

Measuring the effect of vehicle safety on road traffic crash severity in Iran: using structural equation modeling

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Published online: 2023-04-25

Abstract: **Objective:** Vehicle safety plays a key role in reducing the number of road traffic deaths and serious injuries. This study aims to investigate the effect of vehicle safety on the severity of traffic crashes in Iran using structural equation modeling (SEM).

Methods: This was a comparative cross-sectional study of all imported vehicles with Aras free trade zone license plate as well as all domestic vehicles (cars produced in Iran) commuting on Tabriz-Jolfa road. The study population included drivers who had accidents on Tabriz-Jolfa road over a period of one year from September 22, 2020 to September 21, 2021 and were injured or their vehicles had been damaged (n=652). Data was collected using set of questionnaires with 10 sections. The effect of independent variables, as exogenous latent variables (human, vehicle, and environmental factors), on a dependent variable, as an endogenous latent variable (crash severity) was measured using SEM. All data were analyzed using Mplus 8.0 software.

Results: In the structure part of the model with foreign vehicles group, the effect sizes of three exogenous variables, i.e., human, environmental, and vehicle factors, on the dependent variables were found to be 0.412, 0.396 and 0.358, respectively. The effect sizes in the model with domestic vehicles were found to be 0.312, 0.702 and 0.820, respectively.

Conclusion: Vehicle factors (variables related to car safety) had a high impact on crash severity in the national license plate and domestically manufactured vehicle group, indicating the necessity of improving vehicle safety.

Keywords: Air Bags; Seat Belts; Structural Equating Modeling; Traffic Accidents

Cite this article as: Zemestani A, Kavousi A, Sadeghi-Bazargani H, Soori H. Measuring the effect of vehicle safety on road traffic crash severity in Iran: using structural equation modeling. *Front Emerg Med.* 2023;7(2):e17.

1. Introduction

According to the latest report from the world health organization (WHO), published in 2018, more than 1.35 million people annually die due to road traffic crash (RTC) worldwide. RTC is considered the eighth cause of mortality among all age groups in the world and it is also among the major causes of death in countries with low socioeconomic status (1,2). Injuries caused by RTCs lead to the death of children and youth such that it is the first cause of mortality in the age group of 5-29 years (1,3). Iran is among the countries with the highest death rate due to RTCs. According to the WHO estimate, the annual incidence of death due to RTCs is 20.5 cases per 100,000 population in Iran (1).

Low quality of vehicle safety is one of the most important causes of deaths and injuries in RTCs. Improving vehicle safety was among the three important strategies for reducing the number of deaths resulting from RTCs by 50% in Europe from 2010 to 2020 (decade of action) (4,5). Vehicle safety is increasingly critical to accident prevention and plays a key role in reducing the number of deaths and serious injuries due

to RTCs (1). Considering the high share of passenger cars in RTCs (6), the government should examine vehicle quality and oblige domestic automobile manufacturers to comply with quality standards of vehicles.

Previous studies have investigated the role of human, environmental, and road factors as well as factors related to vehicle safety and quality on traffic accidents. These studies highlighted the direct and indirect effects of each factor on traffic accidents (7,8).

Severity of injuries and vehicle damage are considered two main indicators of crash severity level. Other factors such as driver's characteristics, road conditions, highway geometry, environmental factors, vehicle type, and roadside objects may also be directly or indirectly associated with crash severity. All of these factors interact in a complex manner, so it is often difficult to distinguish their interrelationships (8).

Statistical methods such as the structural equation modeling (SEM) are commonly used to diagnose and analyze the contribution of human, environmental, road, and vehicle factors to the severity of accidents (8). SEM accounts for com-

plex correlations between endogenous variables, i.e., variables that could be determined by other variables, and exogenous variables, i.e., variables that are simultaneously independent (9). SEM is a common and very powerful multivariate analysis technique from the multivariate regression family. To be more precise, SEM is an extension of the general linear model, which enables the researcher to simultaneously test a set of regression equations and examine the correlation between different variables (10,11). This study aims to measure the effect of vehicle safety on the severity of RTCs using SEM in two groups of cars manufactured inside and outside of Iran and comparing the severity of accidents in these two groups.

2. Methods

2.1. Study design

This was a comparative cross-sectional study. Given the large number of foreign-produced vehicles in Aras free trade zone located in East Azerbaijan province in Iran (Appendix figure 1) and their availability for epidemiologic studies, this area was chosen as the study setting. The sample size was calculated using Schreiber's method (rule of thumb) as well as Trout's theory (12,13). Ten samples were selected for each variable. The statistical population was all drivers of imported vehicles with Aras free trade zone license plate as well as all drivers of domestically-produced vehicles commuting on Tabriz-Jolfa road (Appendix figure 2). The study population included drivers who had accidents on Tabriz-Jolfa road (138 Km) over a period between September 22, 2020 and September 21, 2021 and were injured or damaged their vehicles. Vehicles with national license plate, as the representative of domestic vehicles (cars produced in Iran), were compared with those with Aras free trade zone license plate, as the representative of imported vehicles (cars produced in foreign countries, which are mainly produced in Japan, South Korea, France, Germany, and the United States of America).

2.2. Sampling

The samples were selected from the cars that had the accident outcomes and also from the drivers who had the experience of the accident. Accident outcomes, i.e., whether the outcome was injury to drivers or passengers or damage to drivers' vehicles, were extracted from the reports of East Azerbaijan province traffic police (Rahvar police) and insurance companies for the two groups.

Since all accidents on the Tabriz-Jolfa road are covered by three road police stations on the Tabriz-Marand, Marand-Jolfa, and Jolfa-Marand roads, and all accidents on this road are recorded and collected by these three centers, for the domestically produced cars, first, the list of cars that were involved in an accident was taken from these three centers and also insurance companies in Marand and Jolfa cities. Then, using stratified random sampling based on the price category of the cars, samples were selected from the cars involved in

the accident. Due to the fact that the number of cars that crashed in the group of foreign cars were limited, all the cars that crashed in this group during the study period, were included in the study.

2.3. Data collection

A set of questionnaires with 10 sections was first prepared to collect the data. This set included two checklists and eight questionnaires. The first section included items about participants' demographic and general characteristics. The second section contained items about the presence or absence of vehicle safety equipment and whether or not they were used as well as some other technical specifications of the vehicle (Appendix table 1). Sections 3 to 10 included the 60-item NEO five-factor inventory (NEO-FFI) questionnaire (14), Manchester driving behavior questionnaire (MDBQ) (15), attention deficit hyperactivity disorder (ADHD) self-report scale (16), Smits's multidimensional fatigue inventory (MFI) (17), Pittsburgh sleep quality index (PSQI) (18), drivers' distraction assessment questionnaire (19), 6-item Iranian socioeconomic status (SES6) questionnaire (20), and self-made vehicle safety knowledge measurement questionnaire (VSKMQ).

After selecting the samples, the vehicle drivers in the recent accident were contacted. After setting the meeting with these drivers, the questionnaires were completed through interviews. The data recorded by East Azerbaijan province traffic police were used to collect information on traffic violations or driving behavior. Moreover, the data related to accident outcomes (i.e., whether the outcome was injury to drivers or damage to drivers' vehicles) were extracted from the reports of traffic police for the two groups.

The data related to vehicles' technical specifications were extracted from vehicle manuals or automobile company websites.

2.4. Data analysis

In order to control the confounder variables, the vehicles were matched in terms of traffic on Jolfa-Tabriz road by selecting the vehicles that traveled on the road at least twice during the previous year. The respondents who did not answer some questions or the questioner missed asking them some of the questions were contacted again and the missing or unanswered items were completed. To avoid bias, especially information bias, the same questionnaire was used for all participants in the study. The time and place of the interview was left to the choice of the participants. After collecting the data, the completed questionnaires were coded and the final analysis was performed based on the given codes.

