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| 19       email: sophiav@central.ntua.gr, tel. +30-210-7721282, fax +30-210-7721327,         20       George Yannis, Ph.D.         21       Associate Professor  |             |
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| 21George Yannis, Ph.D.22Associate Professor   |             |
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| <ul> <li>Department of Transportation Planning and Engineering, School of Civil Engineering, Technical University of Athens (NTUA)</li> </ul>   | Vational    |
| 25 5, Iroon Polytechniou St, 15773, Zografou Campus, Greece,  |             |
| 26 <i>email:</i> geyannis@central.ntua.gr, tel.+30-210-7721326, fax +30-210-7721327   |             |
| 27  |             |
| 28 Sokratis G. Papageorgiou   |             |
| 29 Assistant Professor  |             |
| 30 National and Kapodistrian University of Athens   |             |
| 31 75 Mikras Asias str., GR-11527, Athens, Greece   |             |
| 32 sokpapa@med.uoa.gr, +302107289404, +302107216474   |             |
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#### 34 ABSTRACT

#### 35

36 Driving simulation has become popular in the context of assessment of driving ability, as it provides a safe and economical method of assessing driving behaviors in comparable, controlled 37 38 and repeatable driving conditions. The present paper is a review of studies on driving 39 performance assessment with the use of driving simulators, aiming at: (i) identifying and 40 summarizing studies investigating driving performance as assessed on simulators in relation to cognitive impairments, particularly those which are age-related or caused by neurodegenerative 41 42 disorders including mild cognitive impairment (MCI), Alzheimer's disease, Parkinson's disease 43 and stroke; (ii) identifying issues that should be considered in the design of simulator 44 experiments. Summaries of the studies are presented, which include information on the research 45 questions, the characteristics of the subjects, the type of simulators used (level of fidelity), the driving scenarios and tasks used, simulator outcomes, dependent measures (e.g. behavioral data, 46 47 crashes), and the main findings, as well as further research suggestions. Moreover, consideration 48 is given to the studies' limitations and the interpretation of the findings (as noted or discussed by the authors) in an effort to identify issues which may limit the generalisability of research results 49 50 and should be considered in the design of simulator experiments.

51

52 Keywords: Road safety, driving performance assessment, driving simulation, cognitive

- 53 impairment, off-road assessment
- 54

56

#### 55 INTRODUCTION

#### 57 Background

58

59 The ability to drive can be affected by various motor, visual, cognitive and perceptual deficits 60 which are either age-related or caused by neurologic disorders such as stroke, Parkinson's disease, Alzheimer's disease, multiple sclerosis and traumatic brain injury (Akinwuntan, 2012). 61 Neurodegenerative conditions such as Alzheimer's disease, Parkinson's disease and stroke 62 63 impair perception cognition and motor function, leading to reduced driver fitness and increased 64 crash risk. On their own, age and medical diagnosis are insufficiently reliable predictors of the safety of drivers and crash incidence, while effective rehabilitation does not exist for 65 neurologically impaired drivers (Uc and Rizzo, 2011). Driving performance assessment (Ball 66 and Ackerman, 2011) is defined as "an in depth examination of driving-related functional 67 impairment and can be used to determine the extent to which driving ability is impaired". In a 68 69 review of older driver assessment methods, Ball and Ackerman (2011) note that "assessment 70 provides a basis for identifying options for licensing recommendations and determining the possibility of remediation". The gold standard of driving assessment is considered to be on-road 71 72 driving evaluations. However, their effectiveness and efficiency is under investigation (Ball and 73 Ackerman, 2011; Mullen et al., 2008). Driving simulators are considered a promising tool for reliable and safe evaluation of driving performance, especially in people with loss of driving 74 75 skills due to physical or neurological conditions in America and Europe (Singh et al., 2011; 76 Hakamies and Peters, 2000).

The use of driving simulators in the context of driving performance assessment is associated with certain advantages: they provide objective measurements of driving performance in a safe environment; driving performance is challenged in driving tasks (e.g. crash-likely situations) which would be impossible on an open road; many confounding variables that occur in on-road driving can be controlled; events and scenarios can be identically repeated for each participant; even low-cost, low fidelity simulators have the potential to address interesting research questions (Uc and Rizzo, 2011; Ball and Ackerman, 2011; Akinwuntan et al., 2012; Caird and Horrey,

(Oc and Kizzo, 2011, Ban and Ackerman, 2011, Akmwuntan et al., 2012, Cand and Horrey,
2011). However, Caird and Horrey (2011) also note that "driving simulators are good at
assessing driving performance or what a driver can do but are not able to address driver behavior
which is what a driver does in their own vehicle"; and that "driving simulators may create
artificial situations which are not reminiscent of real-world situations".

- Studies have demonstrated that the use of driving simulators as a part of an assessment battery may be a promising method for assessment of older drivers and also that performance on the simulator is associated with performance in on-road testing (Ball and Ackerman, 2011). Uc and
- 91 Rizzo (2011) points out that driving simulators have the capacity to distinguish between controls
- and drivers with Alzheimer's disease, Parkinson's disease or stroke, and have enabled a better
- understanding of driving impairments and driver error. Their view is that driving simulators may
  be of assistance in driver assessment and rehabilitation but that further research is required to
- 95 validate their predictive ability in real life driving and rehabilitation potential. When criteria such 96 as at-fault crashes and traffic citations are used for persons with visual or neuropsychological 97 deficits, there is little or no correlation between drivers' performance on the simulator and their 98 history of driving citations and crashes; this is attributed to the limited sensitivity of these
- 99 indicators, which are discrete rare events (Akinwuntan et al., 2012). Akinwuntan et al. (2012)
- 100 note that there is no evidence that driving simulators provide test-retest reliability and stress the
- 101 need for further research in this area.
- Driving simulators vary in their characteristics, that is, motion base vs. fixed base, interactivity, 102 103 resolution and field of view, as well as in their validity against actual road driving (Uc and Rizzo 104 2008). Different simulators pose different limitations to researchers that should be considered 105 when they design their experiments. For example, simulator limitations in presenting visual 106 information can have serious effect on driving performance. Limitations in display resolution in 107 low-cost simulators may affect the ability of drivers to discern momentary changes in distance-108 velocity of an oncoming vehicle during a passing maneuver on a two-lane highway (Staplin, 109 2010). Researchers are advised that questions setting specific requirements regarding traffic 110 environment, features and tasks may not be able to be addressed by a simulator with limited 111 capabilities (Caird and Horrey 2011).
- In order to make comparisons between research studies conducted on different simulators or explain conflicting findings, it is important that the scenarios are specified in sufficient detail (Rizzo 2011). Furthermore, comparability across simulation studies can be improved by assessing and reporting relevant individual characteristics that are associated with driving ability (Ball and Ackerman 2011). These are related to demographic and health factors which may impact driving ability, such as age, gender, race, education, abilities, general health, medical diagnoses, medication use and driving frequency (Ball and Ackerman, 2011; Rizzo, 2011).
- 119 A disadvantage of driving simulators, which has implications for simulator research, is simulator
- 120 adaptation syndrome (SAS). SAS is characterized by autonomic symptoms including nausea and
- 121 sweating. It is more common among older drivers and females and it can be reduced using
- appropriate techniques and through scenario design (Rizzo, 2011; Trick and Caird, 2011). Allen

