## Shared autonomous vehicle with pooled service, a modal shift approach

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### 9 Abstract

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Dependence on private cars has led to numerous problems, where AVs could be a potential 10 solution. Pooled service, however, could be a much bigger step towards sustainable transportation. 11 This paper presents a modal shift analysis emphasizing socio-economic, travel characteristics and 12 their interaction for a sample of private car users in Tehran. A stated preference survey was 13 designed in 2021 exclusively for the research purposes, and 491 valid questionnaires were 14 gathered. One of the main contributions is considering the impact of the number of persons in 15 shared autonomous vehicle with pooled service (SAVWPS). Estimation results of discrete choice 16 model reveal that, high-income respondents, owning a personal car and being a man decrease the 17 likelihood of modal shift to SAVWPS. A negative impact is also observed for travel time, travel 18 cost, waiting time and number of persons in SAVWPS. A significant systematic heterogeneity is 19 observed in the interaction effect of travel time and dissatisfied respondents with internet taxis due 20 to the pandemic. Considering this taste variation, a lower travel time in SAVs could increase the 21 modal shift likelihood among these travelers. The findings could help transportation decision-22 makers identify the factors affecting modal shift to SAVWPS to achieve a more sustainable 23 24 transportation system.

Keywords: Modal shift behavior, Pooled service, Ridesharing, Shared autonomous vehicle
 (SAV), Stated preference.

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#### 28 **1. Introduction**

29 The increasing rate of car ownership and dependency in metropolises have resulted in numerous problems such as traffic congestion, environmental pollution, higher travel time, an 30 increase in the number of accidents, decreased physical activity, and increased rates of obesity, 31 32 particularly in developing countries [1-4]. Transport sector accounts for 66% of oil consumption and 20% of carbon production and emissions in the European Union [5, 6]. Private cars are the 33 34 most preferred transportation mode in many countries, particularly developing ones, accounting 35 for over 43% of all trips in Iran [7]. According to the National Highway Traffic Safety Administration (NHSTA), human error accounts for 90% of car accidents in the United States and 36 92% in Iran [8]. World Health Organization (WHO) reported that road accidents were the third 37 38 most significant cause of death in Iran in 2019 [9]. Given the challenges associated with the increase in personal car use and the car ownership pattern which is significantly increasing from 39 175 private car per 1000 capita in 2010, and it is estimated to be 679 in 2030 [10], the government 40 and local authorities are seeking sustainable transportation systems to address the above problems 41 42 [1].

With the introduction of autonomous vehicles (AVs) and the rapid advancement in these 43 vehicles over the last few years, many studies showed that issues associated with personal cars 44 will be partly reduced, and AVs will play an essential role in the future transportation system [11]. 45 According to previous studies, AVs could reduce air pollution, fuel consumption, human error-46 related accidents [12, 13]. In the same way, AVs have the capability of changing private car 47 48 ownership, land use patterns, as well as enhancing network capacity and mobility patterns of vulnerable individuals [14]. Despite these potential advantages, several studies indicate that the 49 high level of comfort and convenience in AVs will increase their use, which is counter to 50 51 developing a sustainable transportation system. Moreover, the high cost of AVs' ownership makes their establishment challenging, particularly in developing countries [15]. Using shared 52 autonomous vehicles (SAVs) that integrate AV technology with shared mobility services, such as 53 car-sharing, ride-sharing, and ride-sourcing, not only could address these issues but other aspects 54 of the transportation system can also be enhanced [16]. From sharing approach views, car-sharing 55 and ride-sharing are the most common approach. In car-sharing, a user requests a car for their daily 56 57 needs from an origin to a destination, and it can offer round-trips or one-way services [17-20]. In ride-sharing, on the other hand, users share their travel plans with others, and other people with 58 59 similar origins and destinations join them to share their trips [21-23].

According to previous findings, SVAs will eventually replace many outdated and costly 60 transportation modes [24, 25]. Potential benefits of SAVs show a 50% reduction in traffic volume 61 [1, 26, 27], a 40-50% reduction in travel costs compared to traditional car request services [28-31], 62 an 80% reduction in accident rates and a 40% reduction in fatal accidents [29, 32], an 80% 63 64 reduction in fuel consumption and pollutants compared to personal cars [28, 33, 34], and lower need for parking space [35, 36]. Along with all the potential benefits, some studies have evaluated 65 their imperfections and drawbacks, such as security (due to the use of artificial intelligence in car 66 control), safety, interaction with pedestrians, cyclists, and motorcyclists [37], cleanliness (due to 67 public use), and lack of driver to assist passengers in moving their baggage [11, 38]. 68

69 Considering the acceptance of people and determining their needs are crucial to the 70 successful implementation of any system, this paper aims to determine the explanatory factors 71 such as socio-demographic and travel characteristics of modal shift from private cars to SAVs with

pooled service (SAVWPS) among Tehran residents using a discrete choice model. Using stated 72 preference (SP) questionnaire, private car users in Tehran were asked to declare their willingness 73 to shift to SAVWPS based on different experiments, which consist of four three-level attributes, 74 75 including the number of accompanying persons, travel costs, waiting time, and travel time. After a careful review of the literature, the following research gaps were identified: The majority of 76 previous studies have so far concentrated on AVs, and less attention has been paid to SAVs, 77 particularly SAVWPS, so there is a clear need for more detailed research on SAVWPS. 78 Additionally, most previous studies were conducted in developed countries, and to the best of our 79 knowledge, there is no such study in developing countries. To fill the above research gaps, this 80 paper contributes to the literature by considering the impact of the number of accompanying 81 persons that share their trip on the likelihood of modal shift, which has received less attention in 82 previous studies. 83

This paper is structured as follows: a review of previous studies on SAVs will be discussed in Section 2; survey design and research method will be presented in Methodology section. Estimation results and discussion will be presented in "Data Analysis" section. Finally, the "Conclusions" section provides the paper's conclusion, limitations, and recommendations for future studies.

#### 89 **2.** Literature review

90 This section presents the explanatory factors affecting AV choice. Previous studies have classified the variables affecting the choice of AVs into three categories: 1) socioeconomic 91 92 characteristics, 2) travel characteristics, and 3) attitudinal factors [11, 14, 24, 39, 40]. It is worth noting that due to the difference in geographical location, culture, income, and consumer 93 innovativeness, contradictory findings have been observed. For example, in terms of 94 socioeconomic characteristics, compared with women in Austin, Asmussen et al. [41] found that 95 men are more likely to buy and use AVs due to their higher income. However, Schoettle and Sivak 96 [42] found a reverse relationship in U.S., U.K., and Australia. In terms of age, Asmussen et al. [41] 97 revealed that older adults (over 64 years old) are more likely to use AVs, but Krueger et al. [43] 98 found that older adults are the least likely respondents to choose and use AVs. 99

Many studies have shown that high-educated people are more inclined to use/ purchase AVs due to their familiarity with new technologies [42, 44, 45]. However, Zmud and Sener [46] found no significant association between education level and willingness to use AVs. Household income is another factor affecting AVs' acceptability or purchase. Many studies have found that household income is a vital factor in using/purchasing AVs [47-49]. However, some studies have found contradictory results [46, 50, 51].