Based on the literature review and previous evidence, the studied variables were divided into three categories, namely human, environmental, and vehicle (car) factors. The variables of injury and vehicle damage were entered into the model as the accident severity assessment index (Table 1). Finally, the effect of independent variables on dependent vari-

ables was investigated and the effect of the three mentioned factors on crash severity (vehicle damage and injuries) was measured using SEM. T-test and chi-squared test were used for univariate analysis. All data were analyzed using Mplus 8.0 (21) and SPSS.22 software.

2.5. Structural equation modeling

SEM is a statistical technique that can process endogenous and exogenous variables to identify causal relationships between latent or observed variables. This technique manages endogenous and exogenous variables, simultaneously (7,22,23). SEM analysis allows us to investigate complex relationships between independent and dependent variables and integrate factor analysis (measurement model) and structural relationships (structural model) into a coherent model. The possibility of testing theories of relationships between variables is among the main advantages of using SEM. This method also enables the researcher to analyze the data by estimating the measurement error (23,24).

2.6. Model development

In our study, there were 53 observed variables, which were classified into 3 exogenous variables and one endogenous latent variable based on the literature review. Crash severity was considered as an endogenous latent variable, which was measured under the influence of latent (exogenous) variables of human, vehicle and environmental factors. Table 1 in the appendix presents the observed variables constituting latent variables and data of the measured variables. The final model, consisting of one endogenous and three exogenous variables, was developed for foreign and domestic vehicles, separately (Figures 1,2), as well as combination of both groups (Appendix figure 3). Each factor was measured by the observed variables, the validity of which was affected by the random measurement error. All the observed variables were regressed on their respective factors. Finally, four latent factors were found to be correlated, i.e., three latent structures of human, environmental and vehicle factors could affect the latent variable of crash severity.

It should be noted that tire, windshield, anti-lock braking system (ABS), hazard, directional and brake lights, electronic braking system (EBS), and emergency braking assistant (EBA) in foreign vehicles group and traffic role, energy absorbing steering, electronic stability control (ESC), intelligent speed adaptation (ISA), and active rollover protection (ARP) in the domestic vehicles group were removed from their model due to their lack of dispersion within the respective group.

2.7. Model assessment

The following indices or conventional fitting criteria were used to assess the SEM model: Chi-squared statistic (χ^2), root mean squared residual (RMSR), root mean squared error of approximation (RMSEA), goodness of fit index (GFI), adjusted goodness of fit index (AGFI), comparative fit index (CFI), normed fit index (NFI), and non-normed fit index (NNFI) or Tucker-Lewis index (TLI). In large samples and real data, the Chi-squared statistic is often significant even when the model fits properly. Therefore, in the SEM models with large sample sizes and real data, Chi-squared as well as other fitting indices are used to assess the model fitting. If GFI, AGFI, CFI, NFI and NNFI values are greater than 0.9, and RMSEA and RMSR values are less than 0.05, the model fit is appropriate and acceptable (7,25).

Out of the 700 questionnaires that were distributed, 652 were completed and analyzed (400 questionnaires related to domestic vehicles and 252 related to foreign vehicles). Forty-eight questionnaires that had several incomplete and missing information were excluded from the study. The latent construct, description of variables, and descriptive analysis for the variables are given in the appendix tables 1-3. Sixty-one percent and 39% of the participants were drivers of domestic and foreign vehicles, respectively. The results indicated that the mean number of violations or infringement and accidents among drivers of foreign vehicles was more than drivers of domestic vehicles ($P=0.000$). The mean age of domestic and foreign vehicles involved in accidents was 7.75 and 5.27 years, respectively ($P=0.000$). About 98% of the drivers were male in both groups ($P=0.385$). Approximately 30% of the accidents in both groups occurred during the official weekend in Iran, Thursday and Friday ($P=0.449$).

3. Results

In the structure part of the model with foreign vehicles (model 1), the effect sizes of three exogenous variables, i.e., human, environmental, and vehicle factors, on the dependent variable were 0.412, 0.396, and 0.358, respectively. The effect sizes in the model with domestic vehicles (model 2) were 0.312, 0.702, and 0.820, respectively. This suggests that human and vehicle factors in foreign and domestic vehicles groups were the most significant factors affecting the severity of the crash, respectively (Table 1). Figures 1 and 2 show the effect coefficients of the factors as well as the components of the factors on the severity of the crashes. In these figures, all the coefficients are standardized parameters. The numbers on the arrows and those in parentheses indicate the estimated coefficients and t-value, respectively. In the component part of the factors, the numbers inside the parentheses represent the estimated coefficients. Accordingly, any increase in exogenous variables was accompanied by the possibility of an increase in the endogenous variable (crash severity).

The model measurement sections showed that the latent variable of crash severity in domestic vehicles was somewhat influenced by vehicle damage (0.118), while this coefficient was very low in foreign vehicles (0.005). The variable that provides information about drivers' injuries had a strong and negative effect (-0.674) on accident severity in foreign vehicles, while this coefficient was very low in domestic vehicles (0.010).

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Table 1 Model Parameter Estimation of latent Variables