et al. (2007), Park et al. (2007) and Park et al. (2006) have developed scenarios which were designed to minimize simulator sickness and to be sensitive to aging driver; they observed that when the scenarios were presented in order of suspected symptom propensity, participants were more likely to drop out after completing or when attempting a scenario requiring a higher driving speed (45mph) within a visually complex background and intersection turning.

128 The issue of adaptation is a concern in relation to participant exposure and a threat to the validity 129 of results. Drivers should be given the opportunity to practice and adapt prior to the experimental phase of the simulation application (Stoner et al. 2011). Screening is often used (simulator 130 131 sickness questionnaire) to exclude participants who are susceptible to simulator sickness. 132 However, it is still possible that people who pass the screening tests will develop SAS. It is 133 therefore probable that the remaining sample will no longer be representative of the study 134 population. Therefore, researchers are strongly advised to report the incidence of simulator 135 adaptation syndrome and the characteristics of dropouts (Trick and Caird 2011).

136

### 137 **Objectives**

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139 The present paper is a review of studies on driving performance assessment with the use of 140 driving simulators, aiming at: (i) identifying and summarizing studies investigating driving 141 performance as assessed on simulators in relation to cognitive impairments, particularly those 142 which are age-related or caused by neurodegenerative disorders including mild cognitive 143 impairment (MCI), Alzheimer's disease, Parkinson's disease and stroke; (ii) identifying issues 144 that should be considered in the design of simulator experiments with potential impact on the generalizability of the research findings. To this end, emphasis is put on study findings, 145 146 experiment design considerations and limitations of studies, as discussed by the authors when 147 interpreting the findings of their studies.

148

## 149 Approach

150 The review, although not exhaustive, includes studies investigating driving performance as assessed on simulators of drivers with cognitive impairments which are age related or caused by 151 152 neurodegenerative disorders including mild cognitive impairment (MCI), Alzheimer's disease, 153 Parkinson's disease and stroke. Summaries of the studies are presented, which include 154 information on the research questions, the characteristics of the subjects, the type of simulators 155 used (level of fidelity), the driving scenarios and tasks used, simulator outcomes, dependent 156 measures (e.g. behavioral data, crashes), and the main findings, as well as further research suggestions. Moreover, consideration is given to the studies' limitations and the interpretation of 157 the findings (as noted or discussed by the authors) in an effort to identify issues which may limit 158 159 the generalizability of research results and should be considered in the design of simulator 160 experiments.

#### 161 **RESEARCH RESULTS**

162

## 163 Driving performance of people with Parkinson disease and stroke164

165 The study of Stolwyck et al. (2006) examined the impact of a concurrent task on driving 166 performance among18 current drivers with PD in the mild to moderate stages (mean age 67.62)

167 and 18 matched controls (mean age 67.13) using a fixed base simulator. They found that cognitive difficulties associated with PD compromise driving performance even in the mild to 168 169 moderate stages of the disease. The presence of a concurrent task was manipulated between 170 conditions. The dependent variables which were investigated included several driving behaviors 171 in respect to traffic signals (approach speed, deceleration point, stopping point) and road curves 172 (mean speed, speed variability, mean lateral lane position, lateral lane position variability) and 173 the concurrent task (accuracy and response time). The independent variables were the presence 174 of a concurrent task and participant status. The study findings indicate that both groups of drivers 175 with PD in the mild to moderate stages and matched controls (in respect to age, years of 176 education and years of driving) were similarly affected by the concurrent task (auditory task 177 requiring driver's response) on most driving measures: when the concurrent task was present 178 both groups applied tactical adaptations to their driving behavior, resulting in a more 179 conservative driving. The concurrent task had a disproportionate effect in performance at 180 operational level (PD started deceleration later, closer to the traffic signal. People with PD tended to trade concurrent task performance to maintain driving performance. In people with PD 181 182 measures of cognitive tests were associated with tactical and operational level of performance.

183 Vaux et al (2010) studied how the ability of participants with neurodegenerative disease (AD and 184 PD) to detect impending collisions differed from that of neurologically normal participants of 185 comparable age (mean age 69.67) in a low-fidelity simulator (desktop computer). The groups consisted of men and women (27% women in the neurodegenerative disease group and 38% in 186 187 the neurologically normal group). Performance on a battery of standardized neuropsychological 188 tests suggested early cognitive decline in the AD/PD group. The dependent variables were the collision detection sensitivity (indicating the ability to detect collision) and independent variables 189 190 were the number of obstacles and time to contact (TTC). Group was a between subjects variable 191 and number of objects (two levels: one and six objects) and TTC (1second and 3seconds) were 192 the repeated measures variables. When a single object is present in the driving scene both 193 groups performed with some degree of sensitivity at each of the TTC conditions. For the 3-194 second TTC/6 objects condition, the results indicate that the comparison group has some degree 195 of sensitivity whereas the neurodegenerative group has no sensitivity to detect a collision. For 196 the 1-second TTC /6 objects condition, both groups had high sensitivity to detect a collision. The 197 results suggest that drivers with AD and PD required additional time to detect impending 198 collisions which likely impairs their ability to avoid collision events measured by the current 199 simulation task. Impairments on the collision detection tasks in the neurodegenerative disease 200 group reflected a variety of combined disturbances of visual-sensory processing, motion 201 processing, attention, visuo spatial skills and executive functions as implied by the association 202 between poor collision sensitivity and poor performance on tests of cognition and visual 203 attention. Authors suggest that more data is needed to disclose relationships between 204 performance on the collision detection task and real-world evidence of driver behavior.

