

### Impact of the driver's visual engagement on situation awareness and takeover quality

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#### 1 Impact of the driver's visual engagement on situation awareness and 2 takeover quality

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#### 27 ABSTRACT

28 During automated driving (SAE Level 3), drivers can delegate control of the vehicle and monitoring of the road to an automated system. They may then devote themselves to tasks 29 30 other than driving and gradually lose situational awareness (SA). This could result in 31 difficulty in regaining control of the vehicle when the automated system requires it. In this 32 simulator study, the level of SA was manipulated through the time spent performing a non-33 driving task (NDRT), which alternated with phases where the driver could monitor the 34 driving scene, prior to a critical takeover request (TOR). The SA at the time of TOR, the 35 visual behaviour after TOR, and the takeover quality were analysed. The results showed that monitoring the road just before the TOR allowed the development of limited 36 37 perception of the driving situation, which only partially compensated for the lack of a consolidated mental model of the situation. The quality of the recovery, assessed through 38 39 the number of collisions, was consistent with the level of development of SA. The analysis 40 of visual behaviour showed that engagement in the non-driving task at the time of TOR induced a form of perseverance in consulting the interface where the task was displayed, 41 to the detriment of checking the mirrors. These results underline the importance of 42 43 helping the driver to restore good SA well in advance of a TOR.

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45 Keywords: Automated driving; Taker-over request; Human factors; Non-driving task;
46 Situation awareness.

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- 49 **1. Introduction**
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51 Developments in the automotive industry have contributed to the creation of vehicles in 52 which increasing numbers of functions are delegated to an automated system. The Society 53 of Automotive Engineers International (SAE) has defined six levels of automation, from 54 the lowest level (Level 0) to the highest level of automation (Level 5; SAE International, 55 2016). At Level 3, the driver can delegate vehicle control and road monitoring to the automated system on roads that meet certain conditions. This delegation allows drivers to 56 57 engage in non-driving tasks while the driving is automated. However, the driver must be 58 receptive at all times to a request to intervene from the automation and ready to serve as a 59 "fallback ready user". The driver must take over manual control of driving or, if that is not 60 possible, must achieve a minimal risk condition. The takeover request (TOR) can occur for two reasons: first, the system may anticipate that the vehicle is approaching the end of its 61 62 operational domain, in which case it will be a planned and non-critical takeover. The 63 second reason is that the system may be not able to handle a situation, or a problem may 64 occur that prevents the system from operating properly.

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66 Unplanned critical takeovers are sometimes characterised by a high level of hazard with a short time to regain control of the vehicle. Numerous scientific works have studied the 67 68 risk factors during the takeover. Zhang et al. (2019) synthesised the results of 129 studies 69 analysing the takeover time according to various criteria, such as time budget (from 2 s to 70 15 s), traffic complexity, and driver age. They concluded that performing a non-driving task, even without a handheld device, increased the takeover time compared to not 71 72 performing such a task. Task modality, classified as either auditory or cognitive, did not 73 influence the takeover time. Other studies have focused on situational awareness (SA) and 74 takeover (e.g. Endsley, 2018; Ma & Kaber, 2005; White et al., 2019; Winter et al., 2014). 75 The present study contributes to these efforts by studying how a non-driving related task 76 (NDRT) can affect the driver's SA and the takeover quality in a critical situation.

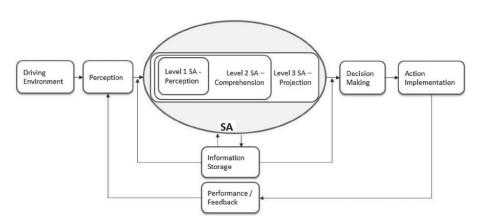
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78 A major concern in the delegation of vehicle control and road supervision is that 79 automated systems can cause the driver to be "out-of-the-loop". To formalise this 80 problem, Merat et al. (2019) distinguished three states. When the driver acts on the 81 vehicle's controls and supervises the road, they are "in-the-loop". If they delegate the 82 operational control of the vehicle to the automated system but continue to monitor the 83 road scene, they are "on-the-loop". When the driver no longer monitors the situation, they are considered to be "out-of-the-loop". In Level 3 automation, drivers may be on-the-loop 84 85 if they supervise the road or out-the-loop if they are engaged in non-driving activities. Potential drivers of autonomous vehicles have been shown to want to perform new 86 87 activities that require attentional resources such as reading, writing messages, eating, 88 drinking, browsing the internet, or making phone calls (Pfleging et al. 2016; Shi & Frey, 89 2021). Drivers can thus be expected to engage in non-driving activities that may divert 90 their attention from the road (Naujoks et al., 2016). In turn, that engagement can lead to 91 impaired SA.