| Parameter | Path direction | Latent variable | SEM estimate | | | | | | | | |
|-----------|----------------|-----------------|--------------------|-------|---------|--------------------|-------|---------|--------------------|-------|--------|
| | | | Foreign vehicles | | | Domestic vehicles | | | Total vehicles | | |
| | | | Parameter estimate | S.E | CR | Parameter estimate | S.E | CR | Parameter estimate | S.E | CR |
| Sex | ← | Human | 0.352 | 0.010 | 35.20* | 0.349 | 0.007 | 49.85* | 0.420 | 0.005 | 84.00* |
| Age | ← | Human | 0.164 | 0.445 | 0.36 | -0.262 | 0.533 | -0.49 | 0.023 | 0.369 | 0.06 |
| Infring | ← | Human | 0.025 | 0.088 | 0.28 | -0.004 | 0.072 | -0.05 | 0.294 | 0.059 | 4.98* |
| Acnumber | ← | Human | -0.114 | 0.056 | -2.03* | 0.300 | 0.036 | 8.33* | 0.163 | 0.031 | 5.25* |
| Speed | ← | Human | 0.077 | 1.376 | 0.05 | 0.064 | 1.170 | 0.05 | 0.149 | 0.893 | 0.16 |
| Exprnce | ← | Human | 0.781 | 0.256 | 3.05* | -0.365 | 0.405 | -0.90 | -0.249 | 0.279 | -0.89 |
| License | ← | Human | 0.613 | 0.339 | 1.80 | -0.417 | 0.419 | -0.99 | -0.215 | 0.292 | -0.73 |
| Negscore | ← | Human | -0.109 | 0.052 | -2.09* | -0.044 | 0.403 | -0.10 | -0.099 | 0.033 | -3.00* |
| Alcohol | ← | Human | 0.123 | 0.011 | 11.18* | 0.054 | 0.012 | 4.50* | 0.070 | 0.008 | 8.75* |
| Druguse | ← | Human | 0.027 | 0.009 | 3.00* | 0.269 | 0.012 | 22.41* | 0.292 | 0.008 | 36.50* |
| Marital | ← | Human | -0.267 | 0.043 | -6.20* | -0.132 | 0.032 | -4.12* | -0.228 | 0.026 | -8.76* |
| Role | ← | Human | -0.119 | 0.009 | -13.2* | — | — | — | -0.101 | 0.003 | -33.6* |
| Tripnumb | ← | Human | -0.174 | 0.414 | -0.42 | -0.018 | 0.142 | -0.12 | -0.142 | 0.193 | -0.73 |
| Distance | ← | Human | 0.019 | 1.469 | 0.01 | 0.400 | 1.194 | 0.33 | -0.542 | 0.932 | -0.58 |
| Ownrship | ← | Human | -0.182 | 0.018 | -10.1* | 0.194 | 0.027 | 7.18* | -0.904 | 0.018 | -50.2* |
| NEOFFI | ← | Human | -0.074 | 0.799 | -0.09 | -0.262 | 0.690 | -0.37 | -0.049 | 0.543 | -0.09 |
| MDBQ | ← | Human | 0.296 | 0.698 | 0.42 | 0.144 | 0.605 | 0.23 | 0.238 | 0.504 | 0.47 |
| ADHD | ← | Human | 0.199 | 0.404 | 0.49 | 0.146 | 0.381 | 0.38 | 0.258 | 0.289 | 0.88 |
| MFI | ← | Human | -0.403 | 0.375 | -1.07 | -0.062 | 0.271 | -0.22 | -0.355 | 0.238 | -1.49 |
| PSQI | ← | Human | 0.225 | 0.129 | 1.74 | 0.373 | 0.122 | 3.05* | 0.316 | 0.093 | 3.39* |
| Distract | ← | Human | 0.410 | 1.174 | 0.34 | 0.356 | 0.804 | 0.44 | 0.246 | 0.754 | 0.32 |
| SES6 | ← | Human | 0.096 | 0.179 | 0.53 | -0.506 | 0.103 | -4.90* | 0.365 | 0.180 | 2.02* |
| Safety | ← | Human | -0.307 | 0.629 | -0.48 | -0.291 | 0.424 | -0.68 | -0.647 | 0.799 | -0.80 |
| Time | ← | Environment | 0.236 | 0.288 | 0.81 | 0.118 | 0.233 | 0.50 | 0.127 | 0.182 | 0.69 |
| Day | ← | Environment | -0.121 | 0.132 | -0.91 | -0.061 | 0.102 | -0.59 | -0.225 | 0.081 | -3.14* |
| Month | ← | Environment | 0.414 | 0.219 | 1.89 | 0.008 | 0.148 | 0.05 | 0.134 | 0.122 | 1.09 |
| Weather | ← | Environment | -0.441 | 0.075 | -5.88* | 0.134 | 0.057 | 2.35* | -0.153 | 0.046 | -3.32* |
| Rodqulty | ← | Environment | -0.598 | 0.061 | -9.80* | -0.013 | 0.408 | -0.03 | -0.287 | 0.038 | -7.55* |
| Lighting | ← | Environment | -0.033 | 0.039 | -0.84 | 0.309 | 0.309 | 1.00 | 0.136 | 0.028 | 4.85* |
| Obstacle | ← | Environment | 0.069 | 0.159 | 0.43 | 0.126 | 0.114 | 1.10 | 0.180 | 0.093 | 1.93 |
| Tire | ← | Vehicle | — | — | — | 0.568 | 0.010 | 56.8* | 0.796 | 0.006 | 132.6* |
| Wiper | ← | Vehicle | 0.184 | 0.006 | 30.66* | 0.035 | 0.012 | 2.91* | 0.033 | 0.008 | 4.12* |
| Windshld | ← | Vehicle | — | — | — | 0.044 | 0.012 | 3.66* | 0.272 | 0.007 | 38.85* |
| Belts | ← | Vehicle | -0.166 | 0.036 | -4.61* | -0.087 | 0.025 | -3.48* | -0.623 | 0.021 | -29.6* |
| Carage | ← | Vehicle | 0.109 | 0.120 | 0.90 | 0.229 | 0.218 | 1.05 | 0.414 | 0.149 | 2.77* |
| Length | ← | Vehicle | -0.107 | 24.33 | -0.004 | 0.559 | 17.03 | 0.03 | -0.401 | 15.26 | -0.02 |
| Height | ← | Vehicle | -0.311 | 19.06 | -0.01 | -0.376 | 2.44 | -0.15 | -0.531 | 8.053 | -0.06 |
| Width | ← | Vehicle | 0.150 | 16.92 | 0.008 | 0.586 | 4.51 | 0.12 | 0.401 | 7.828 | 0.05 |
| Axes | ← | Vehicle | 0.325 | 17.54 | 0.018 | 0.609 | 6.79 | 0.08 | 0.165 | 8.421 | 0.01 |
| Steering | ← | Vehicle | 0.551 | 0.301 | 1.83 | — | — | — | 0.672 | 0.016 | 42.00* |
| Hedlight | ← | Vehicle | -0.126 | 0.008 | -15.7* | -0.122 | 0.015 | -8.13* | -0.270 | 0.100 | -2.70* |
| Airbag | ← | Vehicle | -0.952 | 0.119 | -8.00* | -0.284 | 0.051 | -5.56* | -0.909 | 0.120 | -7.57* |
| ABS | ← | Vehicle | — | — | — | -0.193 | 0.044 | -4.38* | -0.415 | 0.029 | -14.3* |
| Hzdlight | ← | Vehicle | — | — | — | -0.019 | 0.017 | -1.11 | -0.279 | 0.011 | -25.3* |
| Directin | ← | Vehicle | — | — | — | -0.173 | 0.014 | -12.35* | -0.159 | 0.008 | -19.8* |
| Brklight | ← | Vehicle | — | — | — | -0.010 | 0.011 | -0.90 | -0.209 | 0.007 | -29.8* |
| EBS | ← | Vehicle | — | — | — | -0.098 | 0.048 | -2.04* | -0.658 | 0.038 | -17.3* |
| EBA | ← | Vehicle | — | — | — | -0.009 | 0.019 | -0.47 | -0.950 | 0.039 | -24.3* |
| ESC | ← | Vehicle | -0.479 | 0.058 | -8.25* | — | — | — | -0.817 | 0.035 | -23.3* |
| ISA | ← | Vehicle | -0.228 | 0.019 | -12.00* | — | — | — | -0.970 | 0.038 | -25.5* |
| ARP | ← | Vehicle | -0.624 | 0.061 | -10.22* | — | — | — | -0.563 | 0.027 | -20.8* |
| Damage | ← | Severity | 0.005 | 0.031 | 0.16 | 0.118 | 0.035 | 3.37* | 0.177 | 0.025 | 7.08* |
| Injury | ← | Severity | -0.674 | 0.048 | -14.04* | 0.100 | 0.041 | 2.43* | 0.225 | 0.031 | 7.25* |
| Severity | ← | Human | 0.412 | 0.033 | 12.48* | 0.312 | 0.045 | 6.93* | 0.302 | 0.038 | 7.94* |
| Severity | ← | Environment | 0.396 | 0.051 | 7.76* | 0.702 | 0.039 | 18.00* | 0.411 | 0.021 | 19.57* |
| Severity | ← | Car | 0.358 | 0.098 | 3.65* | 0.820 | 0.021 | 39.04* | 0.513 | 0.013 | 39.46* |

Table 1 Model Parameter Estimation of latent Variables (continued)

| Parameter | Path direction | Latent variable | SEM estimate | | | | | | | | |
|-------------------------|----------------|-----------------|--------------------|-------|-------|--------------------|-------|--------|--------------------|-------|--------|
| | | | Foreign vehicles | | | Domestic vehicles | | | Total vehicles | | |
| | | | Parameter estimate | S.E | CR | Parameter estimate | S.E | CR | Parameter estimate | S.E | CR |
| Variance or correlation | | | | | | | | | | | |
| Parameter | Path direction | Latent variable | Parameter estimate | S.E | CR | Parameter estimate | S.E | CR | Parameter estimate | S.E | CR |
| Human | → | Environment | 0.480 | 0.099 | 4.84* | 0.540 | 0.052 | 10.38* | -0.823 | 0.041 | -20.0* |
| Human | → | Vehicle | 0.652 | 0.098 | 6.65* | 0.521 | 0.061 | 8.54* | -0.329 | 0.034 | -9.67* |
| Environment | → | Vehicle | 0.057 | 0.036 | 1.58 | -0.182 | 0.077 | -2.36* | 0.553 | 0.045 | 12.31* |

SEM: Structural equation modeling; SE: Standard error; CR: Critical ratio; — : Incalculable due to the removal of the variable from the model

* Parameter estimates are significantly different from zero. All variables are described in appendix table 1

The critical ratio is a ratio of the parameter estimate to the standard error and on the basis of a probability level of .05, if the critical ratio was found to be more than +1.96 or less than -1.96, the parameter was considered significant.

*One-person study rescuing.