205 Lee and al.,(2007) explored the validity of using driving simulator technology in assessing 206 drivers with PD. Fifty PD patients and 150 healthy controls of comparable age participated in the 207 study. All aged between 60 and 80, they were current drivers with no history of violations. The 208 criteria for assessing the simulator and on-road tests were combined by principal component 209 analysis, while an overall simulated driving index and a road assessment index were developed 210 for the PD group and the control group. The indices were significantly different in the 211 experimental and control groups. In the simulated driving test, the drivers with PD performed less safely than the controls. The PD patients did not perform well in both the tactical and the 212

operational level. Participants with PD tended to drive slower in response to road hazards, unable to control speed and movement of the steering wheel, to apply the brakes smoothly, to address two tasks simultaneously and to make quick decisions and judgments. These problems are related to decrements in motor skills, visuo-spatial processing, working memory and executive function planning. They also failed to perform well at either the tactical or the operational level.

218 Forty percent of the variability in the Road assessment Index of drivers with PD can be explained by the Simulator Driving Index, after adjusting for age, gender and average miles per year. The 219 220 corresponding percentage of the control group was sixty eight percent. Authors conclude that 221 according to the findings of the study driving simulators can provide valuable information on PD 222 driver's ability. The study's limitations as noted by the authors were the relatively few women 223 participants, the non-representativeness of the target population, the probable self-selection bias, 224 the use of medication and the fear of information technology in the older adult population. The 225 authors suggest further research into which level of behaviors contributes more to the poor 226 performance of PD patients and validation of the simulator with a randomized control sample. 227 They also suggest that driving simulators can be developed into a cost-effective screening tool.

228 Patomella et al. (2006) conducted across-sectional observational study investigating aspects of 229 validity and stability of Performance Analysis of Driving Ability (P-Drive) for people with 230 stroke using a technically-advanced driving simulator. One hundred and one participants with 231 stroke (referrals) were included in the study having met specific inclusion criteria. P-Drive was 232 used to score driving performance on the basis of observations and specific scoring criteria per 233 item defined in P-Drive. P-Drive items were classified into tactical and operational according to 234 Michon's levels. The findings indicate that P-Drive is an assessment tool with properties of 235 internal scale validity and person response validity, which also contains aspects of reliability in 236 relation to precision of the estimates and separation. Items requiring great attention and rapid information processing were the most challenging and those concerning maneuvering were the 237 238 least challenging. In addition, items requiring tactical decisions were more challenging than 239 those for which only operational decisions were required. The authors suggest that the over-240 representation of male participants is probably attributable to the male dominance of referrals.

241

# Driving performance of people with mild cognitive impairment (MCI) and Alzheimer's disease disease

245 Rizzo et al. (2001) studied the response of 18 drivers with AD (with mild to moderate cognitive 246 impairment) and 12 non-demented drivers of similar age to a vehicle incursion at an intersection 247 in a high-fidelity simulator (Iowa Driving Simulator). The results showed increased crashes in 248 the AD group, inappropriate or too slow control responses and inattention 5 sec preceding a 249 crash event. Measures of lateral control and longitudinal vehicle control on the uneventful 250 segments before the intersection varied within restricted ranges and did not differ significantly 251 between AD group and control groups. These findings were combined with those of another 252 study examining rear-end collision avoidance in drivers with AD. The combined crashes were predicted by performance scores on cognitive tests sensitive to declines in aging and AD. 253 254 Interestingly, the authors suggest in their discussion that by manipulating task demands in a simulated environment, that is by increasing "exposure" of cognitively impaired drivers and 255 posing sufficient challenge, it is possible to observe safety errors of different types and infer 256 257 crash risk through these observations (Rizzo et al., 2001).

258 Devlin et al. (2012) examined how older drivers with and without Mild Cognitive Impairment (MCI) perform when approaching intersections, testing fourteen male and female older drivers 259 260 with MCI and fourteen age-matched healthy drivers using a portable driving simulator with an 261 established relative validity for some operations. Specific performance measures include were approach speed, number of brake applications on approach to the intersection, failure to comply 262 263 with stop signs and braking response times on approach to critical light change The preliminary 264 evidence suggested that drivers with MCI performed less well when approaching controlled 265 intersections and critical light-change intersections. Healthy drivers demonstrated a greater 266 number of foot hesitations on approach to stop-controlled and critical light change intersection 267 compared to the MCI group; this behavior was probably adopted as a strategic mechanism. A large variation in cognitive ability amongst the drivers with MCI was found. Some limitations of 268 269 the study, as reported by the authors, include the representativeness of the sample, volunteer bias, 270 the strict inclusion criteria, the small sample and the use of the MMSE as a screening tool, which 271 might not detect highly-educated participants with age-related cognitive impairment in the 272 control group (Devlin et al., 2012). These limitations would affect the possibility of drawing 273 general conclusions from the results.

274 A study by Frittelli et al. (2009) examined the impact of Alzheimer's disease (AD) and Mild 275 Cognitive Impairment (MCI) on driving ability using a low-cost, personal-computer-based 276 interactive driving simulator. The study included twenty patients with mild AD (CDR=1), 20 277 individuals with MCI (CDR=0.5) and 19 neurologically normal aged controls. The groups were 278 matched in terms of age, level of education and years of driving experience. There was a slight 279 imbalance between patients and controls in terms of numbers of men and women and results were not adjusted for gender. The study detected greater impairment of driving performance in 280 281 AD patients than in healthy and MCI subjects. Drivers with AD were rated as significantly worse 282 than MCI subjects and healthy elderly drivers on three driving behaviors, length of the run (sec), mean time to collision and number of off-road events (defined as occurring when the centre of 283 284 the car's bonnet crossed the lateral border of the road). The only statistically significant difference between MCI patients and healthy control subjects was in the shorter mean time to 285 286 collision of MCI subjects. Although driving performance was significantly related to cognitive 287 decline, correlations with the MMSE score for overall cognitive function were not significant 288 (Frittelli et al., 2009). The conclusion of the authors is that driving simulator tests are a valid and 289 reliable screening tool for determining the competence of drivers with early AD and they suggest 290 further research on whether the observed impairment translates into increased accident risk.

291 Uc et al. (2006) tested avoidance of rear-end collisions (REC) in 61 drivers with AD and 115 292 elderly controls, all holding valid driving licenses, using a high fidelity driving simulator. 293 Participants were matched for educational level. AD participants were older and in this group 294 male gender predominated. Indexes of driving performance used were the standard deviations of 295 mean steering wheel position, mean speed change, mean number of large steering adjustments 296 (>6) per minute. The response of the AD subjects in collision avoidance situations was less 297 effective than that of the controls. This was not a result of the older age or lower driving 298 exposure of the AD participants. Although the likelihood of REC in AD drivers was not 299 significantly higher, they were less quick to react and were more likely to respond in an unsafe 300 manner, by suddenly slowing down or stopping before reaching the intersection.

