

The Influence of Personality and Demographic Characteristics on Aggressive Driving Behaviors in Eastern Chinese Drivers

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Purpose: Road safety research is important due to the large number of road traffic fatalities globally. This study investigated the influences of age, driving experience and other covariates on aggressive driving behavior.

Methods: A cross-sectional survey was conducted in Yixing City, Wuxi City, Jiangsu Province, China. Regression analysis was applied to explore the influences of age and driving experience and their interactions with other covariates on aggressive driving behavior. Two analyses methodologies were used to assess the simple effect of the interactions. Firstly, the Jamovi automatic analysis classification program was used to calculate the simple slope test. Second, the SPSS macro program was also used to calculate the simple slope test also.

Results: A total of 570 drivers (247 males, 282 females) participated in the survey. A negative correlation was found between age and aggressive driving behaviors, and a positive correlation was found between neuroticism and aggressive driving behaviors in the multiple regression analysis. Significant associations were also found between age, driving experience, and depression, as well as age, driving experience, and neuroticism. Simple slope tests showed that depressive symptoms could increase aggressive behaviors in the elderly and experienced drivers. When experiencing neuroticism, individuals with higher driving experience were more aggressive in driving than shorter experienced drivers.

Conclusion: Age and neuroticism influenced aggressive driving behaviors. Veteran drivers could be aggressive drivers when experiencing depressive symptoms or neuroticism. Mobile intervention could be sent to the potentially risky drivers, which would be safe and broadly feasible to prevent aggressive driving behavior in the background of COVID-19.

Keywords: aggressive driving behavior, age, driving experience, depressive symptoms, neuroticism

Introduction

Road safety has been an important global public health issue, particularly over the last few decades.¹ Injury resulting from traffic accidents accounted for many years lived with disability,^{2,3} and brought about considerable loss in productivity and economic outcomes.^{4,5} According to a World Health Organization report in 2019, more than 1.35 million people die on the roads annually.⁶ China has the largest number of road traffic fatalities in the world.⁷ The road fatalities in China accounted for 23% of the total global road traffic deaths in 2016,⁸ and approximately 21% of the total global road fatalities in 2017.⁹ Studies have shown that aggressive driving behavior significantly contributes to road traffic

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events, including the morbidity and mortality of road traffic accident outcomes.^{10–17}

Aggressive driving has been defined as “when individuals commit a combination of moving traffic offences to endanger other persons or property” by the National Highway Traffic Safety Administration (NHTSA).^{18,19} This is consistent with the definition of aggressive behavior as “any form of behavior directed toward the goal of harming or injuring another living being who is motivated to avoid such treatment”.²⁰ Studies in the field demonstrate that sociodemographic attributes are related to aggressive driving behavior.^{21–23}

Age and aggressive driving behavior have been reported to be closely associated. Many studies have concluded that the much younger aged drivers correlated with more risky, reckless and aggressive driving behaviors, which may be associated with an increased risk of traffic accident involvement.^{24–27} Conversely, Chinese scholar Huihui Zhang found that older drivers undertook more aggressive driving than younger drivers.²⁸ A Chinese high-speed railway study reported that older age was a significant predictor of accident involvement.²⁹ Therefore, whether age and aggressive driving behavior was positively correlated or negatively has not reached consistent reporting.

Previous studies revealed that men outnumber women in causing physical injury and direct aggression.^{30–33} Evolutionary perspective,^{30,34} biosocial reformulation mechanism^{35,36} and neurobiological dispositions³⁷ may contribute to the origins of gender differences in aggressive behaviors. In cultures men may act to reassert their masculinity through aggressive behaviors.³⁸ Dwight A. and David L. reported that violence in driving was more commonly reported in male-drivers.³⁹ Chinese scholars Jia et al reported that males were much more likely to overtake in a driving environment.⁴⁰ Additionally Feng et al reported the same phenomenon.⁴¹ Gwyther and Holland reported that women were significantly more likely to self-regulate while driving than men.⁴² The current studies consistently report that males are much more prone to direct aggressive behaviors.

Drivers with different driving experiences have different exposures and coping skills when negotiating conflicting traffic conditions. Lajunen and Parker (2001) found that driving experience correlated negatively with aggressive driving.⁴³ Similarly, Chinese scholars Jia et al found that driving experience was negatively correlated with aggressive driving behavior.⁴⁰ However, Chinese scholars

Li et al reported no significant correlation between aggressive driving behavior and driving experience.⁴⁴ There are few reports on the relationships between driving experience and aggressive driving behaviors, so further research is required.

Up to date, most studies report that males display much more physically aggressive behaviors convergently. However, there is not a consistent understanding of the influence of age and driving experience on aggressive driving behavior. This study aims to address this research gap and explore the influences of age and driving experience, and their interactions on aggressive driving behavior. A cross-sectional survey collected the data and other confounding factors that could impact aggressive driving behavior in actual traffic environments were controlled for in the analyses including personality^{28,45,46} and alcohol use disorders,^{47,48} social supports,^{49,50} negative emotion (depressive and anxiety symptoms),^{11,51,52} and poor sleep quality.^{53,54} The findings of this study will contribute to understanding aggressive driving behavior and may assist in the early identification of high-risk or accident-prone drivers, thus enabling the early prevention of traffic accidents.

Participants and Methods

Participants

The incidence of traffic accidents in Eastern China (including Shanghai City, Jiangsu Province, Zhejiang Province, Anhui Province, Jiangxi Province, and Fujian Province) was higher than in other regions in China.⁵⁵ The gross domestic product (GDP) of Jiangsu province was the highest among all provinces in Eastern China at the end of 2018.⁵⁶ A prosperous economy was accompanied by an increase in the number of motor vehicles purchased.^{57,58} The per capita GDP of Wuxi City was ranked first in Jiangsu Province in 2017 and 2018.^{59,60} The economic level of the Yixing area ranked in the middle of all the areas of Wuxi city.⁶¹ Therefore, participants were recruited from the Yixing area of Wuxi City.

The required sample size was estimated using the following formula: $n = Z^2P(1-P)/E^2$. P was set at 35.7% according to previous research.⁴⁰ E was 5% and Z was 1.96. The calculated sample size was 353. Given that 10% of the questionnaires may be invalid, the required sample size was estimated to be at least 392. In total, 570 participants completed the survey. Among these surveys, 31

questionnaires were not correctly finished, resulting in 529 valid surveys, with a response rate of 94.56%.

The inclusion criteria were: 1) adult drivers aged from 18 to 70 years, and 2) possession of a valid motor vehicle driver's license. The Application and Usages of Motor Vehicles from the Ministry of Public Security of the People's Republic of China No. 139 states that a person shall not apply for a motor vehicle driving license while experiencing mental illness conditions. Equally, those who have either taken or injected narcotic drugs during the past three years, been discharged from compulsory isolation measures for drug rehabilitation for less than three years, or have taken long-term dependent psychotropic drugs and are still addicted to them are not allowed to have a driving license.⁶² Therefore having a driver's license in China means an individual is free of mental illness and drug dependence.

The exclusion criteria were: 1) driver's license suspension, such as for drink driving; 2) drivers with a disability certificate; and 3) drivers of luxury cars were excluded because a luxury car may indicate a higher socioeconomic status, and thus, other drivers may avoid directing their aggressive driving behavior towards such individuals. The retail price of the luxury motor vehicle was > 1.3 million RMB, because the car retail price > 1.3 million RMB was defined as a luxury car by China's Taxation Bureau.⁶³

Measures

Social demographic data were collected, including gender, age, driving experience, and education. Gender was defined as male or female. Age was divided into four groups: [18–30] years old, [30–40] years old, [40–50] years old, and equal to or greater than 50 years old. Driving experience was divided into three groups: equal to or less than two years, 3–4 years, and equal to or more than five years. Education was divided into three groups: below senior high school (including senior high school), college education, and graduate school or above.