Table 2 SEM models' performance

| Fitting index | SEM models | | | Criteria of acceptable fit |
|---|------------|---------|---------|----------------------------|
| | Model 1 | Model 2 | Model 3 | |
| Number of variables | 45 | 48 | 53 | — |
| Chi-squared | 139.833 | 49.689 | 78.67 | Smaller value |
| Degree of freedom (df) | 45 | 48 | 53 | — |
| P-value | 0.0000 | 0.0037 | 0.0014 | — |
| X ² /df | 3.107 | 1.035 | 1.480 | 1-5 |
| Root mean square error of approximation (RMSEA) | 0.041 | 0.021 | 0.034 | < 0.05 |
| Standardized root mean square residual (SRMR) | 0.024 | 0.011 | 0.010 | < 0.05 |
| Tucker-Lewis index (TLI) | 0.920 | 0.938 | 0.965 | > 0.9 |
| Comparative fit index (CFI) | 0.901 | 0.941 | 0.958 | > 0.9 |

SEM: Structural equation modeling; Model 1: Model with foreign vehicles; Model 2: Model with domestic vehicles; Model 3: Model with total vehicles

In model 1, airbag was strongly and negatively correlated with vehicle factor (-0.952), while distance between the two vehicle axles was moderately and positively correlated (0.325), and energy absorbing steering wheel was strongly and positively correlated (0.551) with vehicle factor. Moreover, there was a moderate and negative correlation between vehicle height and electronic stability control (ESC), and vehicle factor (-0.311 and -0.479, respectively). In model 2, variables of tires (0.568), vehicle length (0.559), vehicle width (0.586), and distance between two axles (0.609) were strongly and positively correlated with vehicle factor, while vehicle height was moderately and negatively correlated with vehicle factor (-0.376).

The results of the latent variables of human and environmental factors are given in the tables and figures of the main text and the appendix.

3.1. Model fitting

In this study the X² values were found to be 139.83, 49.68, and 78.67 with 45, 48, and 53 degrees of freedom in the first, second, and third models, respectively (P<0.05). RMSEA and SRMR were less than 0.05 in all three models, indicating good fitting of all three models. Moreover, TLI and CFI were close to 1 in all three models. Considering that the value greater

than 0.9 represents model fit, these indices showed good fitting of data with the hypothetical models (Table 2).

4. Discussion

SEM latent variables and constructs consist of two components: a structural component that specifies the structural relationships between latent variables, and a measurement model that defines the relationship between latent and observed variables (24,26). Latent and observed variables are the two basic concepts in statistical analysis, especially factor analysis and SEM. Latent variables, known as exogenous variables, are variables that could not be directly measured. Therefore, researchers use the observed criteria or items that constitute the questionnaire items to measure latent variables (26).

Transportation researchers have recently used SEM to analyze driving behavior questionnaires (22,27). Regardless of difference between methods used in studies on traffic accidents, injury severity of occupants could not be employed as a valid variable to investigate accident or crash severity. This is because vehicle safety design could better protect passengers by preventing the penetration of force and pressure into the passenger compartment and cabin, and the reported

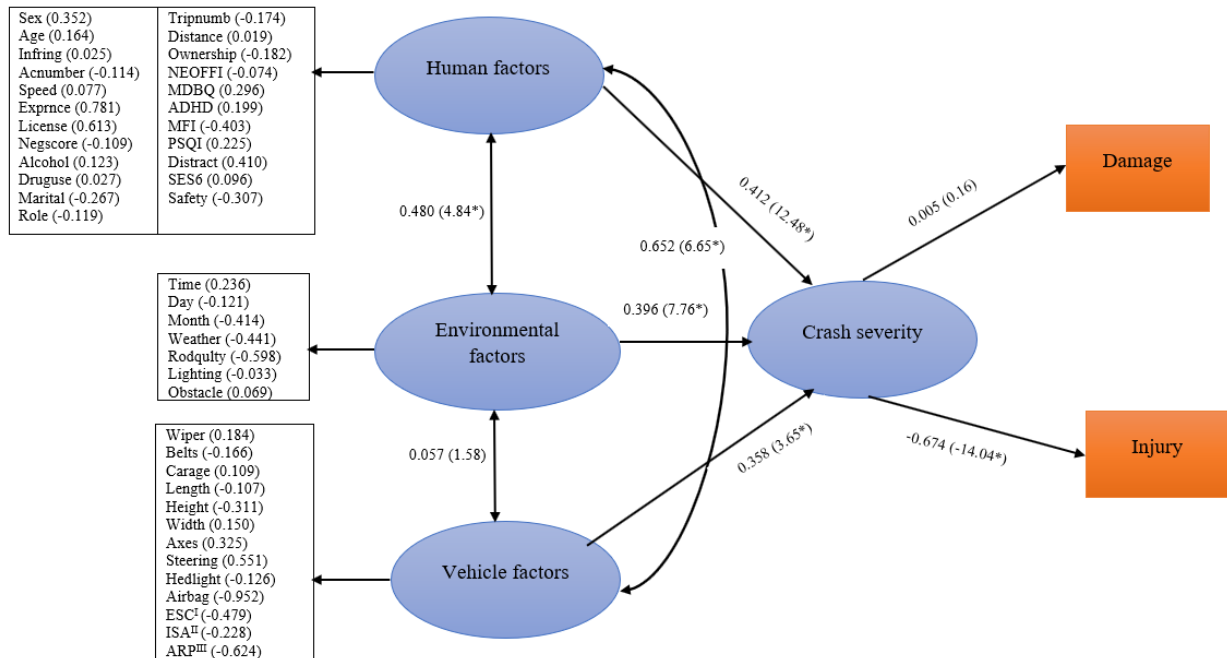


Figure 1 Structured equations model with data of foreign vehicles

The numbers on the arrows and those in the parentheses indicate the estimated coefficients and t-value, respectively, and in the component part of the factors, the numbers inside the parentheses represent the estimated coefficients.

I. Electronic stability control; II Intelligent speed adaptation; III. Active rollover protection

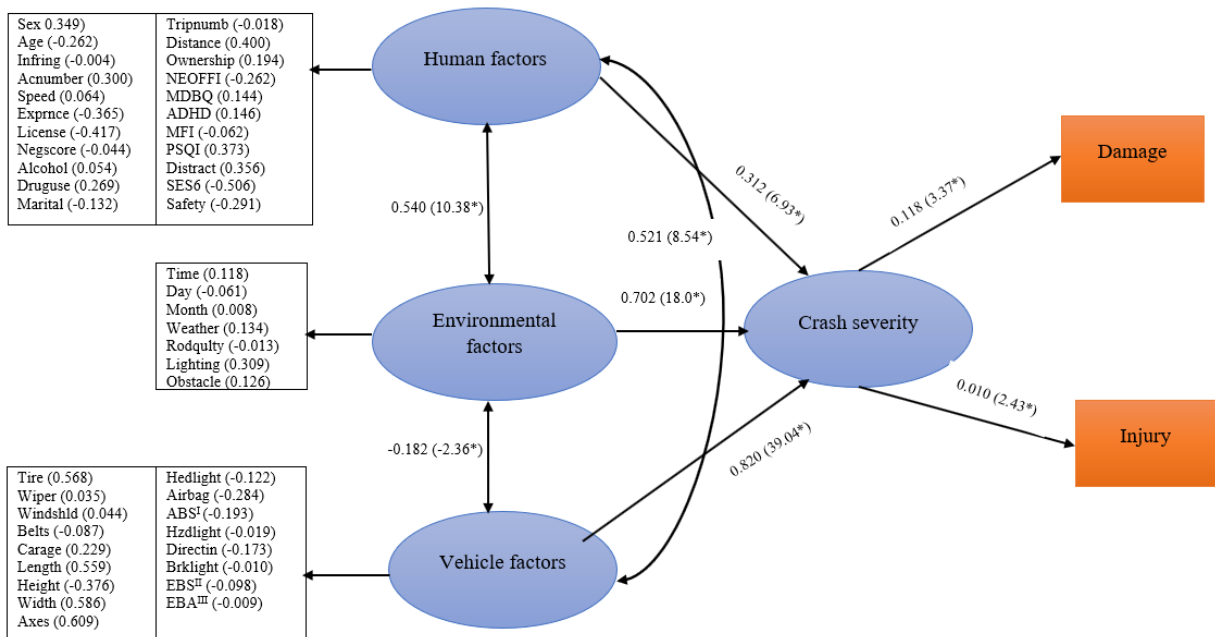


Figure 2 Structured equations model with data of domestic vehicles

The numbers on the arrows and those in the parentheses indicate the estimated coefficients and t-value, respectively, and in the component part of the factors, the numbers inside the parentheses represent the estimated coefficients.