106 Although considerable research has examined the determinants behind the choice of AVs, a limited number of papers have addressed this subject in SAVs, especially SAVWPS. Table (1) 107 summarizes previous studies on SAV choice as an emerging transportation mode. According to 108 previous studies, the most critical explanatory factors in choosing SAVs are their operational 109 features, including travel time, waiting time, travel costs, and willingness to share their trip with 110 others [17, 43]. Many studies found that young, men, highly educated, and high-income 111 respondents are more likely to choose SAVs [52, 53]. However, people who occasionally use 112 transit are also less likely to use SAVs [37, 43]. 113

#### < Table (1) >

Based on the literature, the following topics have received very little attention, which we aim to fill and contribute to the literature by: 1) the majority of studies focus on car-sharing services, and less attention has been paid to SAVWPS; 2) most of the prior studies conducted in developed countries and less attention has been paid to this matter in developing countries; 3) Unlike previous studies, the determinants behind the modal shift behavior have been examined using two utility functions including the factors motivating and prohibiting the modal shift from private cars to SAVWPS.

## 123 **3.** Methodology

In this section, firstly, we introduce the stated choice experiment that has been used to collect the stated preferences of respondents (Section 3-1). Moreover, the questionnaire design (Section 3-2) and Choice experiment design (Section 3-3) will be presented, and finally, analysis of the collected data and variables used in the modeling will be addressed (Section 3-4). The research flowchart is also presented by Fig. 1.

130 < Figure 1. >

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## 132 *3.1. Choice experiment design*

In a conjoint survey, a choice set consisting of hypothetical alternatives based on a combination of different attributes of a service or product, presented to respondents and ask their preference about the alternatives [58]. In this research, a stated preference (SP) survey was exclusively designed and administered for determining travelers' preference for a modal shift from private cars to SAVWPS. To collect the SP data, *Epoll*, as an online survey platform with the capability of designing various questions has been used due to the pandemic situation in Iran.

## 139 *3.2. Questionnaire and survey design*

140 The questionnaire consisted of 50 questions in three main sections, of which 18 questions were related to SP scenarios. In the beginning, the survey objective, anonymity, and the 141 confidentiality of responses were claimed to respondents. Therefore, respondents were asked to 142 consider their last trip with private car and answer questions on the departure and ending time, in-143 vehicle time, trip purpose, accident experience during past 5 years, and parking space situation. 144 The logic behind this approach, as also used in most previous studies [43], is that this trip is the 145 most recent trip of the respondents, so fewer invalid or incorrect responses are likely to be given. 146 147 Also, this would reduce bias in responses to the most frequent trips, which are usually mandatory trips taken on a specific schedule. Thus, we have targeted the last trip (and its characteristics) in 148 order to avoid collecting invalid responses and to collect trips with a variety of purposes. Secondly, 149 150 due to the absence of SAVs in Tehran, a short video clip along with SAVWPS operation (Fig. 2) have been designed and shown to respondents to better percept this technology's features. As an 151 152 explanation about the operation of SAVWPS in Figure 1, it should be say that, in section (I), passenger (A) registers an SAV request using his/her mobile phone after choosing the origin and 153 destination of his/her trip. The request will be sent to the main server and after some processing in 154 the data center, the best match SAV will be assigned to him/her. In the meanwhile, in section (II), 155 156 passenger (B) also registers an SAV request with a different origin and destination, which the

previous processes for passenger (A) will be redone. Due to the overlap of the route between 157 passenger (A) and passenger (B), the main server matches their requests and assigns the same SAV 158 to them. Finally, section (III) presents the optimized route for passengers to be served by the same 159 SAV. After the introduction of SAVWPS, we have asked the respondents to declare their level of 160 familiarity with SAVs ranging from "1= not familiar at all" to "4= very familiar and having 161 comprehensive information". Then, the SP scenarios were presented to respondents to determine 162 their willingness to shift to SAVWPS through a dichotomous (yes/no) variable. Finally, socio-163 economic along with household characteristics were asked including gender, age, marital status, 164 education, income, driving experience, household size, and car ownership. 165

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Relation (1) proposed by Cochran [59] was used to determine an adequate sample size.

$$n_0 = \frac{pqz^2}{e^2} \tag{1},$$

< Figure 2. >

167 where,  $n_0$  is the (minimum) adequate sample size, z is the standard error at the considered 168 significance level (1.96 for 5% significance level), e accounts for the acceptable error (5%), p169 represents the proportion of the population that has the attribute in question (share of using car in 170 daily trips which is 43%), and q represents 1-p. Based on this relation, the minimum sample size 171 is 377.

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## 177 *3.3. Stated preference section*

According to travelers' last trip with private car, we have used stated choice experiment to determine users' preferences about the modal shift. Based on four three-level attributes of SAVs including travel time, travel cost, waiting time, and number of persons inside SAVs, 18 orthogonal scenarios were designed. The levels of considered attributes are presented in Table 2. It should be noted that based on previous studies, we have selected several levels for each attribute and in light of the pilot study results, we have customized the levels in accordance with our context.

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#### 185

#### < Table (2) >

Considering time limitations and preventing respondents' confusion, a fractional factorial 186 design (FFD) approach was used to design scenarios. Moreover, the choice experiments were 187 divided into three six-scenario blocks and presented to each respondent randomly, and their 188 willingness to shift toward SAVWPS was asked (Table 3). Concerning the randomness of 189 presenting each scenario to respondents, we should mention that the survey platform had the 190 capability of presenting the scenarios equally and randomly. In order to ensure that all three six-191 scenario blocks scenarios have been sufficiently distributed, we continuously monitor the share of 192 each block. Finally, the distribution of first, second, and third block is 35%, 35%, and 30%, 193 respectively. 194

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< Table (3) >

#### *3.4. Featuring the selected sample*

198 The designed survey was distributed online in Tehran for two months due to the pandemic from August 2021. Through different social media platforms (Telegram, Instagram, Twitter, 199 Facebook, etc.), we have asked administrators of popular channels and groups to place the 200 questionnaire. Using some incentives, we have motivated the members of channels and groups to 201 respond to our survey. Considering the research objectives, private car users were only eligible to 202 203 respond to the questionnaire. Before the main survey, 30 questionnaires were filled out as a pilot 204 to check the clearness of the questions. After removing the incomplete and invalid responses, 491 valid questionnaires were used for modelling purposes. Descriptive analysis of individuals' 205 sociodemographic characteristics (Table 4) shows that 306 (66.56%) respondents were men, while 206 207 the remaining 164 (33.40%) were women. Approximately half (51.52%) of responses were gathered from persons aged 25 to 34. Due to the fact that this survey was conducted online, our 208 sample is partly limited to respondents who are younger, especially those who have a social media 209 account. In order to reduce the possibility of sampling bias, we have distributed our survey to a 210 variety of groups and channels in order to improve its visibility among respondents. Regarding 211 marital status, 327 respondents (66.59 %) were single, while 164 (33.4%) were married. According 212 213 to the respondents' educational level, 240 (48.87%) have a master's degree. According to the respondent's car ownership level, 240 (48.87%) persons own at most a car. Regarding the number 214 of driving licenses in the household, 175 (35.63%) responses belong to households with at most 215 one driving license, and 186 (37.88%) respondents have 0 to 5 years of driving experience. Finally, 216 the majority of respondents, 203 (41.34%), stated they are middle-income. 217