According to this study, multiple factors are predictive of unsafe outcomes in the REC avoidance task, consistent with its multilevel cognitive sensory and motor demands. AD participants showed poorer vehicle control than neurologically normal older drivers based on significantly

304 increased variability and a tendency for increased speed variability in baseline driving circumstances under low traffic conditions on an uneventful segment of two-lane highway. 305 306 Poorer vehicle control at baseline predicted unsafe outcomes in the complex driving condition at 307 the intersection, suggesting that basic measures of driving in the simulator can predict outcomes 308 in high risk situations. The specific simulator experiment revealed that unsafe -"hidden"- driving 309 behaviors are theoretically related to crashes and occur more frequently. The safe response of 310 participants with mild dementia in the REC avoidance task implies that some older drivers with 311 neurological disorders may continue to drive safely. The authors' findings suggest that decisions regarding fitness to drive should take performance-based testing into consideration and should 312 313 not be made on the basis of diagnosis alone.

314

### 315 Age comparisons

316 317 Using a fixed-base simulator with a 40-degree horizontal field of view, Cantin et al. (2009) 318 examined if the mental workload of young and older active drivers varies with the difficulty of 319 the driving context. Workload was measured using the probe reaction time (RT) technique. 320 Twenty male drivers participated in the study, ten aged between 20 and 31, with a mean age of 321 24, and ten aged between 65 and 75, with a mean age of 69. During the experimental drive, 322 participants were exposed to three auditory stimuli in three increasingly complex driving 323 contexts: at constant speed on straight roads; approaching intersections; and overtaking a slower 324 vehicle. For both groups, there was an increase in the mental workload at intersections. At more 325 complex intersections there was a further increase, disproportionately so in the case of the older drivers. Vehicle control did not decline in response to stimuli. In each group there were few 326 327 omissions, although in driving contexts of greater complexity, the older drivers failed to respond 328 more than twice as often as the younger drivers. Older drivers were observed to use 329 compensatory driving strategies. Accidents or incidents did not become more frequent for elderly 330 drivers and there was one serious error at an intersection. The authors suggest examining 331 whether this failure state is observable in the case of at-risk drivers, such as those who are older 332 than 85 years of age or those suffering from mild cognitive impairment.

- 333 In discussing the limitations of their study the Authors note the participation of volunteers who, 334 in addition, were active and cognitively fit and nearly ideal driving conditions. Moreover, the increased number of braking events among the older individuals compared to younger 335 336 individuals may be attributed to either increased workload or visual deficits (due to decreased 337 sensory detection capability) or to an increased motor output variability associated with aging. 338 The results suggest that driving scenario for simulator studies can be manipulated in such a way 339 to mimic the mental workload imposed by similar on-road driving contexts. A more systematic 340 examination of the interactions between aging and driving complexity may provide insight in to 341 the events leading to driving errors made by older drivers.
- 342 The study of Park et al. (2007), Allen et al., (2007), compares the driving simulation 343 performance of 51 younger drivers (22 male, 29 female) aged 21-50, with 67 older drivers (37 344 male, 30 female) aged 70-90, with a minimum of 5 years driving experience. A desktop driving simulator with wide field of view driving simulator was used. They were subjected to a large 345 346 number of physiological, sensory and neuropsychological tests and completed a simulator 347 sickness questionnaire. There were five sessions in the simulated driving part of the test battery. 348 Simulation measures used included standard deviation of curvature error, time taken for 349 completion of a construction zone obstacle course, standard deviation of time-to-collision in

multiple lane-changing tasks, composite vehicle collision count, number of hard braking (>0.5g) instances, average time to collision, pedestrian collisions, number of cone collisions in construction zone scenario, average vehicle speed, standard deviation of vehicle speed and composite number of excessive steering instances.

354 The results of this study indicate that older drivers were 4 times more likely to hit pedestrians; 355 they also had more instances of hard braking and their average was lower and took longer to 356 complete the scenario. The two age groups differed markedly in terms of TTC. Based on the 357 results of regression analysis, the authors note that cognitive variables (measures) are related to 358 no more than two simulation variables, while simulation variables are related to four or five 359 cognitive variables. Park et al. (2007) showed that simulator performance is age-sensitive but 360 does not appear to be sensitive to measures of discomfort. The simulator measures showed 361 significant correspondence with traditional cognitive test instruments and that simulator 362 measures provide more age discrimination relative to the variability of the measures. The authors 363 suggest that it might be possible to condense these scenarios, which lasted about an hour over four sessions, into a single 30-minute long scenario. Procedures need to be developed to improve 364 365 screening so as to minimize Type I errors (rejection of an unimpaired subject) and Type II errors (acceptance of an impaired subject). 366

Andrews et al. (2012) examined compensatory processes for age-related declines in cognitive 367 368 ability in 22 younger (26-40years, nine men) and 22 older drivers (60+, nine men). All the 369 participants were active drivers with at least six years of driving experience. The two groups 370 were similar in terms of visual status and general health and although they had different levels of 371 driving experience, their current driving activity was matched in terms of frequency, annual 372 mileage and road use (Hakamies et al. 2005). There was no difference in their history of adverse 373 events. The participants were tested in two separate 75-minute sessions. The first consisted of 374 cognitive tests and self-report subjective workload questionnaires (NASA TXL), while the 375 second consisted of a driving experiment conducted on a low-fidelity simulator. Participants 376 performed a car-following task in one version that required no braking by the lead car and in another that required braking in each of four driving scenarios representing a variety of urban 377 378 demands. The dependent measures were mean time headway, minimum time to collision (TTC), 379 anticipation of lead vehicle braking events, number of anticipated events, standard deviation of 380 speed and standard deviation of lane position.

381 The results show that older drivers adopted a compensatory behavior in terms of longer 382 headways (by means of altered speed/timing strategy) to off-set the effects of age-related 383 cognitive slowing. The older group was relatively homogeneous in adopting this strategy which 384 was not dependent with scores of crystallized abilities or cognitive reserve. In the older group a 385 subgroup of cognitively more able participants show a compensatory process, i.e., in that they anticipated traffic events more frequently than cognitively less able older participants. Authors 386 387 refer to selective compensatory process which is applied a older participants with higher 388 cognitive ability including an index of crystallized ability. This age-related compensation 389 however is correlated with increased workload experienced by older individuals. Prediction of 390 age-related compensatory processes may require an index of pre-decline intelligence, i.e. 391 crystallized ability. Authors suggest the use of cognitive ability tests as a part of screening 392 process for older drivers. The authors note a sampling bias related to volunteers who may not be 393 representative of the population of interest. Regarding representativeness of older populations, 394 the sample consisted of individuals who were healthy, fit and active. They also recognize that

395 when examining the effects of aging, cross-sectional studies make it difficult to distinguish age 396 from cohort effects.