I. Anti-lock braking system, II. Electronic braking system, III. Emergency braking assistant

damage severity could be biased under the influence of accident victims' description, complaints, and responses. Thus, most researchers use vehicle damage as an indicator of crash severity or combine vehicle damage with injury severity (7).

In the present study, a combination of observed variables (vehicle damage and driver injury) were used as indicators of the latent variable of crash severity.

Among the components of the vehicle factor related to ve-

hicle safety as a latent variable in both groups, windshield wipers, vehicle headlights, and vehicle age in foreign vehicles group, and windshield and tires in the domestic vehicles group were indirectly correlated with crash severity. Using tires, windshield wipers, windshield, and headlights of high quality and fastening the seat belt reduced crash severity. Increase in the vehicle age increased crash severity in both groups, which was probably due to greater caution of drivers with new vehicles as well as wear and tear of old vehicles and their lack of safety. This finding was in line with studies conducted in Ethiopia and Nepal (24,28,29).

Vehicle length had a negative and indirect effect on crash severity in foreign vehicles group, while this variable had a positive and indirect effect on crash severity in the domestic vehicles group. Thus, longer vehicles had less and more severe accidents in foreign and domestic groups, respectively. Vehicle height had a negative and indirect effect on crash severity in both groups. Thus, increase in the vehicle height decreased accident severity, probably due to drivers' better view, sufficient mastery, and vehicle timely control. Vehicle width and distance between two axles were positively and indirectly correlated with crash severity in both groups. The greater the vehicle width and distance between the two axles, the higher the crash severity.

Having an energy-absorbing steering wheel had a positive and indirect effect on crash severity in foreign vehicles group. Crash severity was higher among vehicles that did not have an energy-absorbing steering wheel. Various studies have reported the effect of airbag on reducing crash severity and accident deaths (30). The present study indicated that the number of vehicle airbags, had an indirect effect on crash severity. Increase in the number of airbags decreased crash severity. This finding has been confirmed in some previous studies emphasizing the existence of side airbags in vehicles (31). Having intact ABS, hazard light, directional light, brake, EBS, and EBA was negatively and indirectly correlated with crash severity in the domestic vehicles group. Thus, having such facilities reduced crash severity in this group. Moreover, having ESC, ISA, and ARP was negatively and indirectly correlated with crash severity in foreign vehicles group, i.e., these three technologies reduced crash severity in this group.

The latent variable of crash severity was directly and positively correlated with injury and vehicle damage in the domestic vehicles group, so that increase in crash severity in this group increased vehicle damage as well as driver and passenger injuries. This finding was consistent with that of Kim et al. (25). Injury severity had a direct and positive effect on vehicle damage in foreign vehicles group, while it had an inverse effect on driver and passenger injuries. Thus, severe accidents led to fewer injuries in this group, which was probably due to safety mechanisms such as airbags that work better in severe crashes.

In the structural section of the models, the latent variable of human factor had the greatest impact on crash severity in foreign vehicles group, indicating driver injury and vehicle

damage. The environmental factor had a positive effect on crash severity. These results were consistent with those of Lee et al. and Kim et al. (8,25). The vehicle factor had a positive effect on crash severity. In the domestic vehicles group, the vehicle and human factors had the maximum and minimum impacts on accident severity, respectively, indicating vehicle problems in domestic vehicles had a significant impact on crash severity. In the group consisting of both types of vehicles, the vehicle and human factors had the maximum and minimum impacts on accident severity.

In foreign vehicles group, although vehicle and environmental factors were important, managing human factors could have a greater effect on reducing crash severity. In the domestic vehicles group, while human and environmental factors were important, improving vehicle safety could greatly reduce accident severity. In the structural section of models, since human, environmental, and vehicle factors were latent variables, their values were not directly calculated. However, these values could be useful and informative because standard parameters were used.

5. Conclusion

Vehicle factor had a high impact on crash severity in the national license plate and domestically-manufactured vehicle group, indicating the necessity of improving vehicle safety. Further use of this method could support modification of SEM technique in the study of traffic safety and provide a basis for confirmatory and comparative analyses.

6. Declarations

6.1. Acknowledgement

We would like to appreciate the vice-chancellor for research and technology of Shahid Beheshti University of Medical Sciences, Traffic Research Center of Tabriz University of Medical Sciences and all professors and participants for their cooperation in conducting the research.

6.2. Authors' contribution

Contribution to conception and study design: AZ, HS; data collection and data analysis: AZ, HSB, AK; drafting of manuscript: AZ, HSB; discussing and appraising context of manuscript: AZ, HS, HSB; approval of the final version: AZ, HS, AK, HSB.

6.3. Conflict of interest

There is no conflict of interest.

6.4. Funding

Funds have not been received from any organization.

6.5. Ethical consideration

This paper is a part of a PhD dissertation in epidemiology approved by Ethics Committee of Shahid Beheshti University of Medical Sciences in 2021 with reference number of

IR.SBMU.PHNS.REC.1399.126.

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Appendix 1 Latent construct and description of variables

| Variable (component) | Description | Description and coding of input value |
|------------------------------|---|---|
| Human factors | | |
| Sex | Gender | 1=male, 2=female |
| Age | Age | Continuous scaled variable |
| Infring | Number of infringements over the past year | Continuous scaled variable |
| Acnumber | Number of accidents over the past year | Continuous scaled variable |
| Speed | Speed of the car in a recent accident | Continuous scaled variable |
| Exprnce | Number of years of driving experience | Continuous scaled variable |
| License | Number of years the driver has had a valid driver's licenses | Continuous scaled variable |
| Negscore | Number of negative scores in a recent year | Continuous scaled variable |
| Alcohol | Alcohol consumption (use of alcohol in recent accident) | 1=yes, 2=no |
| Druguse | Use of drugs in recent accident | 1= yes, 2=no |
| Marital | Marital status | 1=married, 2=single, 3=divorced, 4=whose spouse has died |
| Role | Traffic role of the individual in recent accident | 1=driver, 2=passenger |
| Tripnumb | Number of trips on Tabriz-Jolfa route during the last year | Continuous scaled variable |
| Distance | Distance traveled from the point of departure to the point of accident (km) | Continuous scaled variable |
| Ownrship | Car ownership status | 1=owner, 2=rental, 3=loan, 4=stolen |
| NEOFFI | NEO-five-factor inventory (FFI) questionnaire | Continuous scaled variable (0-240) |
| MDBQ | Manchester driving behavioral questionnaire | Continuous scaled variable (0-90) |
| ADHD | Attention-deficit hyperactivity disorder questionnaire | Continuous scaled variable (0-72) |
| MFI | Multidimensional fatigue inventory questionnaire | Continuous scaled variable (20-100) |
| PSQI | Pittsburgh sleep quality index | Continuous scaled variable (0-21) |
| Distract | Distraction (engagement) | Continuous scaled variable (0-156) |
| SES6 | Socio economic status (6-question) | Continuous scaled variable (4-27) |
| Safety | Vehicle safety knowledge measurement questionnaire (VSKMQ) | Continuous scaled variable (0-117) |
| Environmental factors | | |
| Time | Time of accident (hours) | 1=24-6, 2=6-12, 3=12-18, 4=18-24 |
| Day | Accident day (days of the week) | 1=Saturday, Sunday, Monday, Tuesday, Wednesday, 2=Thursday, Friday (weekend) |
| Month | The month of the accident | 1=High-traffic months (March, April, and September) 2=Low-traffic months (January, February, May, June, July, August, October, November, and December) |
| Weather | Weather conditions on the day of the accident | 1=sunny, 2=snowy, 3=rainy, 4=windy, 5=foggy, 6=sleet, 7=hail |
| Rodquilty | Road quality condition on the day of the accident | 1=dry, 2=snowy, 3=damp and rainy, 4=glacial, 5=covered by accident debris or oily |
| Lighting | Air lighting in the event of an accident | 1=darkness of night, 2=daylight, 3=sunrise or sunset, 4=night with spotlight |
| Obstacle | Dealing with an obstacle (existence or collision with an obstacle during an accident) | 1=no, 2=traffic sign, 3=guardrails, 4=obstacle in the middle of the road, 5=tree, 6=ditch, 7=falling from the bridge, 8=others (animal, bike, pedestrian) |
| Vehicle factors | | |
| Tire | Quality of car tires before the accident | 1=yes, 2=no |
| Wiper | Quality of car wipers before the accident | 1=yes, 2=no |
| Windshld | Quality of car windshields before the accident | 1=yes, 2=no |
| Belts | Having or not having a seat belt as well as using or not using a seat belt | 1=no seat belt, 2=has a seat belt but the driver did not use it, 3=has a seat belt and seat belt was used by the driver |
| Carage | How many years have passed since the production of the car? | Continuous scaled variable |
| Length | Car length (mm) | Continuous scaled variable |
| Height | Car height (mm) | Continuous scaled variable |
| Width | The distance between the wheels (mm) | Continuous scaled variable |
| Axes | The distance between the axes (mm) | Continuous scaled variable |
| Steering | Having an energy-absorbing steering column | 1=yes, 2=no |
| Hedlight | Having headlights and if they were intact or damaged | 1=no, 2=yes-damaged, 3=yes-intact |
| Aairbag | Having an airbag | 0=no airbag, 1=1 airbag, 2=2 airbags, 3=3 airbags, 4=4 airbags, 5=5 airbags, 6=6 airbags, 7=more than 6 airbags |
| ABS | Having anti-lock brakes system and its condition | 1=no, 2=yes-damaged, 3=yes-intact |
| Hzdlight | Having hazard lights and their condition | 1=no, 2=yes-damaged, 3=yes-intact |
| Directin | Having signal lights or directional signals and their condition | 1=no, 2=yes-damaged, 3=yes-intact |
| Brklight | Having brake light and its condition | 1=no, 2=yes-damaged, 3=yes-intact |