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#### **<Table** (4) **>**

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Stated modal shift behavior of respondents is shown based on their socioeconomic 220 221 characteristics, familiarity with SAVs, and travel-related attributes (Figure 3). As it can be seen, female have a higher tendency to modal shift which it might be due to their lower income and car 222 ownership level compared with men. Regarding the accident experience, it can be concluded that 223 there is no significant difference between the related cohorts. It is due to the fact that respondents 224 who did not experience any accidents are more confident about their driving skills while people 225 with any experience in accidents are concerned of SAVs' safety. Increasing the mobility is one the 226 227 potential advantages of SAVs which enhance the mobility of people who do not have a driving license, people with disabilities and elderlies. Hence, considering the driving license status, we can 228 see that respondents without driving license are more inclined to shift to SAVs. Regarding age, it 229 can be seen that people aged less than 24 years are the most inclined group among different age 230 categories to shift to SAVs due to their higher technology awareness. While, people aged more 231 than 45 are the least inclined to modal shift to SAVs. Due to the high car dependency and 232 ownership in Iran, as a developing county, we can see that as the car ownership increases, people 233 are also less likely to shift to SAVs. Furthermore, a similar behavior is also found about income 234 levels which shows that high-income respondents have a lower tendency to shift to SAVs and 235 consist on using their private cars. As an interesting finding, increasing the familiarity with SAVs 236 is accompany with higher likelihood of modal shift to SAVs. It is due to the fact that respondents 237 who have more information about SAVs' operation could better trust in SAVs. Considering the 238 travel-related attributes (i.e. travel time, travel cost, waiting time, and number of person), as each 239 240 of these factors increases, the likelihood of modal shift to SAVs decreases. In addition, we explore

how travel-related attributes influence the modal shift preferences of individuals based on their 241 socioeconomic characteristics, specifically income levels. By comparing the shifting behavior of 242 low-income and high-income respondents (Figure 4), we shed light on the modal shift preference 243 of a specific respondents. Regarding waiting time, respondents generally exhibit reluctance to shift 244 to SAVs as waiting time increases. However, low-income individuals appear less sensitive to this 245 factor, maintaining a consistent preference for SAVs even with extended waiting times. As high-246 income participants have a higher value of time (VOT), their modal shift preference to SAVs 247 significantly reduces as SAVs' travel time increases. In contrast, low-income individuals remain 248 less sensitive to travel time variations. The importance of travel cost is pronounced among low-249 income respondents. As SAV travel costs rise, their modal shift preference decreases significantly. 250 In contrast, higher-income individuals prioritize comfort and privacy over cost considerations. 251 Furthermore, as the number of people sharing SAV rides increases, high-income individuals 252 exhibit a substantial decline in modal shift preference, while lower-income respondents are less 253 affected by this factor. 254

256 < Figure 3. > 257 258 < Figure 4. > 259

260 **4. Estimation result** 

Considering the research objectives, we have determined the most substantial 261 explanatory factors in shifting and not shifting from private cars to SAVWPS. The dependent 262 263 variable is the likelihood of modal shift from private cars to SAVs. Independent variables include socio-demographic characteristics (such as age, gender, marital status, household car 264 ownership, and driving license) and travel characteristics (such as departure time, travel time, 265 waiting time, travel costs, and number of accompanying person in SAV). The examined factors 266 which are investigated the explanatory factors of modal shift behavior among private car users 267 in Tehran are presented in Table 5. 268

< Table (5) >

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#### 271 *4.1. Discussion*

After calibration of about 200 binary logit models in Nlogit, Table 6 presents the estimated 272 parameters for the best fit model along with significance level, t-test and marginal effect. The t-273 274 values show that most estimated coefficients are significant at 95% confidence level. The interaction variables have also been used to investigate the systematic heterogeneity among 275 respondents. Also, to facilitate the successful policymaking and implementation of SAVs, the 276 factors contributing to the modal shift behavior have been estimated separately in two utility 277 functions. The positive and significant coefficient of passenger variable ( $\beta$ : 0.264, p-value: 0.006) 278 indicates the higher likelihood of no modal shift. In other words, if a respondent is a driver, she 279 (he) will be less likely to persist in using her (his) private car and shift to SAVs. One of the reasons 280

for this matter is that drivers can experience a more productive trip by doing other activities than 281 driving, which is in line with previous studies [60]. The negative and significant coefficient for 282 users without car ownership ( $\beta$ : - 0.407, p-value: 0.000) indicates the lower likelihood of no modal 283 shift to SAVs. It can be concluded that the lack of private car ownership will increase the likelihood 284 of modal shift to SAVs. It is due to the fact that in accordance with the findings of Dicianno et al. 285 [14] and Yuen et al. [53], SAVs will increase the mobility of individuals who do not own a private 286 car, elderlies, people aged under 18, and disabled which increase the likelihood of choosing AVs 287 and SAVs. Given the high level of car ownership and dependency in Iran, the estimated parameter 288 for INCNPS 1 (β: 0.194, p-value: 0.000) indicates that by increasing the income, even if 289 respondents share their trip with another person in SAVs, their willingness to persist in the current 290 travel mode is increased and the likelihood of modal shift to SAVs is reduced, which is aligned 291 with the findings of Bansal and Kockelman [47], Kyriakidis et al. [48], and Howard and Dai [49]. 292 Regarding gender, female respondents ( $\beta$ : - 0.272, p-value: 0.001) are less likely to do not modal 293 shift. Considering the lower level of income and car ownership among women compared with 294 men, they are more inclined to modal shift to SAVs, which is in line with Yuen et al.[53] and 295 Aboutorabi Kashani et al. [61] findings. The positive and significant coefficient of the interactive 296 297 variable (INC 3TTM) indicates the systematic heterogeneity among middle-income persons in perceiving the impact of private car travel time. It can be concluded that by reducing private car 298 travel time among people with average income ( $\beta$ : 0.743, p-value: 0.026), the likelihood of modal 299 300 shift to SAVs decreases and this income group are more sensitive to private car travel time. Increasing household car ownership level among respondents who use private parking ( $\beta$ : 0.200, 301 p-value: 0.060) is positively associated with the probability of keeping on using private cars and 302 decreases the likelihood of modal shift to SAVs. High level of car ownership and presence of free 303 parking in Tehran has led to a high dependency upon private cars and a reduction in the willingness 304 to use public transportation [62]. Hence, as an implication for policy and practice, it is 305 recommended to implement some travel demand management policies such as parking 306 management and congestion pricing to reduce private car desirability. Considering the potential 307 benefits of SAVs in reducing accidents due to human errors, respondents who experienced more 308 than two accidents during 5 past years ( $\beta$ : 0.417, p-value: 0.067) are more likely to shift to SAVs. 309 This significant finding is in accordance with Singh [63] results. A two-minute waiting time for 310 SAVs ( $\beta$ : - 0.279, p-value: 0.000) is negatively associated with modal shift to SAVs, which is in 311 line with Lokhandwala and Cai [21] findings. The positive and significant impact of TTSMCOV 312  $(\beta: 17.189, p-value: 0.015)$  indicates that as the travel time in SAVs decreases, the likelihood of 313 modal shift to SAVs will increase among respondents who are less likely to use internet taxis due 314 to pandemic situation. Hence, reducing SAVs' travel time is recommended by implementing 315 policies such as using dedicated lanes at least during pandemics, which will increase the likelihood 316 of sharing attitudes among these groups. The positive and significant coefficient of PHD\_TTSM 317 reveals the systematic heterogeneity among respondents ( $\beta$ : 7.598, p-value: 0.072), showing that 318 respondents with a Ph.D. degree are more sensitive to travel time in SAVs. In other words, these 319 persons are more likely to modal shift from private cars to SAVs if the travel time in SAVs 320 decreases by implementing such recommended policies in previous lines. Finally, the negative and 321 significant estimated parameter for (TCSSSIN\_3) shows that middle-income individuals ( $\beta$ : -322 0.139, p-value: 0.000) are more sensitive to SAVs' travel cost. It can be concluded that as the 323 travel cost by SAVs increases, the likelihood of modal shift among middle-income respondents 324 325 will decrease.