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93 Situational awareness is a dynamic process that can be defined as the perception and 94 understanding of a context, which enables the individual to anticipate an impending 95 scenario. Endsley & Kiris (1995) proposed a three-level model. The first level of SA is the 96 perception of elements relevant to the task in the current situation. At the second level, the 97 operator integrates the perceived elements to understand their impact on the current 98 objectives. At the last level, the operator anticipates the dynamics of the elements to 99 predict how they will affect the environment and the operator's goals. In other words, SA displays different levels of information elaboration. The perception of the context (Level 1) is based on immediate information, which is processed to give meaning to the current situation (Level 2). Because the construction of a mental model allowing projection into the future (Level 3) requires the integration of information over a longer period, monitoring of the road scene determines the quality of SA. Merat et al. (2019) illustrated how SA fits into the driving activity (see Figure 1).

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Figure 1. SA in driving information processing; reproduced from Merat et al (2019)

During manual driving, performing a secondary task or talking with another person can impair SA (Gugerty et al., 2003; Heikoop et al., 2018; Ma & Kaber, 2005). For example, Green (1999) showed that self-paced glances at in-vehicle controls and displays typically did not exceed 1.2 s or 1.5 s. Rockwell (1988) also showed that drivers were loath to wait more than 2 s to obtain road information. This 2-s rule can be considered the critical value for distraction in cars. It appears to be the interval beyond which the absence of road scene monitoring critically impairs the perceptual determinants of SA.

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119 Because drivers are prone to be distracted and no longer control the vehicle, the 2-second rule ceases to be valid in highly automated vehicles. For example, Zeeb et al. (2015) performed a 120 121 simulator study in which participants had to drive for 26 min in highly automated driving. 122 They had to perform "Texting" and "Internet Search" on the multimedia system. By the end 123 of the driving task, some drivers spent up to 55 s without looking at the road. Drivers who 124 spent considerable time without looking at the road showed longer braking reaction times 125 and higher collision rates than those who did not. Winter et al. (2014) also presented a 126 meta-analysis of 32 studies about the impact of adaptive cruise control and highly automated 127 driving on workload and SA. Highly automated driving impaired SA when the driver chose to 128 perform an NDRT at the expense of monitoring the driving scene (Carsten et al., 2012; Merat 129 et al., 2019). Marti et al. (2021) reported that the difficulty of a NDRT performed before a 130 TOR did not influence the success of a critical takeover. However, looking at the task display 131 at the time of TOR increased the risk of collision.

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Studies in various fields have investigated the relationship between situation awareness and visual strategies. In the air traffic control domain, Moore & Gugerty (2010) found that controllers' SA score depended on visual attention paid not only to the most important aircrafts, but also to surrounding aircrafts. Too much visual focus on important aircrafts can create attention tunnelling and degrade SA. Van de Merwe et al. (2012) studied the gaze behaviour of pilots when a malfunction occurred during a flight. Gaze entropy (visual

139 scanning activities around the cockpit) increased as SA decreased. Gartenberg et al. (2014) 140 tried to characterize SA recovery after a task interruption. Shorter fixation durations, increased the number of objects scanned, longer resumption lags, and a greater likelihood 141 142 of refixating objects that were previously looked at were identified as indicators of SA 143 recovery. More closely related to the autonomous vehicle domain, Kunze et al. (2019) 144 showed that drivers who performed shorter fixations in a peripheral search task during the 145 40 seconds before a TOR exhibited higher SA scores. In another study, Liang et al. (2021) 146 found that greater gaze dispersion and more time looking at the road scene were positively 147 correlated with SA scores. They also showed that previous engagement in a NDRT impairs 148 SA after the TOR. Thus, SA depends on an appropriate distribution of visual attention.