Appendix 1 Latent construct and description of variables (continued)

| Variable (component) | Description | Description and coding of input value |
|-----------------------|--|---|
| EBS | Having electronic braking system and its condition | 1=no, 2=yes-damaged, 3=yes-intact |
| EBA | Having emergency brake assist (autonomous emergency brake) and its condition | 1=no, 2=yes-damaged, 3=yes-intact |
| ESC | Having electronic stability control and its condition | 1=no, 2=yes-damaged, 3=yes-intact |
| ISA | Having intelligent speed adaptation and its condition | 1=no, 2=yes-damaged, 3=yes-intact |
| ARP | Having active rollover protection and its condition | 1=no, 2=yes-damaged, 3=yes-intact |
| Crash severity | | |
| Damage | Damage to car | 1=no damage, 2=light or superficial, 3=moderate damage, 4=severe or heavy damage, 5= total damage |
| Injury | Injury of driver (KABCO scale) | 1=no injury, 2=possible injury, 3=evident injury, 4=disability, 5=death |

Appendix 2 Sample descriptive analysis (continuous scaled variables)

| Variable | Components | Foreign vehicles | | | | Domestic vehicles | | | | P-value | Total | | | |
|---------------------|------------|------------------|---------|--------|--------|-------------------|---------|--------|--------|---------|-------|---------|--------|--------|
| | | N | Percent | Mean | Median | N | Percent | Mean | Median | | N | Percent | Mean | Median |
| Age | | 252 | 100 | 40.19 | 40.00 | 400 | 100 | 40.11 | 38.00 | 0.909 | 652 | 100 | | |
| Infringement number | 0 | 11 | 4.4 | | | 52 | 13 | | | | 63 | 9.6 | | |
| | 1 | 18 | 7.1 | | | 76 | 19 | | | | 94 | 14.4 | | |
| | 2 | 54 | 21.4 | | | 110 | 27.5 | | | | 164 | 25.2 | | |
| | 3 | 78 | 31 | 3.00 | 3.00 | 120 | 30 | 2.10 | 2.00 | 0.000 | 198 | 30.4 | 2.50 | 3.00 |
| | 4 | 48 | 19 | | | 28 | 7 | | | | 76 | 11.7 | | |
| | 5 | 33 | 13.1 | | | 1 | 0.3 | | | | 34 | 5.2 | | |
| | 6 | 10 | 4 | | | 1 | 0.3 | | | | 11 | 1.7 | | |
| | 7 | 0 | 0 | | | 12 | 3 | | | | 12 | 1.8 | | |
| | Sum | 252 | 100 | | | 400 | 100 | | | | 652 | 100 | | |
| Accident number | 0 | 15 | 6 | | | 13 | 3.3 | | | | 28 | 4.3 | | |
| | 1 | 104 | 41.3 | | | 230 | 57.5 | | | | 334 | 51.3 | | |
| | 2 | 96 | 38.1 | 1.60 | 2.00 | 123 | 30.8 | 1.40 | 1.00 | 0.002 | 219 | 33.6 | 1.50 | 1.00 |
| | 3 | 28 | 11.1 | | | 31 | 7.8 | | | | 59 | 9.0 | | |
| | 4 | 9 | 3.6 | | | 3 | 0.8 | | | | 12 | 1.8 | | |
| | Sum | 252 | 100 | | | 400 | 100 | | | | 652 | 100 | | |
| Speed | | 252 | 100 | 89.90 | 90.00 | 400 | 100 | 91.10 | 95.00 | 0.512 | 652 | 100 | 90.60 | 90.00 |
| Experience | | 252 | 100 | 9.41 | 9.00 | 400 | 100 | 13.50 | 11.50 | 0.000 | 652 | 100 | 11.90 | 10.00 |
| License | | 252 | 100 | 12.87 | 12.00 | 400 | 100 | 15.40 | 14.00 | 0.000 | 652 | 100 | 14.40 | 12.00 |
| Negative scores | 0 | 245 | 97.2 | | | 372 | 93 | | | | 617 | 94.6 | | |
| | 1 | 0 | 0 | | | 10 | 2.5 | | | | 10 | 1.5 | | |
| | 2 | 0 | 0 | 0.14 | 0.00 | 7 | 1.8 | 0.20 | 0.00 | 0.391 | 7 | 1.1 | 0.17 | 0.00 |
| | 5 | 7 | 2.8 | | | 11 | 2.8 | | | | 18 | 2.8 | | |
| | Sum | 252 | 100 | | | 400 | 100 | | | | 652 | 100 | | |
| Time | | 252 | 100 | 14.58 | 15.50 | 400 | 100 | 15.4 | 15.00 | 0.028 | 652 | 100 | 15.08 | 15.00 |
| Car age | | 252 | 100 | 5.27 | 5.00 | 400 | 100 | 7.75 | 7.00 | 0.000 | 652 | 100 | 6.79 | 6.00 |
| Trip number | | 252 | 100 | 7.32 | 5.00 | 400 | 100 | 3.94 | 3.00 | 0.000 | 652 | 100 | 5.25 | 4.00 |
| Distance | | 252 | 100 | 43.00 | 40.00 | 400 | 100 | 37.53 | 30.00 | 0.004 | 652 | 100 | 39.65 | 35.00 |
| Length | | 252 | 100 | 4525.4 | 4535.5 | 400 | 100 | 4212.6 | 4345.0 | 0.000 | 652 | 100 | 4333.5 | 4408.0 |
| Height | | 252 | 100 | 1604.4 | 1565.0 | 400 | 100 | 1452.3 | 1455.0 | 0.000 | 652 | 100 | 1511.1 | 1460.0 |
| Width | | 252 | 100 | 1869.5 | 1834.0 | 400 | 100 | 1696.0 | 1694.0 | 0.000 | 652 | 100 | 1763.0 | 1720.0 |
| Axes distance | | 252 | 100 | 2686.5 | 2700.0 | 400 | 100 | 2541.2 | 2600.0 | 0.000 | 652 | 100 | 2597.4 | 2670.0 |
| NEOFFI | | 252 | 100 | 126.24 | 123.50 | 400 | 100 | 133.78 | 134.50 | 0.000 | 652 | 100 | 130.87 | 130.0 |
| MDBQ | | 252 | 100 | 49.68 | 50.00 | 400 | 100 | 38.72 | 39.00 | 0.000 | 652 | 100 | 42.96 | 44.00 |
| ADHD | | 252 | 100 | 16.35 | 15.00 | 400 | 100 | 19.91 | 20.00 | 0.000 | 652 | 100 | 18.53 | 19.00 |
| MFI | | 252 | 100 | 50.32 | 51.00 | 400 | 100 | 54.95 | 54.00 | 0.000 | 652 | 100 | 53.16 | 54.00 |
| PSQI | | 252 | 100 | 4.54 | 5.00 | 400 | 100 | 5.78 | 6.00 | 0.000 | 652 | 100 | 5.30 | 5.00 |
| Distraction | | 252 | 100 | 49.69 | 49.00 | 400 | 100 | 67.90 | 72.00 | 0.000 | 652 | 100 | 60.86 | 64.00 |
| SES6 | | 252 | 100 | 20.74 | 21.29 | 400 | 100 | 12.66 | 12.32 | 0.000 | 652 | 100 | 15.78 | 14.28 |
| Safety | | 252 | 100 | 94.47 | 96.00 | 400 | 100 | 56.97 | 56.00 | 0.000 | 652 | 100 | 71.46 | 61.00 |