The aggressive driving behavior questionnaire developed by Luoyong was used in the current study. The questionnaire contains 23 items that assessed the following five factors: neglecting others, rapid lane changing, high-speed driving, risky overtaking, and personal assaultment (noted as an [Appendix](#)).⁶⁴ Neglecting others, such as not using the signal light when turning, was included. Rapid lane changing meant the driver moves his or her vehicle into a different lane rapidly. High speed driving referred to driving too fast disregarding speed limits. Personal

assaultment indicated hostility behaviors referred to as abusing or glaring at other drivers. Each factor was assessed on both A and B part. The A scale indicated real aggressive driving experience in certain conditions. B scale indicated cognitive control ability in terms of aggressive driving behavior when confronted by the same condition. Each question was scored on a five-point Likert scale. The test-retest reliability of each dimension of the scale ranges from 0.84–0.93 and the Cronbach α coefficient ranges from 0.76–0.92.⁶⁴ The total score for Part A, used in this study, assessed aggressive driving behavior. The higher the summary score for the A scale, the more likely the respondent drives aggressively.

The Generalized Anxiety Disorder (GAD-7) scale was used to assess the anxiety symptoms of participants. The GAD-7 is a seven-item, self-reported anxiety measurement tool designed by Spitzer.⁶⁵ The total score is a sum of seven categories; the total score ranges from 0–21 with 0–4 indicating no GAD, 5–9 indicating mild GAD, 10–14 indicating moderate GAD, and 15–21 indicating severe GAD. The internal consistency coefficient of the GAD-7 is reported as 0.907 and the retest reliability coefficient is 0.413, indicating that it has good reliability and validity.⁶⁶

The Patient Health Questionnaire-9 (PHQ-9), evaluated depressive symptoms experienced during the preceding two weeks. There are nine items in this questionnaire. A total score between 0–4 points indicates no depression, 5–9 indicates slight depression, 10–14 indicates moderate depression, 15–19 indicates moderately severe depression, and 20–27 indicates severe depression.⁶⁷ The Chinese version of the PHQ-9 has been reported to have a Cronbach's α coefficient of 0.86.⁶⁸

The typical definitions of personality share the understanding that it includes sustainable patterns of feelings, thoughts, and actions that emerge with stability over time and with context.⁴⁶ The Eysenck Personality Questionnaire-Short Scale (EPQ-RSC) was used to assess personality. The psychoticism, extraversion, and neuroticism model (P–E–N model) of personality was developed by Eysenck. Critics of the psychoticism trait have suggested that it was too heterogeneous to be considered a single trait. The psychoticism (P) scale of the EPQ had provoked much criticism regarding its clinical value and inferior psychometric properties. Participants with mental disorders were excluded from this study. Thus, only the extraversion (E) and neuroticism (N) subscales of the EPQ-RSC were used in this study. The reliability and validity of the E scale were reported to be 0.85 and 0.64,

respectively. The reliability and validity of the N scale were 0.82 and 0.63, respectively.^{69,70}

Sleep is a naturally recurring rest-state of mind and body, characterized by relatively inhibited sensory activity, inhibition of nearly all voluntary muscles and distinguished from wakefulness by a decreased ability to react to stimuli. The Pittsburgh Sleep Quality Index (PSQI) was used to assess sleep quality. The PSQI was divided into seven factors, with the total score ranging from 0–21.⁷¹ The higher the score, the lower the sleep quality. The psychometrics of the PSQI in insomnia patients was fittable.⁷¹ The Chinese version of the PSQI in the community ranks adults with insomnia an overall reliability coefficient of 0.82–0.83.⁷²

Abuse of illegal drugs is prohibited in China and is subject to legal constraints. Driving after drinking alcohol and driving while intoxicated in China is punished by driving-license suspension. Any driver whose driving license was suspended was excluded from this study. However, the drinking culture is prevalent in China and it was reported that alcohol use disorders would influence driving behavior.^{47,48} Therefore this article only considers the control of alcohol dependence. The Alcohol Use Disorders Identification Test (AUDIT), developed by the World Health Organization (WHO) in 1982, was used to screen for dangerous and harmful drinking.⁷³ The scale consists of 10 items, with a score of 8 being positive for harmful drinking. The Cronbach's α coefficient for the Chinese Version of this AUDIT is reported to be 0.782 and the Chinese version of the AUDIT scale has been found to have better reliability and validity than the English version.⁷⁴

Social support is where assistance is available from other people when needed, usually including emotional support,⁷⁵ companionship support,⁷⁶ informational support,⁷⁷ and tangible assistance.^{78,79} Social support was measured by the Social Support Rating Scale (SSRS), formulated by Chinese scholar Xiao in 1986. The scale has ten items measuring three factors: objective support, subjective support, and social support utilization, with an overall Cronbach's α coefficient of 0.833. The higher the score, the higher the level of social support.⁸⁰

Procedure

The Ethics Committee of Hainan Medical University approved the cross-sectional study protocol. A cross-sectional survey was designed and conducted between 1st February and 30th April 2019. A teacher with a Ph.D. in

clinical psychology supervised a team of researchers comprising another two teachers and three undergraduates who majored in psychology. This team of researchers conducted the survey in Mandarin. Posters were put up at the Vehicle Management Office in the Yixing area to recruit participants to the study. The undergraduates took turns recruiting participants at the office. The participants were informed that it was an anonymous survey and that all answers would be kept strictly confidential and only used for research purposes. All participants were informed about the purpose of this study, in accordance with the Declaration of Helsinki. The survey was conducted with the participant's consent. Participants who consented to participate and met the inclusion and exclusion criteria completed the online survey for data collection.

Statistical Analysis

Descriptive statistics were performed using the SPSS24.0 software. The data were expressed as a number, percentage, and sub-group comparisons. The regression analysis on the influencing factors of aggressive driving behavior was undertaken using Jamovi statistical software and the simple slop test of interactions was automatically generated. Second, the SPSS macro program was also used to calculate the simple effect. Two kinds of methodology were used to determine the simple effect of the interaction.

Results

Social Demographic Characteristics of the Sample

Table 1 showed the social demographic characteristics of the sample. The sample comprised 529 participants, including 247 males (46.69%) and 282 females (53.31%). The majority of participants (41.97%) were aged 18–30 years. Most of the participants had more than five years of driving experience (39.32%) and most had a college education (76.75%).

Effects of Age and Driving Experience on the Dimensions of Aggressive Driving Behavior

Table 2 showed the analysis of aggressive driving behaviors of different driving-experience in the four dimensions and the subgroup analysis of different ages in each dimension. There were significant differences in the total score of neglecting others, rapid lane changing, risky overtaking, and personal assault.

Table 1 Collation and Analysis of Participants Demographic Information

Variable	Category	Number of People	Percentage (%)
Gender	Male	247	46.69
	Female	282	53.31
Age	[18, 30]	222	41.97
	[30, 40]	135	25.52
	[40, 50]	140	26.47
	Over 50	32	6.05
	Driving experience	≤ 2 years	180
	3–4 years	141	26.65
	≥ 5 years	208	39.32
Educational level	≤ Senior high school	101	19.09
	College education	406	76.75
	Graduate school or above	22	4.16

Table 2 F-Test of Effects of Age and Driving-Experience on Aggressive Driving Behaviors

Factors	Driving Experience			F Test Value	P
	≤ 2 Years	3–4 Years	≥ 5 Years		
Neglecting others	9.26±0.35	9.50±0.37	7.66±0.23	10.82	0.00
[18, 30]	9.70±0.41	10.61±0.563	8.20±0.85	1.86	0.16
[30, 40]	7.37±0.73	9.27±0.61	8.18±0.39	2.56	0.08
[40, 50]	8.38±1.75	6.82±0.63	7.16±0.32	0.63	0.53
≥50	8.50±1.85	8.80±1.39	8.35±0.83	0.03	0.97
Rapid lane changing	9.56±0.37	9.92±0.44	7.12±0.23	21.64	0.00
[18, 30]	10.17±0.43	11.21±0.69	9.33±1.12	1.24	0.29
[30, 40]	7.48±0.83	9.69±0.72	7.82±0.54	3.02	0.05
[40, 50]	7.50±1.02	7.00±0.67	6.45±0.21	1.12	0.33
≥50	6.75±0.75	8.00±1.79	7.09±0.722	0.30	0.74
High speed driving	9.58±0.36	9.72±0.37	10.27±0.35	1.13	0.32
[18, 30]	10.01±0.42	11.21±0.69	9.13±0.97	0.72	0.46
[30, 40]	7.67±0.68	8.81±0.60	10.43±0.71	3.59	0.03
[40, 50]	9.00±1.45	8.86±0.84	10.18±0.48	0.84	0.43
≥50	8.50±1.50	9.20±1.93	11.04±1.13	0.60	0.55
Risky overtaking	12.38±0.44	13.60±0.48	11.56±0.33	5.98	0.00
[18, 30]	12.98±0.52	15.62±0.75	14.00±2.00	4.01	0.02
[30, 40]	10.26±0.99	12.60±0.69	11.90±0.63	1.99	0.14
[40, 50]	10.50±1.05	10.18±0.85	10.87±0.38	0.30	0.74
≥50	9.25±1.18	11.4±2.02	12.35±0.92	0.92	0.41
Personal assaultment	7.81±0.28	8.76±0.34	7.39±0.25	5.71	0.00
[18, 30]	8.10±0.33	9.92±0.544	9.47±1.51	4.48	0.01
[30, 40]	6.78±0.64	8.38±0.50	7.95±0.49	1.75	0.18
[40, 50]	7.63±1.12	6.55±0.58	6.83±0.28	0.40	0.67
≥50	5.00±0.71	6.80±1.46	7.22±0.62	1.00	0.38
Total score	48.59±1.54	51.48±1.68	44±1.05	7.31	0.00