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150 It is therefore reasonable to assume that the quality of SA depends on the driver's visual behaviour and determines the driver's ability to safely regain control of the vehicle. This is 151 152 especially true in complex situations, such as unexpected obstacle avoidance. A question 153 is how long it takes to reconstruct a sufficiently elaborated SA. It is hypothesised that if 154 the driver's perception of the immediate context is sufficient (Level 1 SA), looking at the 155 road 2 s before resuming vehicle control would be effective to obtain a good quality of 156 takeover. This outcome would be independent of the driver's visual behaviour during the 157 preceding automated driving phase. By contrast, if there is an advantage to having more elaborate SA (i.e., an appropriate mental model of the situation built over time), takeover 158 159 quality should improve when the driver has not been distracted for long before resuming 160 control.

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162 The present study examines the impact of visual distraction on the quality of vehicular 163 control. Two temporal windows of visual engagement in a NDRT preceding the TOR are 164 distinguished. This gives rise to four experimental conditions in which the gaze behaviour 165 and the quality of the takeover will be analysed.

- The first group of participants will not have a NDRT to perform. They will have every
opportunity to build a good Level 3 SA over the course of autonomous driving and they
will be attentive to the road scene when the TOR is delivered.

169 - The second group of participants will be placed in identical conditions to the previous170 one, except that they will be distracted by the NDRT for the two seconds before the TOR.

- 171 This condition will therefore allow to evaluate the influence of impairing the immediate 172 perception of the road scene in drivers who have had time to build up a good SA 173 beforehand.
- The third group will have to perform the NDRT during an extended period of 5 minutes
  but 2 seconds before the TOR. The NDRT interruption will allow the driver to reacquire a
  vision of the immediate driving environment right before the TOR intervenes. These
  participants will therefore not be able to build and update SA during the NDRT, but will
  not be distracted from the road scene at the time of the TOR.
- The last group of participants will have to perform the NDRT until the TOR. SA will be
  the most severely impacted and the TOR will intervene when the driver's gaze is not on
  the road. The driver will only have the time between him and the obstacle to analyse the
  situation and decide on the manoeuvres to be executed.
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#### 186 2. Materials and Methods

- **2.1. Participants**
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189 There were 88 participants (33 women, 55 men) aged between 18 and 56 years (M = 24.01, 190 SD = 7.67) in the study. They all held a valid driving licence and had average driving experience of 7,704 km/year (SD = 8500, Min = 200, Max = 40000). They had normal vision 191 192 or vision corrected with contact lenses. All participants gave written informed consent in 193 accordance with the Declaration of Helsinki. The experiment was approved by the non-194 interventional research ethics committee of Nantes University (CERNI, IRB #IORG0011023; 195 approbation #08072021-3).

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#### 2.2. Experimental setup

Participants drove on a fixed-base simulator (see Figure 2) consisting of an adjustable seat, a steering wheel with force feedback, a gear lever, clutch, accelerator and brake pedals. The software SCANeR Studio (v1.8) displayed the driving scene on three screens at a field of view of about 120°. An 11" tablet, positioned about 35° to the right and 15° below the direction straight ahead of the driver's head, served as the centre console where the NDRT was displayed.

в СМ **Central Screen Right Screen** Left Screen LM tablet

Figure 2. A. The LS2N driving simulator. B. Areas of interest considered for the analysis of gaze behaviour: the road scene in grey, the left (LM) and central (CM) mirrors in blue and the tablet in orange.