N: Number

Appendix 3 Sample descriptive analysis (ordinal scaled variables)

| Variable | Components | Foreign vehicles | | Domestic vehicles | | P-value | Total | |
|---------------------|---|------------------|---------|-------------------|---------|---------|--------|---------|
| | | Number | Percent | Number | Percent | | Number | Percent |
| Sex | 1=male | 246 | 97.6 | 393 | 98.2 | 0.385 | 639 | 98 |
| | 2=female | 6 | 2.4 | 7 | 1.8 | | 13 | 2 |
| Day | 1=non-weekend days (Saturday, Sunday, Monday, Tuesday, Wednesday) | 171 | 67.8 | 288 | 72 | 0.446 | 107 | 70.4 |
| | 2=Weekend (Thursday, Friday) | 81 | 32.2 | 112 | 28 | | 193 | 29.6 |
| Month | 1=high-traffic months (March, April, and September) | 70 | 27.8 | 102 | 25.5 | 0.000 | 172 | 26.4 |
| | 2= low-traffic months (January, February, May, June, July, August, October, November, and December) | 182 | 72.2 | 298 | 74.5 | | 480 | 73.6 |
| Alcohol consumption | 1=yes | 8 | 3.2 | 24 | 6 | 0.072 | 32 | 4.9 |
| | 2=no | 244 | 96.8 | 376 | 94 | | 620 | 95.1 |
| Drugs use | 1=yes | 5 | 2 | 24 | 6 | 0.010 | 29 | 4.4 |
| | 2=no | 247 | 98 | 376 | 94 | | 623 | 95.6 |
| Weather | 1=sunny | 110 | 43.7 | 261 | 65.3 | 0.000 | 371 | 56.9 |
| | 2=snowy | 66 | 26.2 | 47 | 11.8 | | 113 | 17.3 |
| | 3=rainy | 51 | 20.2 | 38 | 9.5 | | 89 | 13.7 |
| | 4=windy | 5 | 2 | 47 | 11.8 | | 52 | 8 |
| | 5=foggy | 20 | 7.9 | 7 | 1.8 | | 27 | 4.1 |
| | 6=sleet | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 7=hail | 0 | 0 | 0 | 0 | | 0 | 0 |
| Road quality | 1=dry | 119 | 47.2 | 288 | 72 | 0.000 | 407 | 62.4 |
| | 2=snowy | 61 | 24.2 | 48 | 12 | | 109 | 16.7 |
| | 3=damp and rainy | 57 | 22.6 | 40 | 10 | | 97 | 14.9 |
| | 4=glacial | 15 | 6 | 16 | 4 | | 31 | 4.8 |
| | 5=covered by accident debris or oily | 0 | 0 | 8 | 2 | | 8 | 1.2 |
| Lighting | 1=darkness of night | 21 | 8.3 | 64 | 16 | 0.000 | 85 | 13 |
| | 2=daylight | 179 | 71 | 280 | 70 | | 459 | 70.4 |
| | 3=sunrise or sunset | 42 | 16.7 | 16 | 4 | | 58 | 8.9 |
| | 4=night with spotlight | 10 | 4 | 40 | 10 | | 50 | 7.7 |
| Obstacle | 1=no | 151 | 59.9 | 282 | 70.5 | 0.011 | 433 | 66.4 |
| | 2=traffic sign | 10 | 4 | 23 | 5.8 | | 33 | 5.1 |
| | 3=guardrails | 35 | 13.9 | 35 | 8.8 | | 70 | 10.7 |
| | 4=obstacle in the middle of the road | 16 | 6.3 | 12 | 3 | | 28 | 4.3 |
| | 5=tree | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 6=ditch | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 7=falling from the bridge | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 8=other (animal, bike, pedestrian) | 40 | 15.9 | 48 | 12 | | 88 | 13.5 |
| Tire | 1=yes | 252 | 100 | 384 | 96 | 0.000 | 636 | 97.5 |
| | 2=no | 0 | 0 | 16 | 4 | | 16 | 2.5 |
| Wiper | 1=yes | 250 | 99.2 | 376 | 94 | 0.000 | 626 | 96 |
| | 2=no | 2 | 0.8 | 24 | 6 | | 26 | 4 |
| Windshields | 1=yes | 252 | 100 | 376 | 94 | 0.000 | 628 | 96.3 |
| | 2=no | 0 | 0 | 24 | 6 | | 24 | 3.7 |
| Seat belts | 1=no seat belt | 0 | 0 | 10 | 2.5 | 0.000 | 10 | 1.5 |
| | 2=has a seat belt but the driver did not use it | 110 | 43.6 | 155 | 38.7 | | 264 | 40.5 |
| | 3=has a seat belt and seat belt was used by the driver | 142 | 56.4 | 235 | 58.7 | | 378 | 58 |
| Marital status | 1=married | 204 | 81.0 | 184 | 46.0 | 0.000 | 388 | 59.5 |
| | 2=single | 32 | 12.7 | 200 | 50.0 | | 232 | 35.5 |
| | 3=divorced | 8 | 3.2 | 8 | 2.0 | | 16 | 2.5 |
| | 4=whose spouse has died | 8 | 3.2 | 8 | 2.0 | | 16 | 2.5 |
| Role | 1=driver | 247 | 98 | 400 | 100 | 0.008 | 647 | 99.2 |
| | 2=passenger | 5 | 2 | 0 | 0 | | 5 | 0.8 |
| Ownership | 1=owner | 247 | 98 | 372 | 93 | 0.000 | 583 | 89.5 |
| | 2=rental | 0 | 0 | 4 | 1 | | 40 | 6.1 |
| | 3=loan | 5 | 2 | 24 | 6 | | 29 | 4.4 |
| | 4=stolen | 0 | 0 | 0 | 0 | | 0 | 0 |
| Steering folding | 1=yes | 139 | 55.2 | 0 | 0 | 0.000 | 139 | 21.3 |
| | 2=no | 113 | 44.8 | 400 | 100 | | 513 | 78.7 |