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< Table (6) >

### 327 *4.2.Implications for policy and practice*

328 Several implications for policy and practice are presented in this section within the context 329 of some variables, with the aim of increasing the likelihood of modal shift to SAVs.

330 Concerning the significant effect of NACDR\_2 variable, it should be mentioned that it is essential for authorities to build trust among their potential users. It is, therefore, imperative to 331 ensure the safety of this technology. As a result of continuous monitoring of SAVs, constant checks 332 to prevent potential defects, and the presence of cameras and operators inside the vehicle, people's 333 334 concerns are reduced and trust is formed. Moreover, it is recommended to report the potential benefits of SAVs such as reduction in the number of accidents in all possible media channels, such 335 336 as social media and mass media. Based on the positive and significant effect of TTSMCOV, it is recommended to use enhanced air conditioning systems in SAVs, regular disinfection, and 337 establishing dedicated lanes, at least, during pandemics to decrease SAVs' travel time, which will 338 increase the likelihood of sharing attitudes among these groups. 339

Concerning the impact of TCSSIN\_3 and PhD\_TTSM, it is recommended that service 340 341 providers suggest passengers with the option of selecting the preferred number of people to share the trip at various levels of travel cost to better adjust with their income and value of time. Due to 342 the negative impact of PASSEN on willingness to shift to SAVs, it can be suggested to increase 343 the awareness of individuals about the potential benefits of SAVs such as the possibility of having 344 more productive and effective trip through conducting other activities rather than driving in SAVs. 345 Considering the positive effect of CarOwn0 and NCAR\_FP on the willingness to shift to SAVs, it 346 is recommended to implement travel demand management (TDM) policies [64] to decrease 347 dependence on private cars and encourage car users to use SAVs, such as increasing taxation and 348 related costs of households' additional cars as well as congestion pricing and parking management. 349

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## **5.** Conclusions and future suggesting for further studies

352 As an emerging sustainable transportation system, shared autonomous vehicles (SAVs) have significant potential advantages such as increasing travel convenience, reducing accidents 353 354 and death rates and reducing pollutant emissions [65, 66]. Besides their numerous benefits, there 355 are many concerns about using this technology. Hence, understanding potential user's motivations and preferences for using these vehicles will be critical to their successful implementation, 356 especially in developing countries due to the capital investment limitation and high level of car 357 358 ownership and dependency [67]. After reviewing the literature, it was found that there is a further need to examine the factors affecting the modal shift behavior to SAVs with pooled services 359 (SAVWPS), particularly in developing countries because to the best of authors' knowledge, this 360 study is the first study about SAVWPS in Iran and previous studies have paid less attention to this 361 topic. This paper aims to examine the effect of socioeconomic and travel characteristics on modal 362 shift behavior of private car users in Tehran using discrete choice model. 363

Based on a questionnaire designed exclusively for the purpose of this research, 2946 valid observations (491 valid questionnaires) gathered during August–September, 2021. The survey consisted of three main sections including: respondents' last trip characteristics with private car, stated preference scenarios, and demographic characteristics. Respondents' modal shift likelihood was studied based on four three-level attributes of stated preference scenarios including traveltime, travel costs, waiting time, and number of people who share their trip inside SAVs.

Findings indicate the significant influence of different socioeconomic and travel 370 characteristics as well as their interactions on shifting trips from private cars to SAVWPS. In terms 371 of socioeconomic characteristics, the lack of car ownership and being female are positively 372 associated with the likelihood of modal shift to SAVWPS. Concerning respondents' income, a 373 374 systematic heterogeneity has been observed that shows by increasing the income, the likelihood of 375 modal shift decreases among individuals who share their travel with another person. Furthermore, middle-income individuals are more sensitive to travel cost of SAVWPS, and as the travel cost 376 increases, the likelihood of modal shift among these individuals will decrease. Regarding travel 377 378 characteristics in SAVWPS, travel time, travel costs, waiting time, and the number of passenger inside SAVWPS significantly affect the modal shift behavior individually or as an interaction 379 variable with other factors. The findings suggested a reduction in the likelihood of modal shift to 380 SAVWPS when each variable was increased. Furthermore, by reducing SAVWPS' travel time, the 381 probability of modal shift reduces among persons who hold a PhD degree, and who are less likely 382 to use internet taxis due to pandemic situation. Based on the sensitivity analysis using marginal 383 effect, it was concluded that reduction in private car travel time among middle-income persons has 384 the most negative impact on modal shift to SAVWPS. However, reducing SAVWPS' travel time 385 has the most positive impact on modal shift among individuals who are dissatisfied with internet 386 taxis due to COVID-19. As a result, the probability of modal shift from private cars to SAVWPS 387 will increase through the increasing travel cost and travel time of private cars and allowing 388 SAVWPS to be used in dedicated lanes. 389

There are limitations in this study, as well. We have asked respondents' willingness to shift 390 391 to SAVWPS based on a binary scale (due to the complete lack of SAVs in Iran), where a Likert scale could be a more precise identification of their willingness to shift to SAVWPS. This research 392 was conducted during the pandemic, a post pandemic survey could be another suggestion for 393 394 further studies to investigate respondents' preferences when ridesharing would be more probable. Systematic heterogeneity of respondents has been investigated in this paper (for example effect of 395 SAV's travel cost and income, education and travel time in SAVs). Random heterogeneity using 396 397 mixed logit model could also be another topic for identifying and extracting the source of random heterogeneity. 398

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401 Data available on request due to privacy/ethical restrictions.