211 Gaze behaviour was recorded via a Smart Eye Pro eye tracker (version 5.9), which included 212 213 four cameras: two below the central screen and one below each lateral screen. Gaze and 214 vehicle data were recorded and synchronised at 60 Hz. 215

2.3. Procedure

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#### **2.3.1. Installation and instruction**

221 222 First, participants were invited to settle in the simulator seat and the eyetracker calibration 223 was performed. Then, participants were informed about the operation of an automated SAE 224 Level-3 vehicle. They were asked to switch from manual to automated driving when the 225 automated system required it, using a touchscreen button on the tablet. A confirmation 226 pictogram was displayed (see Figure 3B). Then, participants could release the control of the 227 vehicle by removing their hands from the steering wheel and their feet from the pedals. In the 228 case of an unplanned TOR, a red pictogram associated with an auditory warning was 229 displayed. The drivers had 8 s to resume control of the vehicle, either by pressing a 230 touchscreen button on the tablet or by acting on the pedals (accelerator pedal threshold at 1% 231 of total possible depression, brake pedal threshold at 1 N) or steering wheel (torque threshold

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at 1 N.m). During automated driving, participants were instructed to perform an NDRT. As Shi & Frey (2021) indicated that participants primarily wanted to engage in reading, the task consisted of reading aloud a text that scrolled automatically on the side tablet. The text was an excerpt of the story of Tom Sawyer. Participants were asked to read the story as they would read it for another person. After pretests, the scrolling speed was chosen to make the task demanding enough that participants did not have time to look at the road.

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Figure 3. Pictograms displayed on the HMI: A: autonomous driving available; B: autonomous driving activated; C: take-over request (8s).

#### **243 2.3.2.** Scenario

Prior to conducting the experimental trial, participants completed two familiarization trials.
The first allowed participants to test the transition between manual and autonomous driving 2
times. In the second training trial, they were asked to perform the NDRT in the autonomous
driving phase.

249 Then, the experimental trial was carried out. Participants drove on a 3-lane highway at 110 250 km/h, with moderate traffic, for 8 min before a critical unplanned TOR happened. They 251 started on a highway insertion ramp in manual mode. One minute after entering on the highway, they were invited by the system to switch to automated mode. After 2 minutes of 252 automated driving, 5 minutes remained before the TOR. During that time, the task of the 253 254 participants (performing the NDRT or not) depended on the experimental condition (see 255 below). As soon as the scenario ended, all screens were switched off and the participants 256 reported their SA. This was performed on a touch tablet. Participants were asked to report the 257 vehicles they were aware of at the time of the TOR on a scheme representing the road scene 258 in top view. Their own vehicle and the obstacle were already placed, so they only had to place 259 other vehicles they had seen before the TOR.

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#### 2.3.3. Unplanned critical takeover

At the end of the experimental trial, participants had to regain control of the vehicle in a complex critical situation (see Figure 4) that unfolded as follows:

- (1) 5 min before the TOR, the participant's vehicle started to follow a lead vehicle with atime headway of 3 s.
- 267 (2) 2 min before the TOR, the participant's vehicle and the lead vehicle began to move268 into the centre lane to overtake two slower vehicles.
- (3) 1 min before the TOR, two rapidly moving vehicles travelling 2 s apart –
  approached from behind in the left lane. They travelled at 120 km/h and started to
  overtake the participant's vehicle. The first of these fast vehicles was called FV1 and
  the second FV2. They were visible in the central and left mirrors 20 s before the TOR.

- (4) At 1 s before TOR, the lead vehicle changed lanes to avoid a vehicle that had stoppedacross the right and centre lanes.
- (5) At the time of TOR, participants had only a partial direct view of the obstacle vehicle,
  because the lead vehicle was still changing lanes. The emergency TOR was delivered.
  If the NDRT was in progress, it was deactivated.

278 Participants had 8 seconds to resume control of the vehicle before reaching the obstacle (time 279 to collision). To successfully intervene, participants could either brake and try to move 280 between the two fast overtaking vehicles in the left lane or could change lanes after they had 281 both passed. Alternatively, they could stop in the centre lane before reaching the obstacle.