Subgroups of different ages showed that the 30–40 age group differed in neglecting others, rapid lane changing, high-speed driving and the 18–30 age group differed in risky overtaking and personal assaultment.

Post Hoc Analysis of Age Groups and Driving Experience in Each Dimension

If the difference in Levene's test was statistically significant ($p < 0.05$), the hypothesis of homogeneity of variance

was not satisfied. If the difference in Levene’s test was not statistically significant ($p>0.05$), the hypothesis of homogeneity of variance could not be rejected. When the homogeneity of variance was met, the Tukey’s test can then compare groups in pairs. When the homogeneity of variance was not met, the Games-Howell test was performed in pairs between groups.

The multiple factor comparisons of the [18, 30] age group within the different driving experience groups

As shown in Table 3, no significant difference was detected using Levene’s test between high- speed driving, neglecting others, rapid lane changing and risky overtaking ($p>0.05$). As the variance was uniform, Tukey’s tests were performed for group comparisons. Personal assaultment was statistically significant in Levene’s test ($p<0.05$), however, the variance was not uniform, and the Games-Howell test was performed.

Table 4 showed that when the driving experience was 3–4 years compared with that of ≤ 2 years, there was

a significant difference in the dimension of risky overtaking. When the driving experience was 3–4 years, compared with driving years ≤ 2 years, there was a significant difference in the dimension of personal assaultment.

The multiple factor comparisons of the [30, 40] age group within the different driving experience groups

As shown in Table 5, neglecting others, rapid lane changing, risky overtaking and personal assaultment showed no statistically significant difference using Levene’s test ($p>0.05$). As the variance was uniform, Tukey’s tests were performed and high-speed driving was statistically significant using Levene’s test ($p<0.05$), then the variance was not uniform, and the Games-Howell test was performed.

Table 6 showed that when the driving experience was 3–4 years compared with that of ≤ 2 years, there was a significant difference in the dimension of neglecting others. When driving years ≥ 5 years, there was a significant difference in the dimension of rapid lane changing compared with driving years 3–4 years. When driving years ≥ 5 years, compared with driving years ≤ 2 years, there was a significant difference in the dimension of high speed driving.

The multiple factor comparisons of the [40, 50] age group within the different driving experience groups

As shown in Table 7, no statistically significant difference in each dimension was detected ($p>0.05$). As all the variances were uniform, Tukey’s tests were performed.

Table 3 Homogeneity of Variance Test

Factors	Levene Statistic	P
Neglecting others	1.09	0.34
Rapid lane changing	0.57	0.56
High speed driving	0.91	0.41
Risky overtaking	0.54	0.59
Personal assaultment	3.74	0.03

Table 4 Group Comparison in the [18, 30] Age Group

	Way	DE (I)	DE (J)	MD (I- J)	SE	P	95% CI	
							LB	UB
Neglecting others	T	≤ 2 years	3–4 years	-0.91	0.70	0.40	-2.56	0.74
		≤ 2 years	≥ 5 years	1.50	1.27	0.47	-1.51	4.50
		3–4 years	≥ 5 years	2.41	1.34	0.17	-0.76	5.57
Rapid lane changing	T	≤ 2 years	3–4 years	-1.04	0.78	0.38	-2.88	0.80
		≤ 2 years	≥ 5 years	0.84	1.42	0.83	-2.51	4.19
		3–4 years	≥ 5 years	1.88	1.49	0.42	-1.65	5.41
High speed driving	T	≤ 2 years	3–4 years	-0.65	0.72	0.64	-2.34	1.04
		≤ 2 years	≥ 5 years	0.88	1.31	0.78	-2.20	3.96
		3–4 years	≥ 5 years	1.53	1.38	0.51	-1.71	4.78
Risky overtaking	T	≤ 2 years	3–4 years	-2.64	0.93	0.01	-4.85	-0.44
		≤ 2 years	≥ 5 years	-1.02	1.70	0.82	-5.03	2.99
		3–4 years	≥ 5 years	1.62	1.79	0.64	-2.60	5.85
Personal assaultment	G-H	≤ 2 years	3–4 years	-1.83	0.64	0.01	-3.33	-0.32
		≤ 2 years	≥ 5 years	-1.37	1.54	0.66	-5.36	2.62
		3–4 years	≥ 5 years	0.46	1.60	0.96	-3.63	4.55

Abbreviations: T, Tukey’s test; G-H, Games-Howell test; DE, driving experience.

Table 5 Homogeneity of Variance Test

Factors	Levene Statistic	P
Neglecting others	2.64	0.08
Rapid lane changing	1.93	0.15
High-speed driving	4.45	0.01
Risky overtaking	0.22	0.80
Personal assaultment	0.11	0.90

Table 7 Homogeneity of Variance Test

Factors	Levene Statistic	P
Neglecting others	2.68	0.07
Rapid lane changing	1.85	0.16
High speed driving	1.25	0.29
Risky overtaking	0.46	0.64
Personal assaultment	0.47	0.63

Table 8 shows that in the group [40, 50] years old, there was no significant difference between each subgroup.

The multiple factor comparisons of equal to or over 50 years old age group within the different driving experience groups

As illustrated in Table 9, no statistically significant difference was detected for any dimensions ($p > 0.05$). The variance was uniform, so Tukey's tests were performed.

Table 10 showed that when drivers were aged ≥ 50 years old, there was no significant difference between each subgroup.

between age, driving experience, and neuroticism was statistically significant. Multicollinearity first proposed by Frisch,⁸¹ refers to the correlations between two or more dependent variables in a linear regression model, influencing the associations between dependent and independent variables. Variance inflation factor (VIF) is a measure of collinearity in a multiple linear regression model. Quinn and Keough suggested that when $VIF < 10$, there was no obvious multicollinearity.⁸² In statistical analysis, when $10 \leq VIF < 100$, the inference is that obvious multicollinearity exists, and there is severe multicollinearity when $VIF \geq 100$. All VIF values were tested and found to be in the acceptable range.