397 Mullen et al. (2008) investigated whether driver performance on one task was predictive of 398 performance on another and also investigated the relationship between cognition and driving. 399 Twenty-six drivers aged 55 to 80 (5 male and 21 female, mean age 63, SD=6.8 years), all 400 holding valid licenses, volunteered to participate in the study. Cognitive tests were conducted 401 prior to the experimental drive, a 15-minute orientation drive was completed by subjects in order 402 for them to acquire familiarity with the driving simulator and controls. A desktop simulator with 403 a wide field of view was used. In the rural highway course scenario speed maintenance ability 404 was assessed. The dependent variables were the percentage of time the participants drove within 405 +-5mph of 55 mph and the total number of driving errors recorded throughout the drive. In the 406 parking lot scenario, the situational awareness of participants and their emergency braking ability 407 were assessed, while number of collisions (with vehicles and pedestrians) and number of driving 408 errors were the dependent variables.

409 The construction zone scenario assessed motor control ability with steering wheel and pedals, 410 while number of collisions (with road cones and workers) and number of driving errors were the 411 dependent variables. Drivers were asked to perform three driving tasks requiring different skill 412 sets and expected to involve different areas of cognition which had been shown to be sensitive to 413 age-related declines in performance (3.0 mile rural highway course; 0.5 mile parking lot course 414 and 1 mile construction zone course. The lack of correlation in the performance of the three 415 driving tasks and the correlations found between the cognitive tests and the driving tasks suggest 416 that the driving tasks involve different driving abilities and cognitive constructs. Interestingly, 417 the authors note that for the scenarios in question, incidence of errors was not an effective 418 measure of driving performance. This suggests that further research is required to determine 419 which components more effectively measure driving performance. In addition, it is vital that 420 every component of safe driving should be assessed in a standardized fashion that is consistent 421 across research and evaluation programs.

422 Using a driving simulator, Benedetto (2008) compared speeds and Pathologic Discomfort 423 indicator for two age groups (younger and older drivers) in two road stretches of different 424 complexity. Pathologic Discomfort indicator is the cumulated absolute value of the difference 425 between the absolute values of theoretical and real lateral acceleration; when the value of Pathologic Discomfort increases the accident rate increases with a parabolic trend. The two 426 427 hypotheses tested were (1) Pathologic Discomfort has the same trend along the roadway for older 428 and younger people; and (2) Pathologic Discomfort for older people is greater than for younger 429 drivers. Two homogeneous age groups of drivers participated in the study: the members of the 430 younger group were 21 to 27 years old with average age 24.4 (s.d. 1.9) and the members of the older group were over 65 with average age 69 (s.d. 4.2). The investigation was conducted for two 431 432 stretches of a two-lane dual carriageway road of different accident rates and geometric 433 complexity. The stretches were homogeneous in their operational and environmental 434 characteristics.

After a training session of 10-15 minutes in the simulator, drivers drove the first stretch of road and the day after the second (less safe) stretch. Simulator measures used in the analysis included speeds and transverse accelerations. Average speeds, standard deviations of speeds of younger and older groups in each stretch and in each geometric element of each of the two stretches were compared. In addition, Pathologic Discomfort at each kilometer of the two stretches were computed and compared for the two age groups. Results indicate that if the geometry of a 441 roadway is more complex and tortuous, the speeds of older subjects are generally much lower 442 than the speeds of younger subjects. The dispersion of speeds is much greater for older than for 443 younger drivers. The two hypotheses tested were verified. Specifically, Pathologic Discomfort 444 has the same trend along the roadway for older and younger people and that Pathologic 445 Discomfort for older people is greater. This means that the unsafe stretch of road is expected to 446 be unsafe for both younger and older drivers and that the unsafe stretch is expected to be more 447 unsafe for older people rather than for younger people.

448 449

#### 450 METHODOLOGICAL ISSUES

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# 452 Task demand in a simulated environment453

454 Manipulation of task demands in a simulated environment allows the identification of 455 performance inadequacies. Cantin et al. (2009) suggest that driving scenarios for simulator 456 studies can be manipulated in such a way as to mimic the mental workload imposed by similar 457 on-road driving contexts; when compared to younger drivers, older drivers show performance 458 decrements in concurrent tasks for more complex driving contexts. When assessing cognitively 459 impaired drivers, the presentation of driving conditions of increasing complexity posing them 460 sufficient challenge in a simulator allows performance decrements to be studied in different cognitive domains (Rizzo et al., 2001; Vaux et al., 2009; Cantin et al., 2009; Dijksterhuis et al., 461 20011). Stolwyck et al. (2006) found that people with PD tended to trade concurrent task 462 463 performance to maintain driving performance. Cantin et al. (2009) suggest that a challenge in 464 research is to identify the mechanisms that relate to the tasks under investigation and understand 465 how they evolve with driving complexity.

466 Moreover, it would be interesting to examine the ability of individuals (with increased mental workload or cognitively impaired) to properly allocate resources or prioritize particular aspects 467 of performance (Cantin et al. 2009). When tested in collision avoidance situations, drivers with 468 469 AD showed poorer vehicle control of the vehicle than neurologically normal older drivers; in addition, poorer vehicle control at baseline driving circumstances (under low traffic conditions 470 471 on an uneventful segment of two-lane highway) predicted unsafe outcomes in the complex 472 driving condition at the intersection, suggesting that basic measures of driving in the simulator 473 can predict outcomes in high-risk situations (Uc et al. 2006). Stolwyck et al. (2006) found that 474 the concurrent task had a disproportionate effect on performance at operational level and they 475 note that such operational level behavior being time-pressured may compete with the concurrent 476 task for controlled processing resources. The study findings indicate that both PD and healthy 477 control groups were similarly affected by the concurrent task on most driving measures and 478 when the concurrent task was present, both groups applied tactical adaptations to their driving 479 behavior, resulting in a more conservative driving style.