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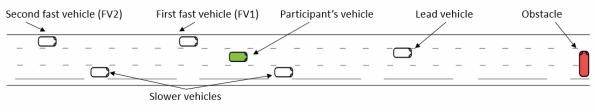


Figure 4: Critical case

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Although the time to collision was 8 s at the moment of the TOR, drivers had less time to regain SA due to the movements of other vehicles. Indeed, FV1 disappeared in the blind spot 3.2 s (SD = 0.1) after the TOR. If participants did not detect the vehicle while it was visible in the mirrors, they were likely to initiate a lane change without being aware of the vehicle's presence; this would result in a collision or a late abortion of the manoeuvre. For the analysis of gaze behaviour after the TOR, we refer to this crucial 3.2-s period as the "critical phase".

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#### 2.3.4. Experimental conditions

Participants were instructed to continuously monitor the road scene, except when they
were asked to perform the NDRT. The session started with 1 min of manual driving,
followed by 2 min of automated driving without any NDRT. The last 5 min of the trial
depended on the experimental condition the participant had been assigned to (see Figure
5):

- 301 302
- Full SA: No NDRT was required.
- SA\_NDT: The NDRT was required only during the last 2 s before the TOR.
- NDT\_SA: Participants had to perform the NDRT during the 5 min, except for during the last 2 s before the TOR.
- Full NDT: The participant had to perform the NDRT continuously up to the TOR.

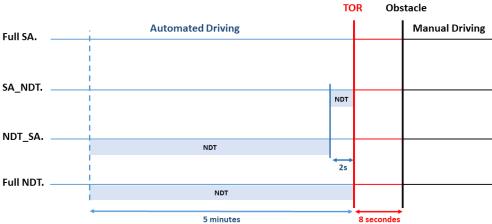


Figure 5. Timeline of the experimental conditions

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311312 Participants were randomly assigned to one of the experimental conditions.

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## 314 **3. Data Analysis**315

The effects of the experimental conditions on the number of collisions and the number of times FV1 was reportedly perceived were analysed using chi-square tests. Because the number of times FV2 was reported was too low, Fisher's exact test was used.

319 Gaze behaviour during the critical phase (post-TOR) was analysed by considering three 320 areas of interest (AOIs): the tablet, the left and centre mirrors, and the road scene (see 321 Figure 2B). For each participant, we analysed gaze data to extract fixations and saccades.

First, the time between the TOR and the first fixation toward the road or the mirrors was calculated for each participant. Shapiro's test showed that the dataset was not normally distributed. Hence, a non-parametric method (Kruskal-Wallis) was used to assess the effect of the experimental conditions.

326 Second, for each AOI considered independently, the numbers of participants who made at 327 least one fixation at that AOI after the TOR were compared using the chi-square test.

The proportion of fixation time spent on the different AOIs was also compared. For each participant, this period corresponded to the cumulative fixation time on each AOI, divided by the total fixation time during the critical phase. Since the dataset was not normally distributed, the Kruskal-Wallis test was used. Saccade time was not taken into account.

Finally, the evolution of gaze distribution during the 3 seconds after the TOR was scrutinized. For each second during this period, the percentage of time spent on each AOI was calculated. As the dataset was not normally distributed, we used the Kruskal-Wallis test to compare the effect of the conditions on the mean percentage of time for each AOI at each second.

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#### **338 4. Results**

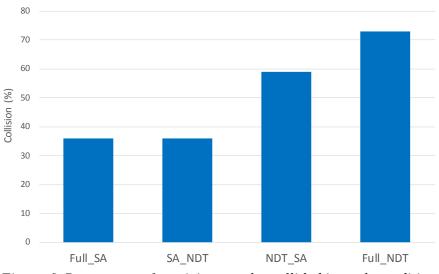
- Eighty-eight trials were performed in total, one for each participant. Of these, 45 resulted
  in a collision with another vehicle: 23 with FV1, 10 with FV2, and 12 with the obstacle.
- 342 No collision occurred with the vehicles travelling in the right-hand lane.