Multiple Analyses of the Factors Influencing Aggressive Driving Behaviors

Table 11 showed the regression analysis results testing the influences of various factors on aggressive driving behavior. Age and neuroticism were significant influencing factors, and the interaction between age, driving experience, and depression was statistically significant. Similarly, the interaction

Simple Effects of Age, Driving Experience, and Depressive Symptoms

Regression analysis showed that the interaction between age, driving experience, and depression was significant, so a simple slope test was conducted to characterize the interaction. Firstly, the Jamovi analysis automatic classification program was used to calculate

Table 6 Group Comparison in the [30, 40] Age Group

	Way	DE (I)	DE (J)	MD (I- J)	SE	P	95% CI	
							LB	UB
Neglecting others	T	≤ 2 years	3-4 years	-1.90	0.88	0.08	-3.98	0.18
		≤ 2 years	≥ 5 years	-0.813	0.84	0.60	-2.81	1.19
		3-4 years	≥ 5 years	1.088	0.71	0.28	-0.58	2.76
Rapid lane changing	T	≤ 2 years	3-4 years	-2.21	1.09	0.11	-4.78	0.37
		≤ 2 years	≥ 5 years	-0.34	1.05	0.95	-2.81	2.14
		3-4 years	≥ 5 years	1.87	0.87	0.09	-0.20	3.94
High speed driving	G-H	≤ 2 years	3-4 years	-1.15	0.91	0.43	-3.34	1.04
		≤ 2 years	≥ 5 years	-2.77	0.99	0.02	-5.13	-0.40
		3-4 years	≥ 5 years	-1.62	0.93	0.20	-3.84	0.60
Risky overtaking	T	≤ 2 years	3-4 years	-2.35	1.18	0.12	-5.14	0.45
		≤ 2 years	≥ 5 years	-1.64	1.14	0.32	-4.33	1.05
		3-4 years	≥ 5 years	0.70	0.95	0.74	-1.54	2.95
Personal assaultment	G-H	≤ 2 years	3-4 years	-1.60	0.86	0.16	-3.64	0.44
		≤ 2 years	≥ 5 years	-1.17	0.83	0.34	-3.14	0.79
		3-4 years	≥ 5 years	0.43	0.69	0.81	-1.22	2.07

Table 8 Group Comparison in the [40, 50] Age Group

	Way	DE (I)	DE (J)	MD (I- J)	SE	P	95% CI	
							LB	UB
Neglecting others	T	≤ 2 years	3–4 years	1.56	1.39	0.51	-1.74	4.86
		≤ 2 years	≥ 5 years	1.21	1.24	0.59	-1.71	4.14
		3–4 years	≥ 5 years	-0.35	0.79	0.90	-2.21	1.52
Rapid lane changing	T	≤ 2 years	3–4 years	0.50	0.98	0.87	-1.82	2.82
		≤ 2 years	≥ 5 years	1.06	0.87	0.45	-1.01	3.12
		3–4 years	≥ 5 years	0.56	0.56	0.58	-0.76	1.87
High speed driving	T	≤ 2 years	3–4 years	0.14	1.97	0.99	-4.57	4.84
		≤ 2 years	≥ 5 years	-1.18	1.76	0.78	-5.35	2.99
		3–4 years	≥ 5 years	-1.32	1.12	0.47	-3.98	1.34
Risky overtaking	T	≤ 2 years	3–4 years	0.32	1.61	0.98	-3.50	4.13
		≤ 2 years	≥ 5 years	-0.37	1.43	0.96	-3.76	3.01
		3–4 years	≥ 5 years	-0.69	0.91	0.73	-2.85	1.47
Personal assailment	T	≤ 2 years	3–4 years	1.08	1.21	0.65	-1.80	3.96
		≤ 2 years	≥ 5 years	0.80	1.08	0.74	-1.75	3.35
		3–4 years	≥ 5 years	-0.28	0.69	0.91	-1.91	1.35

Table 9 Homogeneity of Variance Test

Factors	Levene Statistic	P
Neglecting others	0.24	0.79
Rapid lane changing	0.48	0.62
High speed driving	0.65	0.53
Risky overtaking	0.40	0.67
Personal assailment	0.99	0.39

the interaction. The classification program divided depressive symptoms into three levels: the average minus one standard deviation level, the average level, and the average plus one standard deviation level. The result of this analysis was shown in Figure 1. The top two panels showed that for those with depressive symptoms one standard deviation less than the mean and those with the mean level depression symptoms, aggressive driving behaviors decreased with age and experience. However, the third panel showed that older and experienced drivers were more likely to engage in aggressive driving behavior when experiencing more severe depressive symptoms.

The SPSS macro program was also used to calculate the simple effect of the interactions. According to the PHQ-9 cut-off classification, in the absence of depressive symptoms ($PHQ-9 \leq 4$), the overall trend in aggressive driving behavior decreased with increasing age and driving experience (Figure 2). As shown in Figure 3, in the case of mild depressive symptoms ($5 \leq PHQ-9 \leq 9$),

when participants' were aged older than 40, regardless of driving experience levels, the occurrence of aggressive driving behavior demonstrated an upward trend. As shown in Figure 4, in the case of moderate depressive symptoms ($10 \leq PHQ-9 \leq 14$), aggressive driving behavior showed a downward trend with increasing age and driving experience. As shown in Figure 5, in the case of moderate to severe depressive symptoms ($15 \leq PHQ-9 \leq 19$), the aggressive driving behavior of drivers older than 30 years old showed an upward trend. As shown in Figure 6, in the case of severe depressive symptoms ($20 \leq PHQ-9 \leq 27$), the aggressive driving behavior of drivers with driving experience of more than 5 years and aged greater than 30 years showed an increasing trend.

Simple Effect Test of Age, Driving Experience, and Neuroticism

The interaction effect of age, driving experience, and neuroticism was statistically significant, so a further simple effect test was conducted for this interaction. Firstly, the Jamovi analysis automatic classification program was used to calculate the interaction. The classification program divided neuroticism into three levels: average minus one standard deviation level, average level, and average plus one standard deviation level. The results were shown in Figure 7. The Jamovi simple effect test showed that the total tendency was aggressive driving behavior decreased with increasing

Table 10 Group Comparison in the ≥ 50 Years Old Group

	Way	DE (I)	DE (J)	MD (I- J)	SE	P	95% CI	
							LB	UB
Neglecting others	T	≤ 2 years	3–4 years	-0.30	2.59	0.99	-6.69	6.09
		≤ 2 years	≥ 5 years	0.15	2.09	0.99	-5.01	5.31
		3–4 years	≥ 5 years	0.45	1.90	0.97	-4.25	5.15
Rapid lane changing	T	≤ 2 years	3–4 years	-1.75	2.28	0.73	-7.38	3.88
		≤ 2 years	≥ 5 years	-0.84	1.84	0.89	-5.38	3.71
		3–4 years	≥ 5 years	0.91	1.68	0.85	-3.23	5.05
High speed driving	T	≤ 2 years	3–4 years	-0.70	3.41	0.98	-9.12	7.72
		≤ 2 years	≥ 5 years	-2.54	2.75	0.63	-9.34	4.25
		3–4 years	≥ 5 years	-1.84	2.51	0.75	-8.04	4.35
Risky overtaking	T	≤ 2 years	3–4 years	-2.15	2.87	0.74	-9.23	4.93
		≤ 2 years	≥ 5 years	-3.10	2.31	0.39	-8.81	2.62
		3–4 years	≥ 5 years	-0.95	2.11	0.90	-6.15	4.26
Personal assaultment	T	≤ 2 years	3–4 years	-1.80	1.94	0.63	-6.59	2.99
		≤ 2 years	≥ 5 years	-2.22	1.57	0.35	-6.09	1.65
		3–4 years	≥ 5 years	-0.42	1.43	0.95	-3.94	3.11

Table 11 Regression Analysis of Factors Influencing Aggressive Driving

Variable	Estimate	SE	t	P
Intercept	74.81	10.62	7.04	0.00
Age	-7.43	2.42	-3.07	0.00
Gender	-4.46	2.57	-1.73	0.08
Education	-2.46	2.93	-0.84	0.40
Driving experience	-2.24	2.29	-0.98	0.33
Depression symptoms	-0.67	0.36	-1.87	0.06
Anxiety symptoms	0.52	0.45	1.14	0.25
Extraversion	-0.47	0.45	-1.04	0.30
Neuroticism	1.01	0.41	2.46	0.01
Alcohol dependence	0.26	0.23	1.16	0.25
Social support	-0.24	0.17	-1.40	0.16
Sleep quality	0.96	0.50	1.91	0.06
Age * driving experience * gender	-0.05	0.46	-0.11	0.92
Age * driving experience * education	0.44	0.46	0.96	0.34
Age * driving experience * depression	0.20	0.08	2.38	0.02
Age * driving experience * anxiety	-0.07	0.10	-0.74	0.46
Age * driving experience * extraversion	0.07	0.08	0.95	0.34
Age * driving experience * neuroticism	-0.17	0.08	-2.20	0.03
Age * driving experience * alcohol dependence	-0.03	0.05	-0.51	0.61
Age * driving experience * social support	0.00	0.02	0.10	0.92
Age * driving experience * sleep quality	0.09	0.09	0.91	0.36

age. However, shorter driving experience participants decreased much more sharply than more highly experienced drivers engaging in aggressive driving.

Then, using the SPSS macro program, the simple effects of age, driving years, and neuroticism (above-average level, and below average level) were calculated.