402

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- 409 Authors have no conflict of interest to declare.
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#### 411 **References**

- 412 [1] Abbasi M, Piccioni C, Sierpiński G, et al. "Analysis of Crash Severity of Texas Two Lane Rural Roads Using
- 413 Solar Altitude Angle Based Lighting Condition." *Sustainability*, **14**(3), pp. 1692 (2022). 414 https://doi.org/10.3390/su14031692.
- [2] Salvo D, Garcia L, Reis RS, et al. "Physical activity promotion and the United Nations Sustainable
  Development Goals: Building synergies to maximize impact." *Journal of Physical Activity and Health*, **18**(10), pp. 1163-1180 (2021). https://doi.org/10.1123/jpah.2021-0413.
- 418 [3] Abbasi M, Hosseinlou MH, JafarzadehFadaki S. "An investigation of Bus Rapid Transit System (BRT)
- based on economic and air pollution analysis (Tehran, Iran)." *Case Studies on Transport Policy*, 8(2), pp.
  553-563 (2020). https://doi.org/10.1016/j.cstp.2019.11.008.
- 421 [4] Karami A, Hadji Hosseinlou M, Abbasi MH, et al. "Priority order for improvement of intersections using
- pedestrian crash prediction model." *International journal of transportation engineering*, **7**(3), pp. 297-313
  (2020). https://doi.org/10.22119/IJTE.2019.173352.1463
- 424 [5] Heinold A, Meisel F. "Emission rates of intermodal rail/road and road-only transportation in Europe: A
- 425 comprehensive simulation study." *Transportation Research Part D: Transport and Environment*, **65**, pp.
  421-437 (2018). https://doi.org/10.1016/j.trd.2018.09.003.
- 427 [6] Todts W. "CO2 emissions from cars: The facts." *European Federation for Transport and Environment* 428 *AISBL: Brussels, Belgium,* (2018).
- 429 [7] Municipality T. Annual Report of Tehran. Retrieved from. <u>http://tmicto.tehran.ir/</u>. 2019.
- [8] Singh S. Critical reasons for crashes investigated in the national motor vehicle crash causation survey.
  Washington, DC2015. p. 2.
- 432 [9] World Health Organization W. WHO global report on Road Traffic Injuries 2019: World Health433 Organization; 2019.
- 434 [10] Shaygan M, Mamdoohi A, Masoumi HE. "Car ownership models in Iran: a review of methods and
- 435 determinants." *Transport and Telecommunication*, **18**(1), pp. 45 (2017). https://doi.org/10.1515/ttj-2017-436 0005.
- 437 [11] Litman T. "Autonomous vehicle implementation predictions: Implications for transport planning."
  438 (2020). https://doi.org/10.1016/s2543-0009(20)x0002-3.
- 439 [12] Kalra N, Groves DG. The enemy of good: Estimating the cost of waiting for nearly perfect automated
  440 vehicles: Rand Corporation; 2017. https://doi.org/10.7249/rr2150.
- 441 [13] Martínez-Díaz M, Soriguera F, Pérez I. "Autonomous driving: a bird's eye view." *IET intelligent* 442 *transport systems*, **13**(4), pp. 563-579 (2019). https://doi.org/10.1049/iet-its.2018.5061.
- [14] Dicianno BE, Sivakanthan S, Sundaram SA, et al. "Systematic review: Automated vehicles and services
  for people with disabilities." *Neuroscience Letters*, **761**, p. 136103 (2021).
  https://doi.org/10.1016/j.neulet.2021.136103.
- 446 [15] Litman T. Autonomous vehicle implementation predictions: Victoria Transport Policy Institute 447 Victoria, BC, Canada; 2017.
- 448 [16] Aboutorabi Kashani M, Kamyab S, Mamdoohi AR, et al. "What Makes Parents Consider Shared
- 449 Autonomous Vehicles as a School Travel Mode?." Sustainability, 15(23), pp. 16180 (2023).
- 450 https://doi.org/10.3390/su152316180.

451 [17] Zhou F, Zheng Z, Whitehead J, et al. "Preference heterogeneity in mode choice for car-sharing and

452 shared automated vehicles." Transportation Research Part A: Policy and Practice, 132, pp. 633-650 (2020). 453 https://doi.org/10.1016/j.tra.2019.12.004.

454 [18] Winter K, Cats O, Martens K, et al. "Identifying user classes for shared and automated mobility

455 services." European Transport Research Review, 12(1), pp. 1-11 (2020). https://doi.org/10.1186/s12544-

456 020-00420-y.

457 [19] Stoiber T, Schubert I, Hoerler R, et al. "Will consumers prefer shared and pooled-use autonomous vehicles? A stated choice experiment with Swiss households." Transportation Research Part D: Transport 458 459 and Environment, **71**, pp. 265-282 (2019). https://doi.org/10.1016/j.trd.2018.12.019.

460 [20] Ali Aden W, Zheng J, Ullah I, et al. "Public preferences towards car sharing service: the case of

461 Djibouti." Frontiers in Environmental Science, pp. 449 (2022). https://doi.org/10.3389/fenvs.2022.889453.

462 [21] Lokhandwala M, Cai H. "Understanding the impact of heterogeneous rider preferences on a shared 463 autonomous vehicle system." Transportation Research Part F: Traffic Psychology and Behaviour, 75, pp.

464 120-133 (2020). https://doi.org/10.1016/j.trf.2020.09.017.

465 [22] Gurumurthy KM, Kockelman KM, Simoni MD. "Benefits and costs of ride-sharing in shared automated vehicles across Austin, Texas: Opportunities for congestion pricing." Transportation Research Record, 466 467 **2673**(6), pp. 548-556 (2019). https://doi.org/10.1177/0361198119850785.

468 [23] Fagnant DJ, Kockelman KM. "Dynamic ride-sharing and fleet sizing for a system of shared autonomous vehicles in Austin, Texas." Transportation, 45(1), pp. 143-158 (2018). https://doi.org/10.1007/s11116-469 470 016-9729-z.

471 [24] Narayanan S, Chaniotakis E, Antoniou C. "Shared autonomous vehicle services: A comprehensive

472 review." Transportation Research Part C: Emerging Technologies, 111, pp. 255-293 (2020). 473 https://doi.org/10.1016/j.trc.2019.12.008.

474 [25] Shen Y, Zhang H, Zhao J. "Integrating shared autonomous vehicle in public transportation system: A

475 supply-side simulation of the first-mile service in Singapore." Transportation Research Part A: Policy and 476 *Practice*, **113**, pp. 125-136 (2018). https://doi.org/10.1016/j.tra.2018.04.004.

477 [26] Alazzawi S, Hummel M, Kordt P, et al. "Simulating the impact of shared, autonomous vehicles on urban mobility-a case study of Milan." EPiC Series in Engineering, 2, pp. 94-110 (2018). 478

479 https://doi.org/10.29007/2n4h.