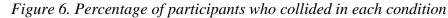
## 343344 4.1. Effect of conditions on the occurrence of collisions

When considering the occurrence of collisions, a main effect of the experimental conditions was found ( $chi^2 = 8.50$ , p = <.05). Figure 6 shows that the percentage of collisions was higher in the Full\_NDT condition (73% or 16/22 participants) than in the NDT\_SA condition (59% or 13/22 participants). In turn, the NDT\_SA condition resulted in more collisions than either the Full\_SA or SA\_NDT conditions (36% or 8/22 participants for each of the latter groups).

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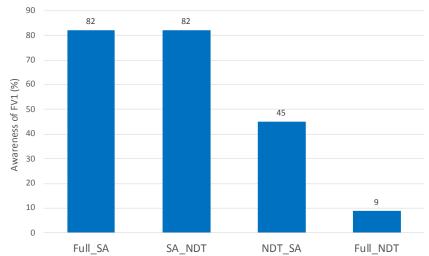
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#### 4.2. Effect of conditions on the awareness of the first vehicle

359 Since none of the participants attempted to avoid the obstacle from the right, only the fast 360 vehicles in the left lane were relevant. FV2 was rarely reported by participants, as the distance 361 made it relatively inconspicuous in the mirrors (4/22 participants for Full\_SA, 6/22 participants for SA\_NDT, 3/22 participants for NDT\_SA, and 0/22 participants for 362 363 Full\_NDT). The results of the Fisher exact test (p > .05) did not show any effect of the 364 conditions on drivers' awareness of FV2. By contrast, as shown in Figure 7, FV1 was often 365 reported in the Full\_SA and SA\_NDT conditions (82% or 18/22 participants in both cases). It was reported less often in the NDT\_SA condition (45% or 10/22 participants) and rarely (9% 366 or 2/22 participants) in the Full\_NDT condition (chi2 = 32.267, p <.05). 367

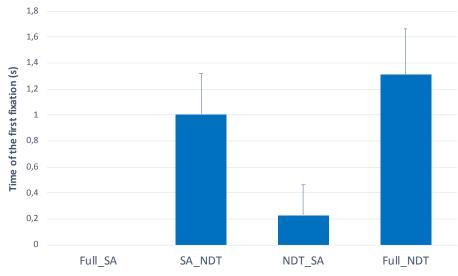


Full\_SA SA\_NDT NDT\_SA Full\_NDT
 Figure 7. Percentage of participants in each experimental condition who were aware of FV1
 at the moment of TOR

4.3. Effect of conditions on fixations during the critical phase after TOR

#### 4.3.1. First fixation after the TOR on the road or the mirrors

Figure 8 shows a significant effect of the experimental conditions on the time of the first fixation to the road or the mirrors ( $chi^2 = 47,835$ , p < 0.05). While almost all participants in the Full\_NDT and SA\_NDT groups looked at these AOIs at the time of the TOR or shortly thereafter, those in the SA\_NDT and Full\_NDT groups took more than a second on average to do so.



Full\_SA SA\_NDT NDT\_SA Full\_NDT
Figure 8. Mean time of the first fixation to the road or one of the mirrors after the TOR
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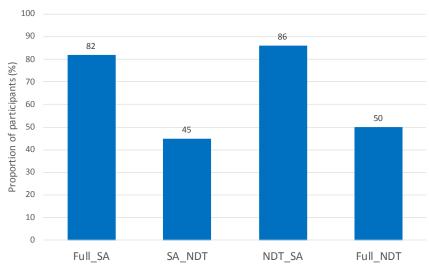
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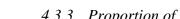
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4.3.2. Number of participants who looked at AOIs

392 More participants made fixations to the left and/or central mirrors in the Full\_SA and 393 NDT\_SA conditions than in the Full\_NDT and SA\_NDT conditions ( $chi^2 = 13.149$ , p < 0.05). 394 No significant effect was found for fixations towards the road or the tablet for the various 395 experimental conditions (see Figure 9).