As shown in Figures 8 and 9, the general trend showed that increasing age decreased aggressive driving behavior. Shorter driving experienced participants decreased much more obviously than longer experienced drivers in aggressive driving when experiencing both reduced and higher neuroticism.

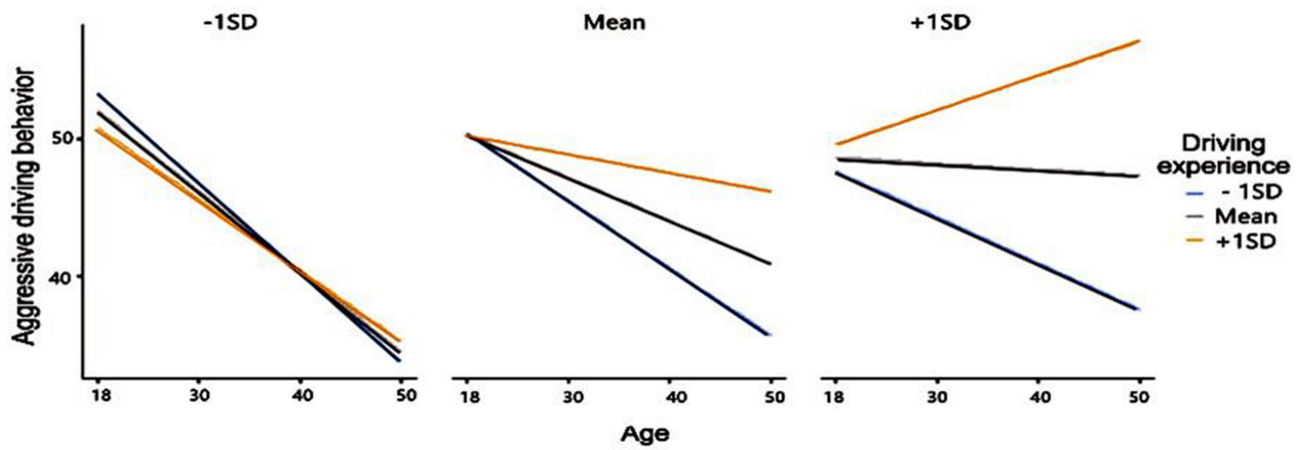


Figure 1 The simple effect of age, driving experience and depression symptoms using Jamovi software.

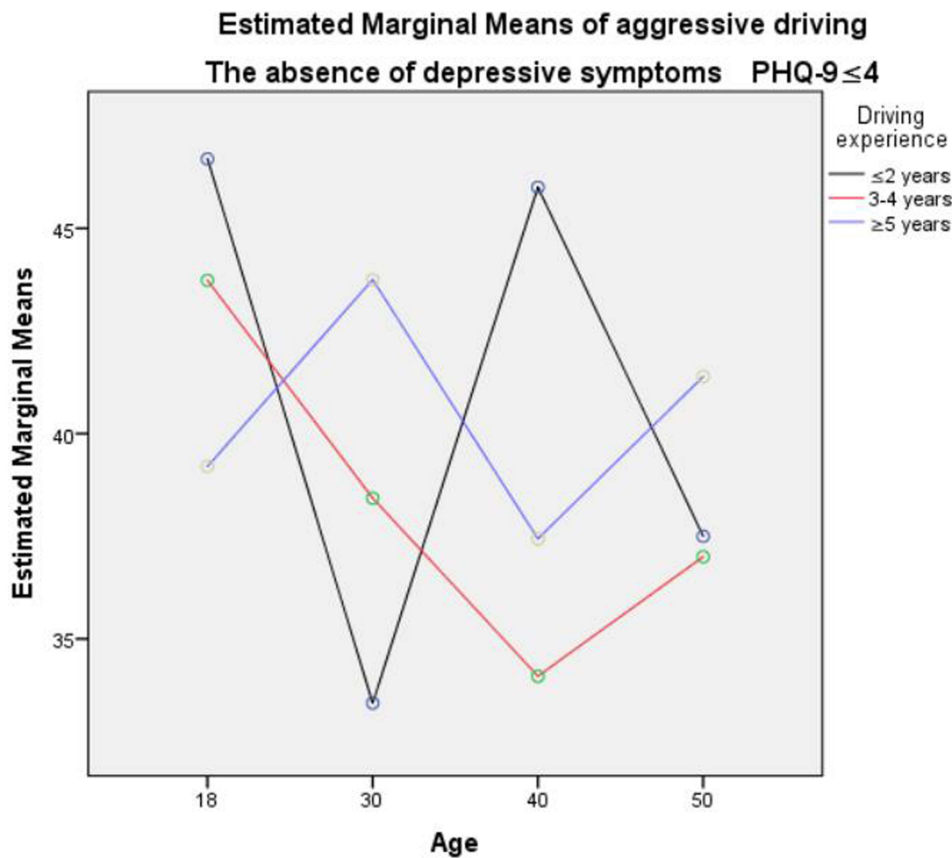


Figure 2 The simple effect of age, driving experience and depression symptoms when PHQ-9 ≤ 4 using SPSS.

Discussion

It has been previously reported that driver factors are directly or indirectly responsible for approximately 90% of traffic accidents.^{25,26,83,84} The recognition of risky drivers prone to aggressive driving behaviors and accident involvement is essential for ensuring traffic and public

safety. It has previously been asserted that drivers' self-reporting accurately represents their actual behavior,⁸⁵ especially when surveys were conducted anonymously,⁸⁶ inferring that findings from this anonymous survey would be reliable. Gender was not a significant impact of aggressive driving behavior probably because the female sample

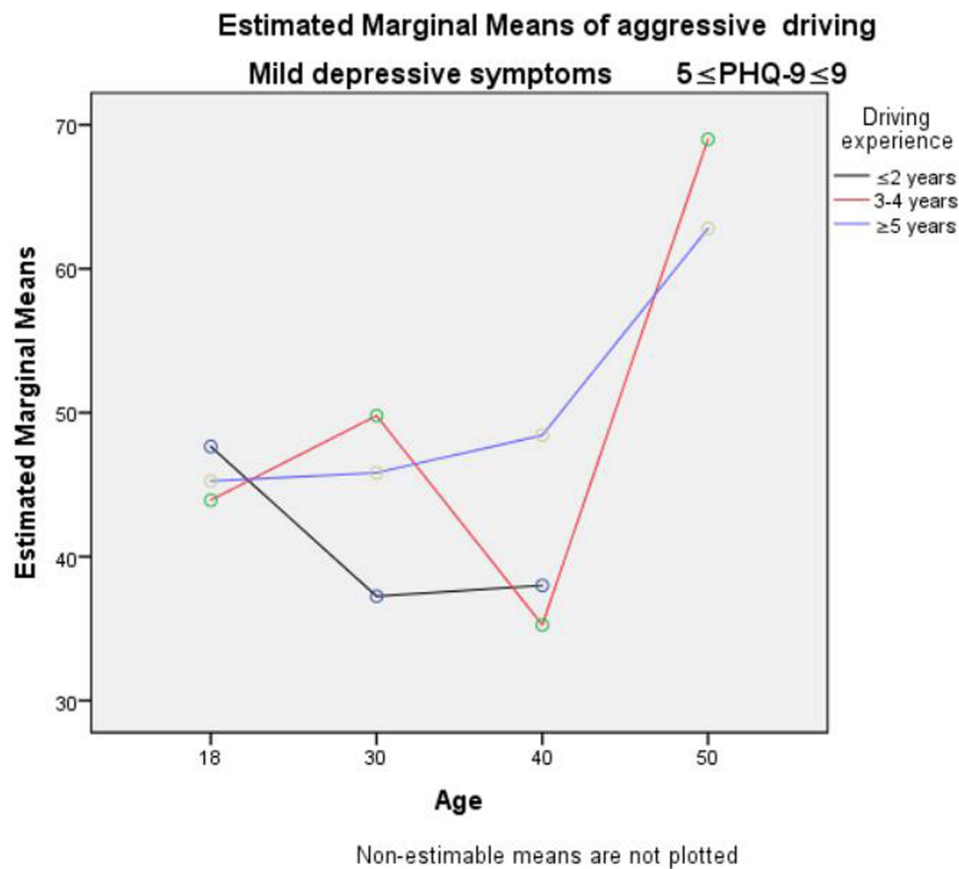


Figure 3 The simple effect of age, driving experience and depressive symptoms when $5 \leq \text{PHQ-9} \leq 9$ using SPSS.

was slightly higher than the male sample in an insufficiently sized sample pool.