480 According to the findings of a study on older drivers in relation to road geometry (Benedetto 2008), the speeds of older drivers are generally much lower than the speeds of the younger 481 482 drivers and as the road complexity increases older subjects drive at slower speeds; in addition, 483 older drivers experience more difficulties as road complexity increases. The occurrence of 484 compensatory behavior was also identified in a study of Cantin et al. (2009), who note that 485 although older drivers exhibited a higher mental workload than younger drivers, their driving 486 performance was not significantly different from that of younger drivers. In a comparison of 487 older and younger age groups of active drivers, Andrews et al. (2012) found that older drivers

relatively homogeneously adopted a compensatory behavior in terms of longer headways,
applying speed/timing strategy to off-set the effects of age-related cognitive slowing, and that
this strategy was not dependent with scores of crystallized abilities or cognitive reserve.

491 A subgroup of older drivers with higher cognitive ability – including an index of crystallized 492 ability - showed a compensatory process, i.e., in that they anticipated traffic events more 493 frequently than cognitively less able older participants. This age-related compensation requires 494 investment of greater effort as implied by its correlation with increased workload experienced by 495 older individuals (Andrews et al. 2009). A strategic mechanism was also observed in healthy 496 older drivers who, in comparison with MCI age-matched drivers, demonstrated a greater number 497 of foot hesitations on approach to stop-controlled and critical light change intersections (Devlin 498 et al. 2012).

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#### 500 **Concerns of the studies**

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In the reviewed papers, the authors generally recognize limitations in their studies which potentially affect the generalizability of their findings. The over-representation of male participants, which is discussed by Patomella et al. (2006), is probably attributable to the male dominance of referrals. Andrews et al. (2012) note that their sample may not be representative of the population of interest since it consisted of volunteers (sampling bias) who were also healthy, fit and active individuals. They also recognize the difficulty in distinguishing age effects from cohort effects when examining the effects of aging in cross-sectional studies.

509 In their discussion on the limitations of their study, Devlin et al. (2012) mention the small sample as well as the volunteer bias, the strict inclusion criteria and the use of the MMSE as a screening 510 511 tool, which might not be adequate to screen out highly educated participants with age-related 512 cognitive impairment in the control group. The use of MMSE is also discussed in Frittelli et al. (2009), who compared the driving performance of drivers with MCI and AD patients with 513 514 control subjects. They note that although driving performance was significantly related to cognitive decline, the correlations with MMSE score of overall cognitive function were not 515 516 significant. In Dijksterhuis et al. (2011), the occurrence of crashes is attributed to bad lateral 517 control stemming from both driving simulator characteristics and the steering skills of crash-518 involved participants. Moreover, dangerous driving over lane markings in a narrow lane on a 519 two-lane roadway with oncoming traffic might be related to driving simulator characteristics.

520 An issue of concern in studies on differences in driving performance is whether the differences 521 in the dependent variables are a result of the independent variables under investigation or other 522 confounding variables. This is particularly relevant e.g., in comparisons between different age-523 groups where conclusions should be drawn on whether any differences found are the result of 524 age per se and not of variables confounded with age; and also when investigating the effects of 525 age-related disorders. In respect of study design techniques, confounding can be treated by 526 randomization as well as by matching experimental groups in terms of confounding variables or 527 adequate screening (Trick and Caird, 2011). Randomization allows equal distribution of all characteristics - both measured and unmeasured - between experimental groups, thereby 528 529 diminishing the potential for confounding. Yet the effectiveness of the technique is largely 530 dependent on the sample size. Either because of small samples or by chance, imbalances are still 531 probable. It is therefore advisable to measure confounding variables and their influences be 532 accounted using analytical techniques (McGwin 2011).

533 Trick and Caird (2011) note that in research on older drivers, the increased variability among 534 participants of the same age compared to younger drivers should be recognized. Furthermore, in 535 studies of age-group comparisons, within-subject manipulations using complex designs with 536 multi-session testing, the increased variability within the same individual over time is an issue of 537 concern regarding the reliability of the measurements. In such designs, larger samples allow the 538 effects of increased variability across time in the performance of older adults to be counteracted 539 (Trick and Caird 2011). Common threats to internal and external validity when using driving 540 simulation, together with advice on how to address relevant issues in the study design and 541 implementation, can be found in Caird and Horrey (2011).

The variation in cognitive abilities and in driving performance of drivers with impairments has 542 543 been discussed in the reviewed studies. For example, Devlin et al. note that the trends found 544 regarding the performance of older drivers (MCI and controls) when approaching intersections 545 were not statistically significant and recognize limitations regarding the sample size and 546 characteristics limiting the generalizability of the findings. Uc et al. (2006) note that drivers with 547 mild dementia responded safely in the REC avoidance task, implying that some older drivers 548 with neurological disorders (mild dementia) may continue to drive safely. Researchers suggested 549 validation of the simulators with randomized samples (Lee et al. 2007) and larger samples 550 (Shechtman et al. 2009).

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### 552 Driving scenarios: relationships between tasks and cognitive domains

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554 Mullen et al. (2008) investigated whether performance on one driving task was predictive of performance on other driving tasks. Based on the study results, which show a lack of correlation 555 in performance between the three driving tasks and correlations between the cognitive tests and 556 the driving tasks, they suggest that driving tasks involve different driving abilities and cognitive 557 constructs. They also stress the importance of assessing performance by seniors on a range of 558 559 driving tasks. Furthermore, Andrews et al. (2012) note that when considering associations 560 between cognitive ability and driving performance, if younger and older drivers perform the 561 driving task in different ways then we can predict that ability-performance associations will 562 differ between groups. Cantin et al. 2009 note that a more systematic examination of the 563 interactions between aging and driving complexity may provide insight into the events leading to 564 driving errors made by older drivers.

565 Mullen et al. (2008) stress that in the driving assessment, each and every component of safe 566 driving should be assessed in a standardized fashion that is consistent across research and 567 evaluation programs and that future research is needed into which components more effectively 568 measure driving performance. In Rizzo et al. (2001), the combined crashes were predicted by 569 performance scores on cognitive tests sensitive to declines in aging and AD. In Vaux et al. 570 (2010), impairments on the detection collision tasks in the neurodegenerative disease group (AD and PD) reflected a variety of combined disturbances of visual-sensory processing, motion 571 572 processing, attention, visuo-spatial skills and executive functions as implied by the association 573 between poor collision sensitivity and poor performance on tests of cognition and visual 574 attention. Lee et al. (2007) observed that participants with PD tended to drive more slowly in 575 response to road hazards and were unable to control speed and movement of the steering wheel, 576 to apply the brakes smoothly, to address two tasks simultaneously and to make quick decisions 577 and judgments. These problems are related to decrements in motor skills, visuo-spatial 578 processing, working memory and executive function planning. Uc et al. (2006) found that 579 multiple factors predict unsafe outcomes in the REC avoidance task in drivers with mild AD, 580 consistent with the multilevel cognitive sensory and motor demands of this task.