Appendix 3 Sample descriptive analysis (ordinal scaled variables) (continued)

| Variable | Components | Foreign vehicles | | Domestic vehicles | | P-value | Total | |
|---------------|--------------------------|------------------|---------|-------------------|---------|---------|--------|---------|
| | | Number | Percent | Number | Percent | | Number | Percent |
| Headlights | 1=no | 0 | 0 | 0 | 0 | 0.000 | 0 | 0 |
| | 2=yes-damaged | 4 | 1.6 | 41 | 10.3 | | 45 | 6.9 |
| | 3=yes-intact | 248 | 98.4 | 359 | 89.7 | | 607 | 93.1 |
| Airbag | 0=no airbag | 0 | 0 | 34 | 8.5 | 0.000 | 34 | 5.2 |
| | 1=1 | 0 | 0 | 41 | 10.3 | | 41 | 6.3 |
| | 2=2 airbags | 7 | 2.8 | 317 | 79.2 | | 324 | 34.4 |
| | 3=3 airbags | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 4=4 airbags | 10 | 4 | 8 | 2 | | 18 | 2.1 |
| | 5=5 airbags | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 6=6 airbags | 140 | 55.6 | 0 | 0 | | 140 | 21.5 |
| | 7=more than 6 airbags | 95 | 37.6 | 0 | 0 | | 95 | 14.5 |
| ABS | 1=no | 0 | 0 | 108 | 27 | 0.000 | 108 | 16.6 |
| | 2=yes-damaged | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 3=yes-intact | 252 | 100 | 292 | 73 | | 544 | 83.4 |
| Hazard lights | 1=no | 0 | 0 | 0 | 0 | 0.000 | 0 | 0 |
| | 2=yes-damaged | 0 | 0 | 57 | 14.3 | | 57 | 8.7 |
| | 3=yes-intact | 252 | 100 | 343 | 85.7 | | 595 | 91.3 |
| Turn lights | 1=no | 0 | 0 | 0 | 0 | 0.000 | 0 | 0 |
| | 2=yes-damaged | 0 | 0 | 32 | 8 | | 32 | 4.9 |
| | 3=yes-intact | 252 | 100 | 368 | 92 | | 620 | 95.1 |
| Brake lights | 1=no | 0 | 0 | 0 | 0 | 0.000 | 0 | 0 |
| | 2=yes-damaged | 0 | 0 | 20 | 5 | | 20 | 3.1 |
| | 3=yes-intact | 252 | 100 | 380 | 95 | | 632 | 96.9 |
| EBS | 1=no | 0 | 0 | 242 | 60.5 | 0.000 | 242 | 37.1 |
| | 2=yes-damaged | 0 | 0 | 13 | 3.3 | | 13 | 2 |
| | 3=yes-intact | 252 | 100 | 145 | 36.2 | | 397 | 60.9 |
| EBA | 1=no | 0 | 0 | 385 | 96.2 | 0.000 | 385 | 59 |
| | 2=yes-damaged | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 3=yes-intact | 252 | 100 | 15 | 3.7 | | 267 | 41 |
| ESC | 1=no | 75 | 29.8 | 400 | 100 | 0.000 | 475 | 72.9 |
| | 2=yes-damaged | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 3=yes-intact | 177 | 70.2 | 0 | 0 | | 177 | 27.1 |
| ISA | 1=no | 6 | 2.4 | 400 | 100 | 0.000 | 406 | 62.3 |
| | 2=yes-damaged | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 3=yes-intact | 246 | 97.6 | 0 | 0 | | 246 | 37.7 |
| ARP | 1=no | 159 | 63.1 | 400 | 100 | 0.000 | 559 | 85.7 |
| | 2=yes-damaged | 0 | 0 | 0 | 0 | | 0 | 0 |
| | 3=yes-intact | 93 | 36.9 | 0 | 0 | | 93 | 14.3 |
| Damage | 1=no damage | 0 | 0 | 0 | 0 | 0.006 | 0 | 0 |
| | 2=light or superficial | 188 | 74.6 | 274 | 68.5 | | 462 | 70.9 |
| | 3=moderate damage | 59 | 23.4 | 92 | 23 | | 151 | 23.2 |
| | 4=severe or heavy damage | 5 | 2 | 27 | 6.8 | | 32 | 4.9 |
| | 5=total damage | 0 | 0 | 7 | 1.8 | | 7 | 1.1 |
| Injury | 1=no injury | 161 | 63.9 | 241 | 60.3 | 0.294 | 402 | 61.7 |
| | 2=possible injury | 51 | 20.2 | 86 | 21.5 | | 137 | 21 |
| | 3=evident injury | 40 | 15.9 | 68 | 17 | | 108 | 16.6 |
| | 4=disability | 0 | 0 | 5 | 1.3 | | 5 | 0.8 |
| | 5=death | 0 | 0 | 0 | 0 | | 0 | 0 |
| | Sum | 252 | 100 | 400 | 100 | — | 652 | 100 |

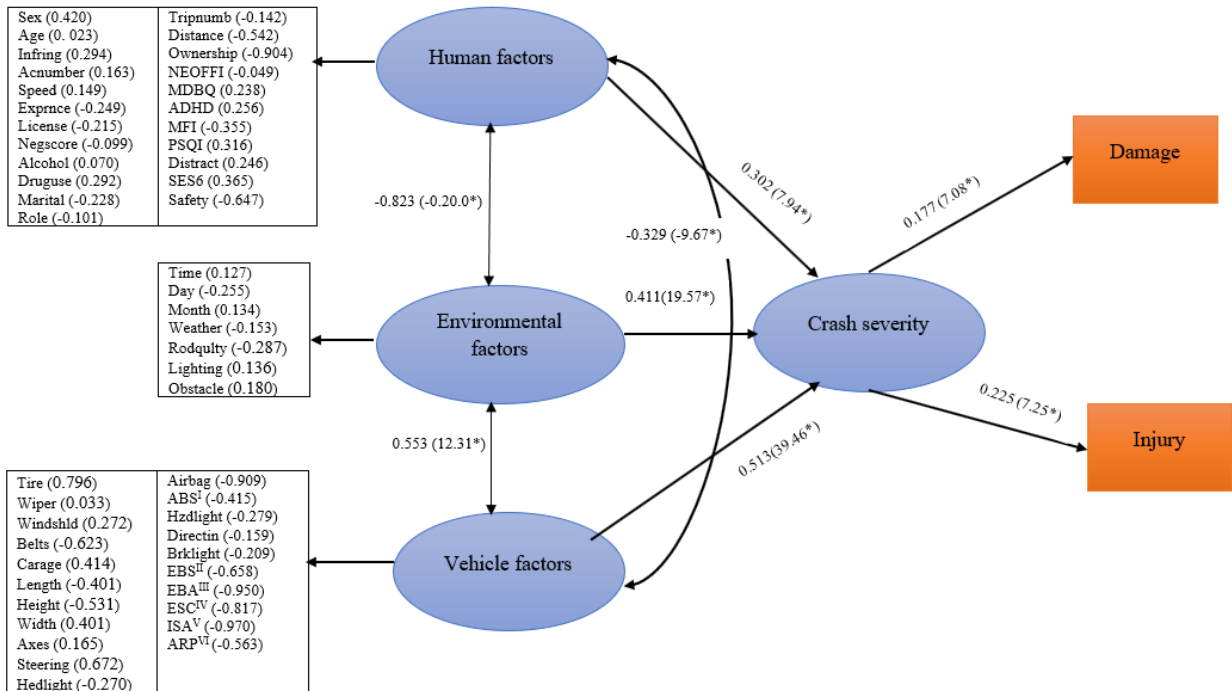
Aras Free Zone



Appendix figure 1 Geographical location of Aras free trade zone



Appendix figure 2 Image of Tabriz-Jolfa road and road police 1



Appendix figure 3 Structured equations model with data of total cars (combination of model 1 and model 2) The numbers on the arrows and those in the parentheses indicate the estimated coefficients and t-value, respectively, and in the component part of the factors, the numbers inside the parentheses represent the estimated coefficients.

I: Anti-lock braking system, II: Electronic braking system, III: Emergency braking assistant, IV: Electronic stability control, V: Intelligent speed adaptation, VI: Active rollover protection