Age and Aggressive Driving Behavior

Drivers of different ages may exhibit distinct cognition, driving abilities and risk preferences in any given traffic environment. The results from the current study elucidated that age and aggressive driving behavior was negatively correlated, consistent with previous studies that elderly drivers were safer drivers and in comparison, younger drivers were prone to commit increasingly risk-taking driving.^{26,27,87} However, the above studies ignored that other variables interacted with age during global traffic environment. Zhang analyzed the interaction of age and sex on aggression, and found the converse trend that aggressive driving increased with age.²⁸ Guo analyzed the interaction of age and personality traits finding that elderly drivers would be more accident-involvement.²⁹ These inconsistent findings from different scholars indicated that the influence of age on aggressive behavior would be more complicated when considering the interaction effects in natural traffic environments.

The interaction analysis from the current study indicated that veteran drivers with depressive symptoms could be more prone to aggressive driving behaviors. First, the Jamovi automatic analysis indicated that older drivers and those with more driving experience were more likely to show aggressive driving behaviors when experiencing higher depressive symptoms. Second, based on the PHQ-9 cut-off criterion, among those participants with mild depressive symptoms, older drivers and those with more driving experience were prone to aggressive driving behaviors. Together, these results derived using different assessment methods indicated that slight depressive symptoms increase the aggressive driving behaviors of older and more experienced drivers. In addition, the SPSS macro program showed that in the case of moderate to severe depressive symptoms, the aggressive driving behavior of drivers older than 30 years with all levels of driving experiences exhibited an upward trend. Moreover, when exhibiting severe depressive symptoms, the aggressive driving behavior of drivers with more than five years' experience and those aged greater than 30 years also showed an increasing trend.

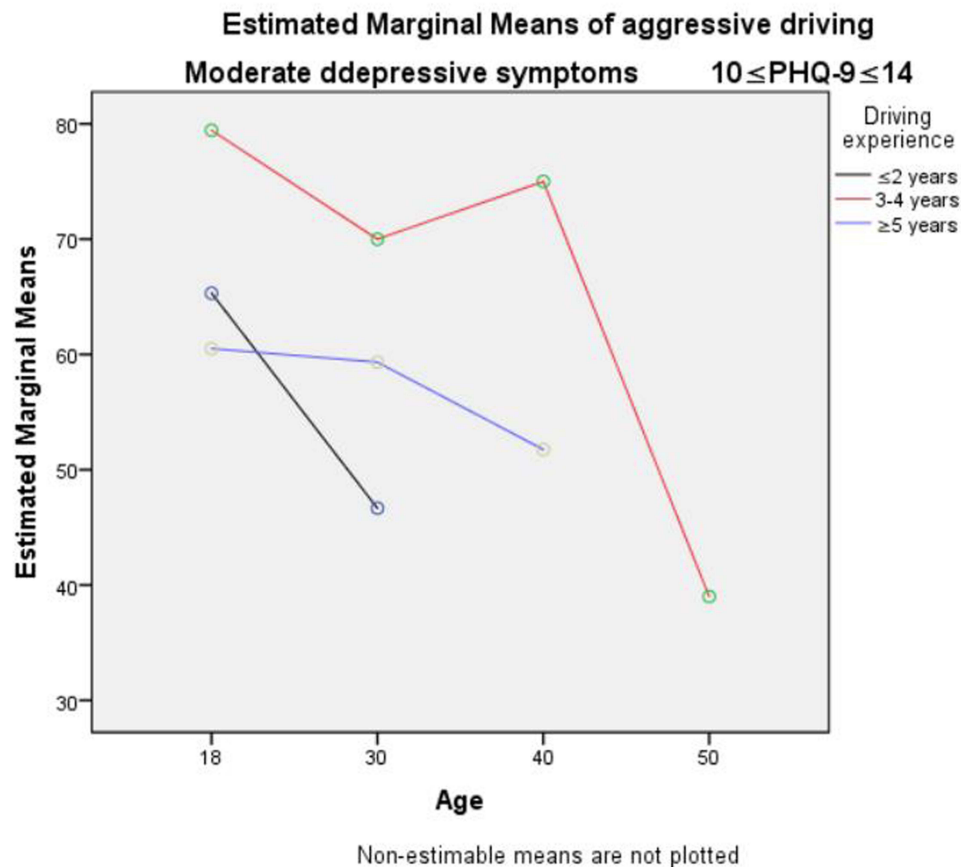


Figure 4 The simple effect of age, driving experience and depression symptoms when $10 \leq \text{PHQ-9} \leq 14$ using SPSS.

Associations between depression and aggression in children, adolescents⁸⁸⁻⁹¹ and schizophrenic patients⁹² have been previously described. To the authors' knowledge, this study is the first to show an association between depressive symptoms and aggressive behavior in the general adult daily lives setting. Depressed individuals may potentially be prone to aggression due to depressive symptoms being correlated with irritable moods,⁹³⁻⁹⁵ and irritable moods were correlated with impulsivity,^{96,97} which was closely associated with aggression.⁹⁸⁻¹⁰⁰ Praag suggested that increased aggressive behaviors be thought of as the pacemakers of depression.¹⁰¹ The coinciding linkage of depression and aggression suggested a shared neuroendocrine pathway. This result indicated a clinical potential of anti-depressants for treatment of aggressive behavior, as previously discussed by other scholars.¹⁰²⁻¹⁰⁴

According to the current and previous studies, aggressive driving prevention among experienced adult drivers should consider treating depressive symptoms. Such treatment methods include physical treatments, medication, and

psychotherapies. Physical therapy included electroconvulsive therapy (ETC),¹⁰⁵ vagus nerve stimulation,¹⁰⁶ and magnetic seizure therapy.¹⁰⁷⁻¹⁰⁹ Medications referred to traditional antidepressants and new antidepressants. The traditional clinical drugs mainly included tricyclic antidepressants,¹¹⁰ monoamine oxidase inhibitors (MAOI).¹¹¹ The new type antidepressants mainly included selective serotonin reuptake inhibitors (SSRIs),¹¹² and selective serotonin-norepinephrine reuptake inhibitors (selective serotonin-norepinephrine reuptake inhibitors, SNRIs).¹¹³ However, for those drivers who are not diagnosed with clinical depression, psychotherapy,¹¹⁴ would be safer and more practical to be administered by the traffic administration department. Internet cognitive behavioral therapy (iCBT) had been found effective for the treatment of depressive symptoms as well as other psychosomatic symptoms and psychosocial problems.¹¹⁵⁻¹¹⁸ In the COVID-19 background, iCBT could be a safe, cost-effective, feasible and immediately accessible method to moderate and mitigate the depressive symptoms for broadly targeted drivers.