397 398 Figure 9. Percentage of participants in each condition who made fixations at the left and 399 centre mirrors at least once



#### 4.3.3. Proportion of fixation time spent on AOIs

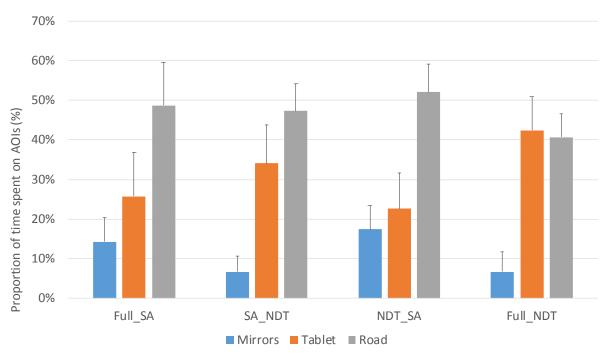
403 Figure 10 shows the proportion of fixation time spent looking at the three AOIs. Participants 404 spent more time to look at the left and central mirrors in the Full\_SA and NDT\_SA conditions than in the Full NDT and SA NDT conditions ( $chi^2 = 17.35$ , p < 0.05). Conversely, they 405 spent more time looking at the tablet in the Full\_NDT and SA\_NDT conditions than in the 406 407 Full\_SA and NDT\_SA conditions ( $chi^2 = 14.83$ , p < 0.05). Time spent to make fixations at the 408 road was not significantly different between the different conditions ( $chi^2 = 1.17$ , p = 0.328).



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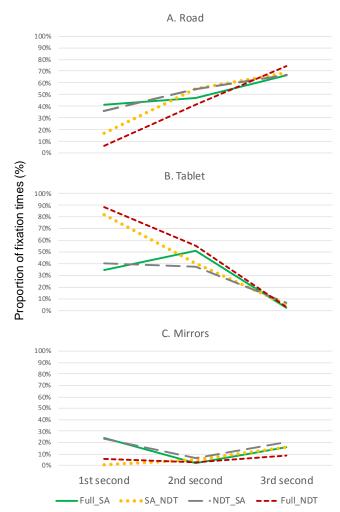
Figure 10. Influence of experimental condition on distribution of fixation during critical phase after TOR. (The three AOIs are depicted in Figure 2.B)

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417 Figure 11.A represents the percentage of time spent looking at the road during each of the first 418 3 seconds following the TOR. An effect of the experimental condition is observed only for the first second ( $chi^2 = 32.077$ , p < 0.05). The Full\_NDT group spent significantly less time on 419 the road compared to NDT\_SA and SA groups. The SA\_NDT group only differed from the 420 421 Full\_SA group. The same analysis was performed on the time spent looking at the tablet (see 422 Figure 11.B). We also found an effect of conditions only for the first second ( $chi^2 = 42.824$ , p < 0.05). The Full SA and NDT SA groups were significantly different from the Full NDT 423 and SA\_NDT groups. Considering now the time spent on the centre and left mirrors (see 424 Figure 11.C), again, the effect of the conditions was found only for the first second ( $chi^2 =$ 425 426 23,388, p < 0.05), with the SA\_NDT group showing significantly less time spent on the 427 mirrors than the Full\_SA and NDT\_SA groups.

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#### 437 5. Discussion

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439 In this study, we manipulated the driver's ability to monitor the driving scene over a long 440 period or only during the 2 s preceding a TOR. By doing so, we were able to assess the 441 importance of being on-the-loop at the critical moment and thus being able to rely on 442 relatively elaborate SA. In other words, we investigated whether giving drivers 2 s before they 443 resumed control of the vehicle was sufficient to restore SA. To assess this, we asked drivers to 444 indicate whether they had been aware of vehicles in the driving environment just before the 445 TOR. Our results support the idea that 2 s of distraction did not impact SA if it was previously 446 adequate. In both the SA\_NDT condition and the Full\_SA condition, most drivers reported 447 being aware of the vehicle coming fast in the left lane. However, recovering the ability to 448 monitor the driving scene just prior to the TOR was useful for drivers who had been distracted 449 in the preceding minutes. Drivers in the NDT SA condition reported the presence of FV1 450 more often than those in the Full\_NDT condition. This result suggests that stopping the NDRT 2 s before the TOR allowed the development of a degree of SA, which partially 451 452 compensated for the lack of a consolidated mental model of the situation.

