highway drivers," in *ITSC 2001. 2001 IEEE Intelligent Transportation Systems. Proceedings (Cat. No. 01TH8585)*, 2001, pp. 826-829.
- [261] H. Ohta, "Individual differences in driving distance headway," Vision in vehicles, vol. 4, pp. 91-100, 1993.
- [262] G. J. Wilde, S. P. Claxton-Oldfield, and P. H. Platenius, "Risk homeostasis in an experimental context," in *Human behavior and traffic safety*, ed: Springer, 1985, pp. 119-149.
- [263] D. Connell and M. Joint, "Driver aggression in aggressive driving: three studies," AAA Foundation for Traffic Safety, Washington DC, pp. 25-34, 1996.
- [264] R. Stephens and M. Smith, "Effect of speed on flow and enjoyment for driving and rollercoasters," *Transportation research part F: traffic psychology and behaviour*, vol. 85, pp. 276-286, 2022.
- [265] B. Fildes, G. Rumbold, and A. Leening, "Speed behaviour and drivers' attitude to speeding," *Monash University Accident Research Centre, Report*, vol. 16, p. 186, 1991.
- [266] S.-H. Hong, S.-Y. Min, B. Kim, Y.-K. Min, J.-K. Kang, and B.-C. Min, "Difference of driving performance according to turn types at the intersection and age," in 2009 International Conference on Mechatronics and Automation, 2009, pp. 16-19.

- [267] E. C. Andrews and S. J. Westerman, "Age differences in simulated driving performance: Compensatory processes," *Accident Analysis & Prevention*, vol. 45, pp. 660-668, 2012.
- [268] J. Montgomery, K. D. Kusano, and H. C. Gabler, "Age and gender differences in time to collision at braking from the 100-car naturalistic driving study," *Traffic injury prevention*, vol. 15, pp. S15-S20, 2014.
- [269] D. L. Massie, P. E. Green, and K. L. Campbell, "Crash involvement rates by driver gender and the role of average annual mileage," *Accident Analysis & Prevention*, vol. 29, pp. 675-685, 1997.
- [270] J. L. Charlton, J. Oxley, B. Fildes, P. Oxley, S. Newstead, S. Koppel, et al., "Characteristics of older drivers who adopt self-regulatory driving behaviours," *Transportation Research Part F: Traffic Psychology and Behaviour*, vol. 9, pp. 363-373, 2006.
- [271] X. Li, O. Oviedo-Trespalacios, A. Rakotonirainy, and X. Yan, "Collision risk management of cognitively distracted drivers in a car-following situation," *Transportation research part F: traffic psychology and behaviour*, vol. 60, pp. 288-298, 2019.
- [272] C. Horvath, I. Lewis, and B. Watson, "The beliefs which motivate young male and female drivers to speed: A comparison of low and high intenders," *Accident Analysis & Prevention*, vol. 45, pp. 334-341, 2012.
- [273] X. Yan, E. Radwan, and D. Guo, "Effects of major-road vehicle speed and driver age and gender on left-turn gap acceptance," *Accident Analysis & Prevention*, vol. 39, pp. 843-852, 2007.
- [274] D. M. DeJoy, "An examination of gender differences in traffic accident risk perception," *Accident Analysis & Prevention*, vol. 24, pp. 237-246, 1992.
- [275] F. Feng, S. Bao, J. R. Sayer, C. Flannagan, M. Manser, and R. Wunderlich, "Can vehicle longitudinal jerk be used to identify aggressive drivers? An examination using naturalistic driving data," *Accident Analysis and Prevention*, vol. 104, pp. 125-136, Jul 2017.
- [276] N. L. Wayne and G. A. Miller, "Impact of gender, organized athletics, and video gaming on driving skills in novice drivers," *PloS one*, vol. 13, p. e0190885, 2018.
- [277] Y. Lian, G. Zhang, J. Lee, and H. Huang, "Review on big data applications in safety research of intelligent transportation systems and connected/automated vehicles," *Accident Analysis & Prevention*, vol. 146, p. 105711, 2020.
- [278] C. Velasco-Gallego and I. Lazakis, "Real-time data-driven missing data imputation for short-term sensor data of marine systems. A comparative study," *Ocean Engineering*, vol. 218, p. 108261, 2020.
- [279] A. Khosroshahi, E. Ohn-Bar, and M. M. Trivedi, "Surround vehicles trajectory analysis with recurrent neural networks," in 2016 IEEE 19th International Conference on Intelligent Transportation Systems (ITSC), 2016, pp. 2267-2272.

### **APPENDIX D**

### VITA

The author was born on May 9, 1987, in Baghdad, Iraq. He completed his secondary school at several schools at Baghdad, Iraq. He pursued his degree at Al-Nahrain University, Iraq, and graduated with the Bachelor Eng. in Electronics and Communication Engineering in 2009. Then, he was engaged in 2013 in the Master program at Communication Department, Engineering College, UNITEN university, Malaysia. The author was pursuing Ph.D. in the field of Electrical Engineering at Faculty of Electrical and Electronic Engineering, Universiti Tun Hussein Onn Malaysia (formerly known as Institut Teknologi Tun Hussein Onn), 86400 Parit Raja, Batu Pahat, Johor, Malaysia. During this time, Mr. Mohammed Talal has the main author for many academic papers in areas of electronic and communication engineering.