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#### 582 Adaptation syndrome and practice scenarios

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584 An important precondition for validity of experiments carried out using a driving simulator is 585 adaptation. Learning how to control a simulated vehicle imposes a mental workload on 586 participants which can potentially distract them from performing the main task and bias the 587 results of experiments. Most researchers have a practice session before the main experiment to 588 ensure participants have adapted (Sahami and Sayed 2013). Assessing the time required by older 589 and younger experienced drivers to adapt to a fixed-base simulator and steer in a stable manner, 590 McGehee et al. (2004) note that although drivers seem to adapt their steering control quite 591 quickly, the adaptation period is likely to depend on a combination of simulator fidelity and the 592 cognitive tasks involved. In their study, Ronen and Yair (2013) ascertained that roads of different 593 complexity and demand (curved, urban and straight) require different adaptation times.

594 The relatively demanding curved road required longer adaptation times and there was a need for 595 improvement in more performance measures than for urban and straight roads. Subjective 596 estimations corresponded very closely with most performance measures in all road types, 597 although underestimation was found for the more sensitive measures that required longer time 598 for adaptation in each road type. In particular, for the least demanding the straight-road scenario 599 adaptation (according to the statistically significant road edge excursions measure) was 600 established after driving about 6.3 min. Similarly, in McGehee et al. (2004) adaptation to a twoway road way was achieved after 6 min, while Sahami and Sayed (2010) found the mean 601 adaptation time to be more than 7min. According to the results from the urban road (Ronen and 602 603 Yair 2013), the RMS of steering wheel deviations showed adaptation after 9.2 min., whereas the 604 RMS of longitudinal speed showed adaption after 14.8 min, probably due to maneuvering on 605 narrow and busy roads. The curved road was the most demanding road, requiring more negotiation of the wheel and pedals, since it is a control task. 606

607 RMS of steering wheel deviations and the number of deviations from the driving lane showed 608 significant patterns of adaptation, which was achieved after about 11.1 min., corresponding to 609 the subjective assessment of adaptation. RMS of lane position was the other significant 610 performance measure for the curved road type, adaptation being achieved after 14.4 min. In their study, Sahami and Sayed (2013) provide recommendations to improve the quality of design for 611 612 the practice scenario and to minimize its impact on the experiment scenario, suggesting that 613 participant adaptation to a driving simulator is task independent as long as the practice scenario provides them with the chance to repeatedly practice a scenario using pedals and steering. In 614 their recommendations, they suggest that a practice scenario should provide chances for them to 615 616 modify all their driving skills (distance judgment, pedal and steering control). A repetitive scenario will help the researcher track the learning under identical conditions and make sure 617 618 whether adaptation has occurred. Furthermore, the scenario should not be defined for drivers to focus on one specific aspect of driving. Improper practice design can introduce unwanted bias as 619 620 drivers tend to focus on specific sub-skills that they have practiced more. Fourier analysis 621 (McGehee et al. 2004) showed that different types of variability are differentially sensitive to 622 adaptation and age, with the higher frequency components discriminating between older and younger drivers relative to the low frequency components. The authors note that Fourier analysis 623

may help identify more subtle differences in driving populations, such as those who are afflictedwith Alzheimer's disease or have suffered stroke.

#### 626

#### 627 CONCLUSIONS

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The present paper is a review of studies investigating driving performance as assessed on simulators in relation to cognitive impairments, particularly those which are age-related or caused by neurodegenerative disorders including mild cognitive impairment (MCI), Alzheimer's disease, Parkinson's disease and stroke. The review aims at summarizing research findings and identifying issues that are considered to be important as probably affecting the generalizability of the results.

- 635 In the studies reviewed, emphasis was put on simulator test design considerations, which are 636 outlined herein. Driving simulators are used to identify relationships between driving 637 impairments and performance in cognitive tests. They also provide the possibility of safe and controlled observation of driver errors of different risk severity in a range of operational and 638 639 tactical driving tasks in populations of various demographic characteristics and driving 640 impairments due to various diseases or conditions. It should be stressed that demographic and 641 health factors having an impact on driving ability as well as confounding variables that occur in 642 driving should be measured and accounted for in comparisons between different age-groups and 643 in investigations of the effects of age-related disorders. Various techniques can be used to treat 644 confounding variables; however, their effectiveness largely depends on the sample size.
- 645 Scenario design and related driving tasks along with dependent and independent measures are 646 based on the specific research question(s) which in turn should be transformed into explicit test 647 hypotheses. Manipulation of driving task complexity and use of concurrent tasks allow the 648 identification of different types of safety errors and how they relate with impairments in certain 649 cognitive domains. Challenges that researchers commonly have in performance assessment with 650 the use of driving simulators relate to limitations of the simulators, scenario validation as well as 651 participant adaptation. A discussion on these issues follows.
- The potential usefulness of the simulator in providing valuable information on driving 652 653 performance has been shown in several studies. This is evident particularly when driving 654 performance assessment on simulators are combined with neuro-psychologic testing. The reviewed studies provide evidence that driving performance impairments measured in the 655 simulators relate to decrements in cognitive tests (Rizzo et al., 2001; Uc et al., 2006; Stolwyck et 656 al., 2006; Mullen et al., 2008; Park et al., 2007; Frittelli et al. 2009; Devlin et al., 2012; 657 658 Patomella et al., 2006; Vaux et al. 2010). The studies reviewed have stressed the need: to develop widely accepted (operational) definitions of safe and unsafe driving; to examine which 659 components more effectively measure driving performance; to examine in a systematic way the 660 661 interactions of driving complexity with age-related cognitive decline and the effects of brain injuries and neurological and neurodegenerative diseases on cognition (in order to get insight 662 663 into the events leading to driving errors); to assess the components of safe driving in a standardized and consistent way; and to determine sensitivity and specificity of simulation tests 664 in impaired subjects (including specific neurologically impaired populations) (Akinwatan et al., 665 2012; Dijksterhuis et al., 2011; Ball and Ackerman, 2011; Rizzo, 2011; Cantin et al., 2009; 666 667 Mullen et al., 2008; Park et al., 2007).
- 668 The need to develop and use standardized sets of scenarios and scenario components in 669 performance assessment – including the assessment of individuals with specific impairments – is

670 stressed among researchers. In regard to driving assessment in subjects with medical disorders, Rizzo (2011) notes that the particular scenario to use depends on the specific clinical question 671 being asked and suggests that "to develop appropriate simulator scenarios a hypothesis-based 672 673 deductive approach to behavioral diagnoses (such as unsafe driving) is necessary". Uc and Rizzo 674 (2011) point out that "scenario design should aim at discerning the effect of cognitive, visual and 675 motor deficits on driving in these conditions and should take practical difficulties of 676 implementation into consideration". In age-group comparisons, in order to reveal age 677 differences, it is important that researchers investigate performance in tasks which are neither too 678 easy nor too difficult (Trick and Caird 2011).