480 [27] Martinez LM, Viegas JM. "Assessing the impacts of deploying a shared self-driving urban mobility 481 system: An agent-based model applied to the city of Lisbon, Portugal." International Journal of 482 Transportation Science and Technology, **6**(1), 13-27 (2017). pp. 483 https://doi.org/10.1016/j.ijtst.2017.05.005.

484 [28] Bauer GS, Greenblatt JB, Gerke BF. "Cost, energy, and environmental impact of automated electric 485 taxi fleets in Manhattan." Environmental science & technology, 52(8), pp. 4920-4928 (2018). 486 https://doi.org/10.1021/acs.est.7b04732.

487 [29] Keeney T. "Mobility-as-a-service: Why self-driving cars could change everything." ARK Investment Management Research, (2017). 488

489 [30] Chen TD, Kockelman KM. "Management of a shared autonomous electric vehicle fleet: Implications pricing 490 of schemes." Transportation Research Record, **2572**(1), pp. 37-46 (2016). 491 https://doi.org/10.3141/2572-05.

492 [31] Corwin S, Vitale J, Kelly E, et al. "The future of mobility: How transportation technology and social 493 а business ecosystem." Pobrane z: www2 trends are creating new deloitte 494 com/content/dam/Deloitte/br/Documents/manufacturing/Future of mobility pdf (1209 2017), (2015).

495

[32] Fagnant DJ, Kockelman K. "Preparing a nation for autonomous vehicles: opportunities, barriers and policy recommendations." Transportation Research Part A: Policy and Practice, 77, pp. 167-181 (2015). 496

497 https://doi.org/10.1016/j.tra.2015.04.003. 498 [33] Fulton L, Mason J, Meroux ID. "Three Revolutions in Urban." UC Davis Institute for Transportation &
499 Development Policy, (2017). https://doi.org/10.1016/j.joule.2018.03.005.

500 [34] Fagnant DJ, Kockelman KM. "The travel and environmental implications of shared autonomous
501 vehicles, using agent-based model scenarios." *Transportation Research Part C: Emerging Technologies*,
502 **40**, pp. 1-13 (2014). https://doi.org/10.1016/j.trc.2013.12.001.

503 [35] Kumakoshi Y, Hanabusa H, Oguchi T. "Impacts of shared autonomous vehicles: Tradeoff between 504 parking demand reduction and congestion increase." *Transportation Research Interdisciplinary* 505 *Perspectives*, **12**, pp. 100482 (2021). https://doi.org/10.1016/j.trip.2021.100482.

- [36] Kondor D, Zhang H, Tachet R, et al. "Estimating savings in parking demand using shared vehicles for
   home–work commuting." *IEEE Transactions on Intelligent Transportation Systems*, **20**(8), pp. 2903-2912
   (2018). https://doi.org/10.1109/tits.2018.2869085
- [37] Haboucha CJ, Ishaq R, Shiftan Y. "User preferences regarding autonomous vehicles." *Transportation Research Part C: Emerging Technologies*, **78**, pp. 37-49 (2017). https://doi.org/10.1016/j.trc.2017.01.010.
- 511 [38] Overtoom I, Correia G, Huang Y, et al. "Assessing the impacts of shared autonomous vehicles on
- 512 congestion and curb use: A traffic simulation study in The Hague, Netherlands." *International journal of*
- 513 transportation science and technology, **9**(3), pp. 195-206 (2020).
- 514 https://doi.org/10.1016/j.ijtst.2020.03.009.
- [39] Golbabaei F, Yigitcanlar T, Paz A, et al. "Individual predictors of autonomous vehicle public acceptance
- and intention to use: A systematic review of the literature." Journal of Open Innovation: Technology,
- 517 *Market, and Complexity*, **6**(4), pp. 106 (2020). https://doi.org/10.3390/joitmc6040106.
- 518 [40] Bansal P, Kockelman K, Singh A. "Assessing public opinions of and interest in new vehicle technologies:
- 519 An Austin perspective." *Transportation Research Part C: Emerging Technologies*, **67**, pp. 1-14 (2016). 520 https://doi.org/10.1016/j.trc.2016.01.019.
- 521 [41] Asmussen KE, Mondal A, Bhat CR. "A socio-technical model of autonomous vehicle adoption using
- ranked choice stated preference data." *Transportation Research Part C: Emerging Technologies*, **121**, pp.
  102835 (2020). https://doi.org/10.1016/j.trc.2020.102835.
- 524 [42] Schoettle B, Sivak M. A survey of public opinion about autonomous and self-driving vehicles in the
- 525 US, the UK, and Australia. University of Michigan, Ann Arbor, Transportation Research Institute; 2014. 526 https://doi.org/10.1109/iccve.2014.7297637.
- 527 [43] Krueger R, Rashidi TH, Rose JM. "Preferences for shared autonomous vehicles." *Transportation* 528 *research part C: emerging technologies*, **69**, pp. 343-355 (2016). https://doi.org/10.1016/j.trc.2016.06.015
- 529[44] Pettigrew S, Worrall C, Talati Z, et al. "Dimensions of attitudes to autonomous vehicles." Urban,530PlanningandTransportResearch,7(1),pp.19-33(2019).
- 531 https://doi.org/10.1080/21650020.2019.1604155.
- [45] Liu H, Yang R, Wang L, et al. "Evaluating initial public acceptance of highly and fully autonomous
  vehicles." *International Journal of Human–Computer Interaction*, **35**(11), pp. 919-931 (2019).
  https://doi.org/10.1080/10447318.2018.1561791.
- [46] Zmud JP, Sener IN. "Towards an understanding of the travel behavior impact of autonomous
  vehicles." *Transportation research procedia*, **25**, pp. 2500-2519 (2017).
  https://doi.org/10.1016/j.trpro.2017.05.281.
- 538 [47] Bansal P, Kockelman KM. "Are we ready to embrace connected and self-driving vehicles? A case study
- 539 of Texans." *Transportation*, **45**(2), pp. 641-675 (2018). https://doi.org/10.1007/s11116-016-9745-z.
- 540 [48] Kyriakidis M, Happee R, de Winter JC. "Public opinion on automated driving: Results of an
- 541 international questionnaire among 5000 respondents." *Transportation research part F: traffic psychology*
- 542 *and behaviour*, **32**, pp. 127-140 (2015). https://doi.org/10.1016/j.trf.2015.04.014.
- 543 [49] Howard D, Dai D. Public perceptions of self-driving cars: The case of Berkeley, California.
- 544 Transportation research board 93rd annual meeting: The National Academies of Sciences, Engineering, 545 and Medicine Washington, DC; 2014. pp. 1-16. https://doi.org/10.17226/13765.