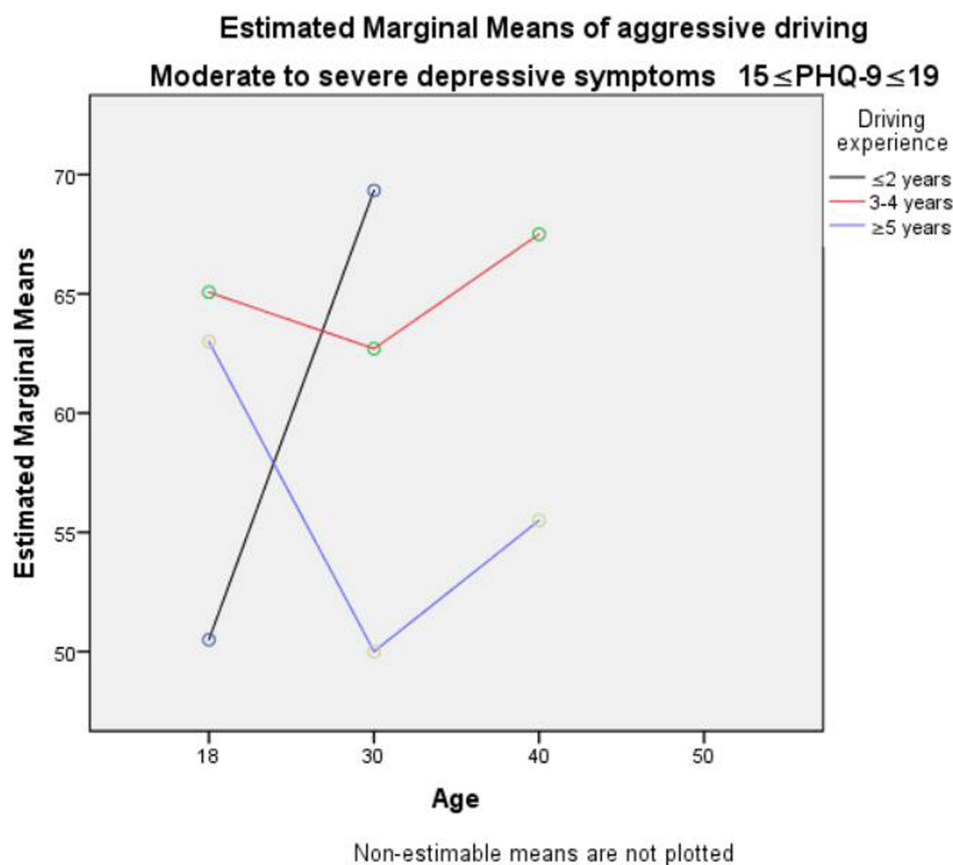


Figure 5 The simple effect of age, driving experience and depression symptoms when $15 \leq \text{PHQ-9} \leq 19$ using SPSS.

Neuroticism and Aggressive Driving Behavior

Personality reveals individuals' behavioral patterns in a variety of situations. Personality traits may be stable and could predispose individuals' emotional arousal and behavioral responses.¹¹⁹ The multiple regression model of the data showed that neuroticism had a significantly positive correlation with aggressive driving. This finding was consistent with previous studies that neuroticism was associated with more accident involvement, traffic violation^{29,120,121} and anti-social behavior.¹²²

The psychological mechanism for the association between neuroticism and aggressive behavior probably is due to the following reasons. First, people experiencing neuroticism tend to experience negative emotions such as stress, depression, and shame. Individuals in higher neuroticism might be easily emotional angered or frustrated, which triggers aggressive driving. Further, people with high neuroticism tend to have emotional instability, which means they tend to respond impulsively to stimuli and be overly-emotional. Many a study found that

individuals with emotional instability, such as sensitivity to express impulsivity, or high sensation seeking, can be predisposed to aggressive driving behaviors across conditions.^{123–125} The neurocognitive mechanism of neuroticism and aggressive behavior is unclear. Barratt and Krakowski et al reported patients with frontal impairment could not inhibit their violent impulses.^{126,127} The instrumental anti-social aggression was suggested to be related to a lack of moral socialization and empathy due to a lack of development of the violence inhibition system.^{128–130} Whether specific neural cue for an inhibitory pathway can explain the association of neuroticism and aggression association deserves further exploration.

The SPSS simple effect test also showed that drivers with less driving experience decreased much more sharply than more highly experienced drivers in aggressive driving within both neuroticism levels. Such trends indicated that drivers with more extended driving experience who were experiencing neuroticism required more intensive follow-up investigation and interventions. To screen and identify individuals with high neurotic personality

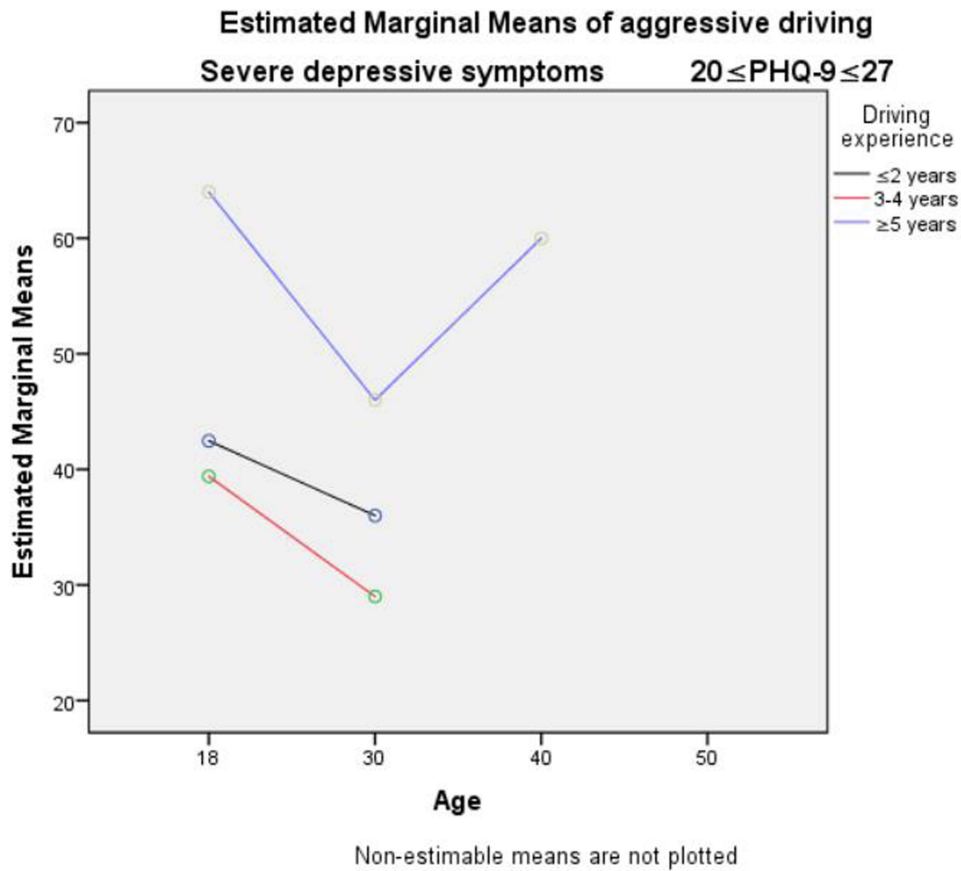


Figure 6 The simple effect of age, driving experience and depressive symptoms when $20 \leq \text{PHQ-9} \leq 27$ using SPSS.

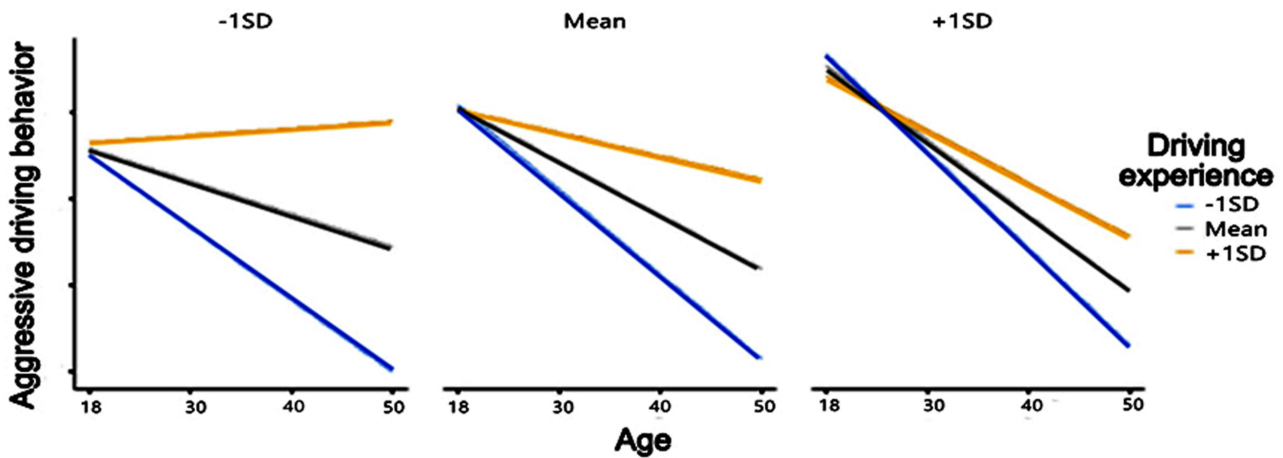


Figure 7 The simple effect test of age, driving experience and neuroticism using Jamovi software.

traits could be undertaken using a questionnaire such as the Eysenck personality Questionnaire,¹³¹ or Five-Factor Inventory.¹³² Additionally, a prevention logo or tips to warn about aggressive driving could be sent to targeted drivers using digital messages, such as Wei-chat

messages in China. Such strategies have proven effective in health promotion strategies,¹³³⁻¹³⁶ enabling any potentially aggressive driving individuals to prevent activating their aggressive tendencies due to early awareness strategies.