- 679 The studies reviewed indicate that basic measures of driving in the simulator predict outcomes in high-risk situations in drivers with AD (Uc et al., 2000), and disproportionate effect in 680 681 performance at operational level when a concurrent task was present (Stolwyck et al 2006). 682 Operational and tactical levels are more relevant in simulator experimental settings. These levels 683 influence each other with the operational level characterized by increased primacy when compared to tactical tasks (Schaap et al. 2008). For an experienced and familiar driver, under 684 685 normal conditions, the control tasks are performed automatically and without cognitive control (skill-based task performance). The simulators provide the possibility to measure (the limits of) 686 performance in control (operational tasks) which involve time-pressured behaviors in a safe and 687 688 controlled way (such as acceleration, lane position, braking and maneuvering to avoid crashes, 689 ad steering control) that may be challenged in emergency or unexpected situations.
- 690 The studies reviewed have shown the need to investigate the abilities of individuals (including 691 cognitively impaired individuals) to appropriately prioritize particular aspects of performance and especially whether basic driving abilities are challenged in complex tasks or in concurrent 692 693 tasks conditions. Tactical tasks take more time to complete and refer to more complex situations 694 involving interactions with other road users and relate to risk perception, risk taking, gap 695 acceptance, choice of lane, choice of speed, space management, visual search behavior, visual 696 attention and allocation (Staplin et al. 2010). Intersections, yielding right of way, driving with a 697 secondary task, passing and overtaking, merging and lane changing are included in experiments 698 designed to assess driving performance. In tactical tasks, the occurrence of safety errors in the 699 execution of these tasks are more probable (Staplin 2010) and would allow the assessment of the 700 specific mechanisms in question. Scenarios that have been used in persons with a variety of 701 medical impairments include run-off-road on curves, car-following and rear-end collisions, 702 intersection incursion avoidance, interaction with emergency vehicle/pedestrians, and merging 703 with the potential for side impact collisions (Uc and Rizzo, 2011; Rizzo, 2011).
- 704 Compensation is highly relevant to older drivers (Hakamies, 2004; Hakamies and Peters, 2000). 705 Older drivers largely have extensive driving experience. As experienced drivers they 706 consequently possess cognitive driving skills (such as anticipation and hazard recognition) that 707 allow them to compensate for the difficulties they have due to age-related declines. 708 Compensation, however, is also subject to functional limitations (Knoblaugh et al. 1997) and 709 available time. Compensation might occur automatically as a reaction to cognitive overload (De 710 Raedt et al. 2000). When task demand begins to exceed capability, compensation may be related 711 to performance degradation or where the demand is too high and exceeds capability (overload 712 conditions) this would result in inappropriate task prioritization or a severe decline in basic
- 713 driving skills (Fuller 2005).
- The occurrence and the safety potential of tactical adaptations have been observed in reviewed studies (Andrews et al., 2012; Cantin et al. 2009; Benedetto, 2008; Stolwyck et al., 2006). By

716 increasing task complexity, the effectiveness of the compensatory potential still available to the 717 drivers might be possible to be assessed. It seems that appropriate experiment design (research 718 question, dependent and independent variables, scenarios) combined with cognitive tests 719 involving relevant cognitive constructs might allow researchers to identify the occurrence and the 720 effectiveness of compensatory behavior.

When assessing cognitively impaired drivers, presentation of driving conditions of increasing complexity posing them sufficient challenge in a simulator allows the identification of performance inadequacies related to impairments in different cognitive domains and the examination of their interactions (Rizzo et al., 2001; Benedetto, 2008; Vaux et al., 2009; Cantin et al., 2009; Dijksterhuis et al., 2011). Such experimental designs are related to within-subject design which tends to be more powerful since each driver serves as their own control (Dawson et al., 2011).

- Dijksterhuis et al. (2011) recognize the usefulness of the simulator as a research tool when investigating the effects of independent measures in a relative sense. However, it needs to be determined whether driving performance as measured in the simulator is predictive of driving performance on the road. Simulator validity is dependent on the particular simulator and the specific driving task (Shechtman et al., 2009). Simulator validation studies focus either on how
- closely the simulator dynamics and visuals replicate the vehicle that is being simulated or on
  external validity which is tested by simulator users (Shechtman et al., 2009; Espie et al., 2005).
  The latter refers to the generalizability or predictability of results, which is dependent on a
- race specific simulator, a specific driving task and/or a specific population (Shechtman et al., 2009).
- The issue of driver response validity of simulators particularly in assessing individuals with cognitive impairments which are either age-related or related to neurodegenerative and other medical impairments is considered of significant importance. Shechtman et al. (2009) provided preliminary evidence regarding the generalizability of the results of assessing driving errors when negotiating turns at intersections in their simulator to the road under the same testing conditions.
- When conducting driving simulation experiments it is essential that adaptation syndrome is taken into account if they are to be valid. Studies reviewed suggest that the adaptation period is likely to depend on the combination of simulator fidelity and the cognitive tasks involved; roads with different characteristics (complexity/demand) require different adaption time; participant's adaptation to a driving simulator is task independent as long as the practice scenario provides them with the chance to repeatedly practice a scenario using pedals and steering.
- 749 When driving simulators are used in driving performance assessment their limitations should be 750 taken into consideration. Moreover, a major challenge to researchers when designing an 751 experiment is to choose effective and well defined measures of performance as well as scenarios 752 that would allow the manifestation of driving behavior problems and the identification of the 753 specific mechanisms of impairment that underlie them. When they are used either as a 754 complement to road testing (enabling assessment in emergency situations), or as a tool to 755 understand mechanisms of driving impairment (in combination with tests evaluating abilities important to safe driving) in populations with medical disorders, it is imperative to validate the 756 757 results before conclusions regarding their generalizability are made.
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