- 546 [50] Nordhoff S, De Winter J, Kyriakidis M, et al. "Acceptance of driverless vehicles: Results from a large 547 cross-national questionnaire study." *Journal of Advanced Transportation*, **2018**, (2018).
- 548 https://doi.org/10.1155/2018/5382192.
- 549 [51] Becker F, Axhausen KW. "Literature review on surveys investigating the acceptance of automated 550 vehicles." *Transportation*, **44**(6), pp. 1293-1306 (2017). https://doi.org/10.1007/s1116-017-9808-9.
- 551 [52] Wang S, Jiang Z, Noland RB, et al. "Attitudes towards privately-owned and shared autonomous
- vehicles." Transportation research part F: traffic psychology and behaviour, **72**, pp. 297-306 (2020).
- 553 https://doi.org/10.1016/j.trf.2020.05.014.
- [53] Yuen KF, Huyen DTK, Wang X, et al. "Factors influencing the adoption of shared autonomous
  vehicles." *International journal of environmental research and public health*, **17**(13), pp. 4868 (2020).
  https://doi.org/10.3390/ijerph17134868.
- 557 [54] Maeng K, Cho Y. "Who will want to use shared autonomous vehicle service and how much? A 558 consumer experiment in South Korea." *Travel Behaviour and Society*, **26**, pp. 9-17 (2022). 559 https://doi.org/10.1016/j.tbs.2021.08.001.
- 560 [55] Tian Z, Feng T, Timmermans HJ, et al. "Using autonomous vehicles or shared cars? Results of a stated
- 561 choice experiment." *Transportation Research Part C: Emerging Technologies*, **128**, pp. 103117 (2021).
  562 https://doi.org/10.1016/j.trc.2021.103117.
- [56] Wang Z, Safdar M, Zhong S, et al. "Public preferences of shared autonomous vehicles in developing
  countries: a cross-national study of Pakistan and China." *Journal of Advanced Transportation*, 2021,
  (2021). https://doi.org/10.1155/2021/5141798.
- [57] Menon N, Barbour N, Zhang Y, et al. "Shared autonomous vehicles and their potential impacts on
   household vehicle ownership: An exploratory empirical assessment." *International Journal of Sustainable Transportation*, **13**(2), pp. 111-122 (2019). https://doi.org/10.1080/15568318.2018.1443178.
- 569 [58] Green PE, Srinivasan V. "Conjoint analysis in consumer research: issues and outlook." *Journal of* 570 *consumer research*, **5**(2), pp. 103-123 (1978). https://doi.org/10.1086/208721
- 571 [59] Cochran WG. Sampling techniques: John Wiley & Sons; 1977.
- 572 [60] Clements LM, Kockelman KM. "Economic effects of automated vehicles." *Transportation Research* 573 *Record*, **2606**(1), pp. 106-114 (2017). https://doi.org/10.3141/2606-14.
- [61] Aboutorabi Kashani M, Abbasi M, Mamdoohi AR, et al. "The Role of Attitude, Travel-Related, and
  Socioeconomic Characteristics in Modal Shift to Shared Autonomous Vehicles with Ride Sharing." *World Electric Vehicle Journal*, 14(1), pp. 23 (2023). https://doi.org/10.3390/wevj14010023.
- 577 [62] Abbasi M, Hadji Hosseinlou M. "Assessing feasibility of overnight-charging electric bus in a real-world
- 578 BRT system in the context of a developing country." *Scientia Iranica*, **29**(6), pp. 2968-2978 (2022). 579 https://doi.org/10.24200/sci.2022.58461.5735.
- 580 [63] Singh S. Critical reasons for crashes investigated in the national motor vehicle crash causation survey.581 2015.
- 582 [64] Macioszek E, Karami A, Farzin I, et al. "The Effect of Distance Intervals on Walking Likelihood in 583 Different Trip Purposes." *Sustainability*, **14**(6), pp. 3406 (2022). https://doi.org/10.3390/su14063406.
- [65] Abbasi M, Mamdoohi AR, Sierpiński G, et al. "Usage Intention of Shared Autonomous Vehicles with
  Dynamic Ride Sharing on Long-Distance Trips." *Sustainability*, **15**(2), pp. 1649 (2023).
  https://doi.org/10.3390/su15021649.
- [66] Farzin I, Mamdoohi AR, Abbasi M, et al. "Determinants behind the acceptance of autonomous
  vehicles in mandatory and optional trips." *Proceedings of the Institution of Civil Engineers-Engineering Sustainability: Emerald Publishing Limited*; 2023. pp. 1-10. https://doi.org/10.1680/jensu.23.00023.
- 590 [67] Farzin I, Abbasi M, Macioszek E, et al. "Moving toward a More Sustainable Autonomous Mobility, 591 Case of Heterogeneity in Preferences." *Sustainability*, **15**(1), pp. 460 (2023).
- 592 https://doi.org/10.3390/su15010460



Figure 1. The research flowchart





Figure 2. An example of pooled service operation







Figure 4. Comparing the modal shift preference of low-income and high-income participants based on four main travel-related attributes

Authors	Variables	Key Findings
Maeng and Cho [54]	Autonomous driving level, pickup and delivery service, liability for accidents, waiting time after booking, monthly household income, fuel cost per month, gender, age, education.	<ul> <li>Negative effect of waiting time on the likelihood of choosing SAVs.</li> <li>Negative influence of service fee (perhour) on the likelihood of choosing SAVs.</li> <li>Derive different findings based on the interactive effect of socioeconomic characteristics and other variables.</li> </ul>
Tian et al. [55]	Travel cost, waiting time, car availability, using laptop, household size education level, gender, age, and income.	<ul> <li>Higher willingness of individuals t purchase privately owned AVs rather than using SAVs.</li> <li>More inclination of respondents to d other activities while using SAVs.</li> <li>Higher willingness of younger respondents to use SAV.</li> </ul>
Wang et al. [56]	Travel distance, travel time, waiting time, travel cost, gender, income, education, age.	<ul> <li>Higher willingness of respondent from Dalian to shift from private ca to SAV.</li> <li>Critical role of travel time, waitin time, and travel costs.</li> <li>Higher willingness of high-educate and high-income respondents from Pakistan to use SAV.</li> </ul>
Winter et al. [18]	Travel time, waiting time, travel cost, parking cost, travel time to station, finding a park, gender, income, education, age.	<ul> <li>Higher interest of car- and transit users in using SAVs.</li> <li>Higher impact of travel time, high education, and being young on use of SAVs.</li> </ul>
Menon et al. [57]	Gender, income, daily travel time, household size, household car ownership, and number of accidents.	• Positive effect of high-education accident experience, and men single car owners on using SAV.
Krueger et al. [43]	Travel time, waiting time, travel costs, travel time, gender, age, and weekly income.	<ul> <li>Younger individuals as the mon- likely users of SAVs.</li> <li>The vital impact of travel time waiting time, and travel cost of choosing SAVs.</li> </ul>

611 Table (1) - A brief review of a selection of researches on users' willingness to choose/use SAVs

## Table (2) – Levels of attributes SAVs in this research

## 

A 44	levels			
Attributes	1	2	3	
Travel time change (%)	0	+ 15%	+ 25%	
Travel cost (IRR per 5 min)	10,000	15,000	20,000	
Waiting time (min)	2	5	8	
Number of persons in SAV	1	2	3	