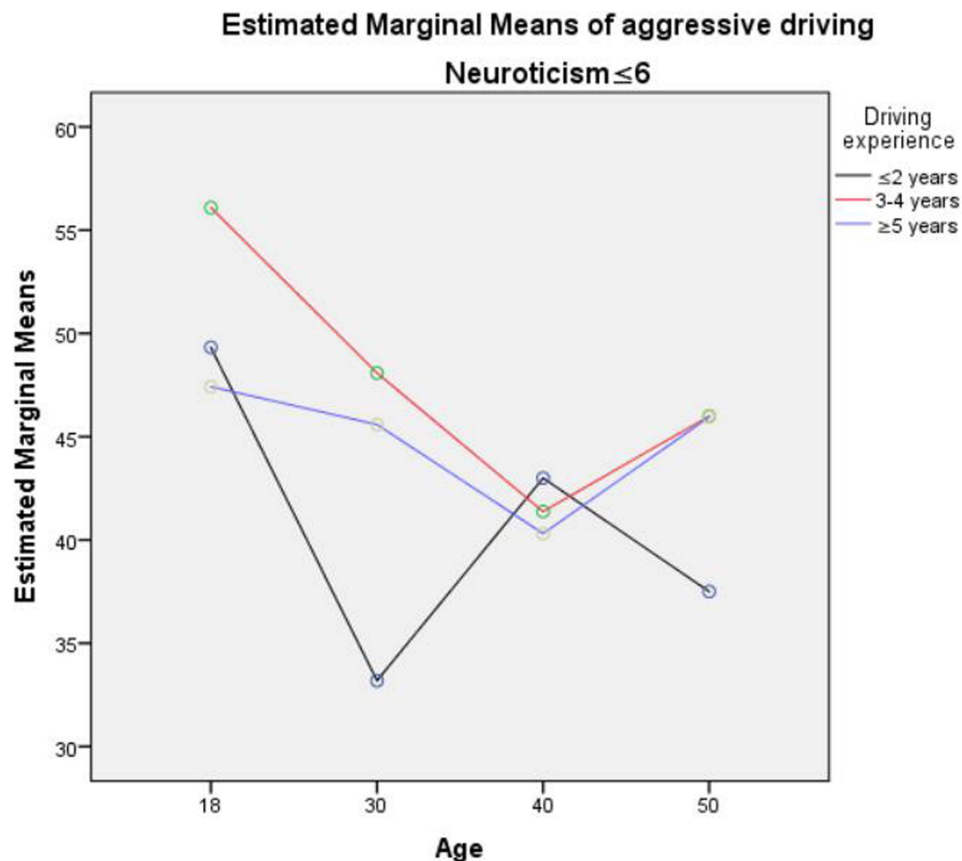


Figure 8 The simple effect of age, driving experience and depression symptoms when neuroticism ≤ 6 using SPSS.

Limitations

Despite the notable contributions of the current study to aggressive driving research, there are also real challenges in understanding the role of aggressive human factors in the real traffic environment. First, the cross-sectional design did not allow for the deduction of cause and effect, thus longitudinal research would be required. Second, the measurement of aggressive driving was derived from self-reporting measures, and more objective assessment methods could be used in future investigations. Third, external validation of the results required the testing of additional samples. Furthermore, the driving experience was measured using the number of driving years, whereas annual mileage should be considered in future studies. Finally, the study did not fully control the influencing factors of aggressive driving in the real world. There could be more confounding factors for road traffic accidents due to aggressive driving behavior in the complex dynamic traffic environment, such as the drivers' cognitive confounders (for example, attention, working memory and decision making processes) were not feasible to be

included in a retrospective investigation. Therefore, the external validity of this study needs a great deal more consideration.

Conclusion

It is crucial to identify which demographic drivers more prone to contribute to accident-related conditions, as these findings can inform risky driver prevention and treatment to enhance traffic safety. First, this study suggested that age influenced aggressive driving behaviors negatively. However, veteran drivers (elderly and those with more extensive driving experience) could exhibit more risky driving behaviors than younger and inexperienced drivers when experiencing depressive symptoms. The findings allow for a greater understanding of the relationship between age and driving safety and indicated that elderly and experienced drivers require much more care and consideration for their mental health conditions to ensure traffic safety.

Further, the results confirmed that neuroticism influenced aggression in the context of the driving environment. Higher neuroticism drivers should be considered

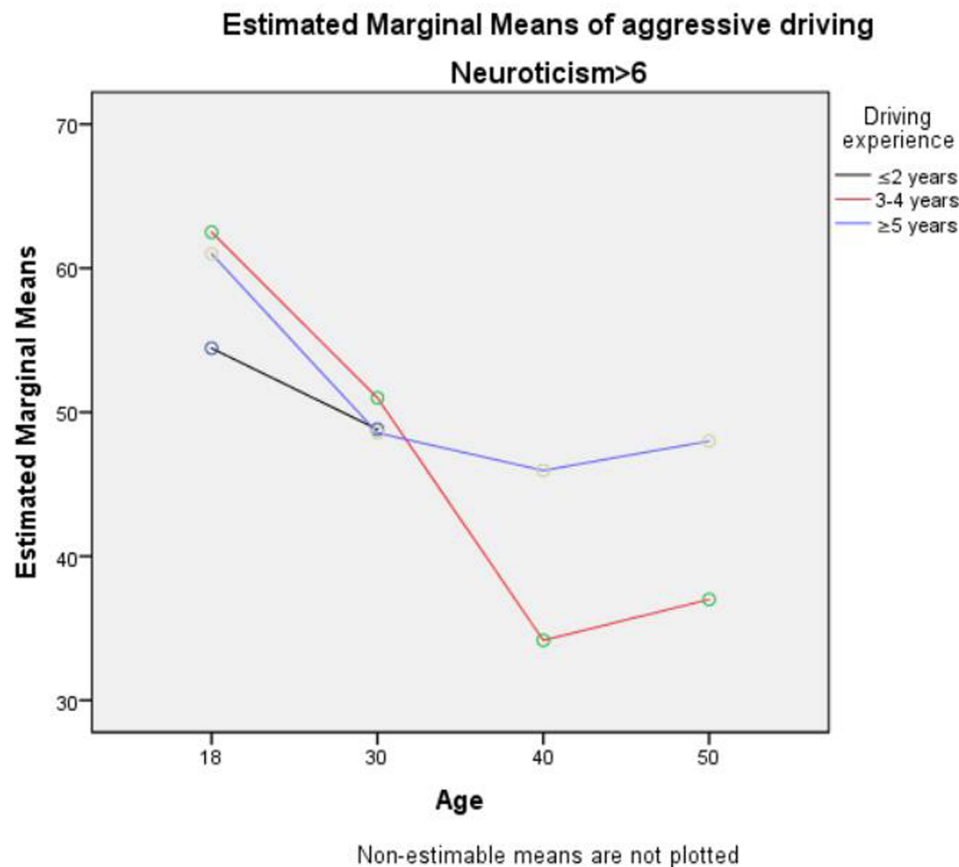


Figure 9 The simple effect of age, driving experience and neuroticism when neuroticism >6 using SPSS.

worthwhile targets for preventing aggressive driving and ensuring roadside safety. Additionally, drivers with more vast driving experience displaying neuroticism were much more aggressive than less experienced drivers experiencing neuroticism. In particular, safety program should be directed at experienced drivers with higher neuroticism trait.

Psychological treatments can be considered a traffic safety strategy, together with vehicle operation regulations and traffic rules education. Contrary to our common sense, veteran drivers could be riskier when experiencing depression symptoms or neuroticism. To our knowledge, this is the first study reporting that veteran drivers were more risky drivers when experiencing particular psychological states. The findings suggested that mental health conditions and personality traits should be considered when traffic safety programs are developed and applied. Mobile digital interventions could be sent to the potentially risky drivers, which would be safe and broadly feasible as a tool to prevent aggressive driving behavior in the background of COVID-19.

Disclosure

The authors report no conflicts of interest in this work.

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