Travel Time	Travel Cost (Iranian Rial)	Waiting Time (minutes)	Number of person	Would you like to modal shift to SAV?	
(minutes)			in SAV	Yes	No
1.15×TT	TT/5×20,000	8	2		
1.25×TT	TT/5×20,000	5	1		
1.25×TT	TT/5×10,000	5	3		
1.15×TT	TT/5×15,000	8	3		
TT	TT/5×15,000	2	2		
TT	TT/5×10,000	2	1		
Note: TT stands for travel time					

 Table (3) - An example scenario of the stated preference survey

sample					
Variable	Response	Frec	luency	M (S. D.)	
	Category	Absolute	Relative (%)	Mean (S.D.)	
Gender	0: Female	38.00	185	0 (2 (0 49)	
Gender	1: Male	62.00	306	0.62 (0.48)	
	0: 18-24	119	24.24		
	1:25-34	255	51.93		
Age	2:35-44	71	14.46	1.09 (0.88)	
-	3: 45-64	43	8.76		
	4: +64	3	0.61		
Marriage	0: Single	327	66.60	0.22 (0.472)	
Status	1: Married	164	33.40	0.33 (0.472)	
	0: At most	48	9.78		
	diploma				
Education	1: Bachelor	158	32.18	1.57 (0.79)	
	2: Master	240	48.88		
	3: PhD	45	9.16		
	0	10	2.04		
Number of cars	1	230	46.84	1 65 (0.77)	
in household	2	173	35.23	1.65 (0.77)	
	+3	78	15.89		
	0	29	5.91		
Number of	1	146	29.74		
driving license in household	2	135	27.49	2.09 (1.14)	
III IIousenoiu	3	115	23.42		
	+4	66	13.44		
	0: 0-5	186	37.88		
Driving	1:6-10	154	31.36	1.07(1.06)	
experience	2: 11-15	80	16.30	1.07 (1.06)	
	3: +16	71	14.46		
	0: Very low	27	5.50		
	1: Low	98	19.96		
Income	2: Medium	203	41.34	2.06 (0.93)	
	3: High	145	29.53		
	4: Very high	18	3.67		

## Table (4) - Descriptive analysis results of socio-economic characteristics of the research sample

Variable type	Symbol Definition		Min.	Max.	Mean/ Percent
	PASSEN	If the respondent was a passenger in a car: 1; otherwise: 0	0	1	29.93%
	CarOwn0	Not owning a private car: 1; otherwise: 0	0	1	5.70%
	NPS_1	Sharing the trip with one another passenger: 1; otherwise: 0		1	33.33%
	FEMALE	Female: 1; otherwise: 0	0	1	37.67%
	INC_3	Having a middle income: 1; otherwise: 0	0	1	41.34%
ymr	FP	Having a private parking at home: 1; otherwise: 0	0	1	77.18%
Dummy	NACR0	Experiencing no accident in past 5 years as a driver: 1; otherwise: 0	0	1	68.83%
	DREXP1	Having 0-5 years of driving experience:1; otherwise: $0$		1	37.88%
	NACDR_2	Experiencing more than two accidents in past 5 years as a driver: 1; otherwise: 0		1	12.83%
	WTSS_2	Two minutes waiting time for SAV: 1; otherwise: 0	0	1	33.33%
	COVID	Dissatisfy with internet taxis due to COVID: 1; otherwise: 0	0	1	4.48%
Continuous	TTM	TTM $\frac{1}{private \ car \ travel \ time \ (minute)}$		0.200	0.02
	HHCAR	Household car ownership	0	4	1.68
	TTSM $\frac{1}{SAV \ travel \ time \ (minute)}$		0.00 4	0.200	0.01
	INC	Income level (1: very low;; 5: very high)	1	5	3.05
	TCSS	SAV travel cost (IRR)	120, 000	756,0 00	199,070
	PHD	Holding a PhD degree:1; otherwise: 0	0	1	9.16%

# Table (5) – Definition and descriptive analysis of model variables

Variables	Coef.	t-statistic	M.E. <sup>1</sup>	
Utility of the alternative: shift to S	Utility of the alternative: shift to SAVnt $0.140^*$ $1.83$ ancing more than two accidents in past 5 years as a driver $0.417^{***}$ $3.52$ $0.0$ nutes waiting time for SAV $-0.279^{***}$ $-3.49$ $0.0$ sfy with internet taxis due to COVID Travel time of SAV $17.189^{**}$ $2.42$ $4.0$ wel cost × Bing a middle-income $-0.013^{***}$ $4.18$ $0.0$ ing a PhD time of SAV $7.598^*$ $1.80$ $1.8$ Utility of the alternative: Not shift to SAVUtility of the alternative: Not shift to SAVcolspan="2">utility of the alternative: Not shift to SAVutility of the alternative: Not shift to SAVspassenger in a private cars $-0.407^{***}$ SARNote the alternative: Not shift to SAVvisiting a ride with one another passenger $0.194^{***}$ <			
Constant	0.140*	1.83	-	
Experiencing more than two accidents in past 5 years as a driver	0.417***	3.52	0.099	
Two minutes waiting time for SAV	-0.279***	-3.49	- 0.067	
Dissatisfy with internet taxis due to COVID	17.189**	2.42	4.098	
Travel time of SAV				
SAV travel cost $\times$ Bing a middle-income	-0.013***	4.18	0.003	
Holding a PhD	$7.598^{*}$	1.80	1.811	
Travel time of SAV				
•				
Being a passenger in a private car	0.264	2.74	0.063	
Not owning any private cars	-0.407***	-3.48	- 0.097	
Income $\times$ Sharing a ride with one another passenger	0.194***	7.80	0.047	
Being a female	-0.272***	-3.17	- 0.065	
Being a middle – income	0.743**	2.22	0.177	
Car ownership $\times$ having private parking	$0.200^{*}$	1.88	0.047	
Model statistics				
Number of observations	2946			
Log-likelihood at zero (LL(0))	-2042.0	1		
Log-likelihood at market share (LL(C))	-2041.0	0		
Log-likelihood at convergence $(LL(\beta))$	-1970.3	6		
<i>Note: ***, **, *: confidence level at 99%, 95% and 90%.</i> <sup>1</sup> <i>M.E.: Marginal Effect</i>				

# Table (6) - Estimation result and marginal effect of model shift to SAV

## 625 Biography

Mahsa Aboutorabi Kashani graduated from Islami Azad University in civil engineering in 2018,
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Mohammadhossein Abbasi received his B.Sc. degree in Civil Engineering in 2016 from Ilam University, Ilam, Iran. He also earned his M.Sc. degree in Transportation Planning in 2018 from K. N. Toosi University of Technology, Tehran, Iran. During his M.Sc., he worked on the impact of battery electric buses on the environment, traffic, and economic aspects in Tehran, Iran. He earned his PhD degree from Tarbiat Modares University, Tehran, Iran in 2024. His research focuses on the acceptability of shared autonomous vehicles in Tehran, Iran. His research interests include traffic simulation, behavioral models in transportation, active mobility, and traffic safety.