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454 Having good SA does not necessarily imply a smooth takeover. Indeed, the critical situation 455 set up in this study was really difficult to negotiate, which explains the high number of 456 collisions. The role of the NDRT in the occurrence of those collisions has been 457 demonstrated. However, the complexity and kinematics of the driving scenario have been 458 identified in the literature as one of the factors responsible for the reduction of take-over 459 quality (Gold et al., 2016; Louw, Markkula, et al., 2017; Radlmayr et al., 2014; Scharfe et 460 al., 2020; Zhang et al., 2019). Another essential point is the taker-over time budget in 461 critical situations. Damböck & Bengler (2012) tested time budget of 4 s, 5 s, 6 s and 8 s. They 462 found that drivers crashed more often in all time budgets except for the 8 s condition 463 compared to manual driving. Gold et al., (2013) also found a better take-over performance for 464 a 7s time budget than for a 5s time budget. In Mok et al. (2017) drivers could handle a critical 465 situation with a take-over time between 5s and 8s whereas they were practicing an active 466 NDRT. Our results showed that even with an 8s time budget and a good SA, drivers could 467 have difficulty regaining vehicle control in a complex situation. Indeed, 1/3 of drivers had a collision in the Full\_SA and SA\_NDT groups, even though they reported the presence of 468 469 the most dangerous vehicle in the left lane. In situations similar to the critical case we 470 used, returning control of the vehicle to the driver would not be the best solution. It would 471 probably be better for the automated system to decide, based on the assessment of the 472 criticality of the situation, to perform emergency braking rather than to issue a TOR.

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474 However, the quality of the takeover was consistent with the level of elaboration of SA. 475 Drivers in the Full\_SA and SA\_NDT groups passed the critical case with the same level of success (64%), which was notably better than in the NDT SA group (41%) – which in turn 476 477 was better than the performance of the Full\_NDT group (27%). Thus, just as for SA, drivers 478 benefited from having been able to supervise the driving scene well before the TOR. The final 479 2 s were not sufficient to obtain a good quality of takeover if SA was low to begin with.

480 Previous studies have shown that the level of mental load associated with an NDRT 481 performed at the time of a TOR was not predictive of the takeover quality (Bueno et al., 2016; 482 Marti et al., 2021). This point does not fit well with the idea that the more distracting an 483 NDRT is, the more difficult takeover will be. The main difference between those studies and 484 ours is that we manipulated the duration of engagement in the NDRT before takeover, rather 485 than its difficulty level. In addition, Marti et al. (2021) showed that the only determinant of 486 successful critical control was whether the driver was looking at the road rather than a 487 peripheral NDRT at the time of the TOR, regardless of the difficulty of the NDRT. This finding might have reflected in the outcomes of our experiment if participants who looked at 488 489 the tablet at the time of TOR (SA\_NDT and Full\_NDT) had shown greater difficulty in taking 490 over than did undistracted drivers (Full\_SA and NDT\_SA). This was not the case. Instead, the 491 analysis of gaze behaviour after the TOR showed a perseverance effect, with drivers in the 492 SA\_NDT and Full\_NDT conditions spending more time looking at the tablet and less time 493 checking their mirrors. This is consistent with the observation that the first fixation to the road 494 of the mirrors was performed about 1 s later in those conditions. The drivers who were not 495 performing the NDRT at the time of the TOR, even if they had spent about 5 min doing it 496 before (NDT SA group), did not take significantly more time to look at the road or the 497 mirror. Additional analyses were conducted to examine in more detail the evolution of gaze 498 distribution during the seconds after the TOR. They showed that the perseverance effect 499 lasted only about 1 s. This is consistent with Louw, Madigan, et al. (2017) who observed that 500 out-of-the-loop drivers spent less time looking at the road centre during the first second after 501 an unexpected alert TOR. In our case, it appears that participants performing the NDRT kept 502 on looking at the tablet even though only a pictogram requesting to takeover was displayed on 503 it. The warning on the centre console could be a source of distraction, whereas the driver 504 should pay full and immediate attention to the reconstruction of SA to ensure the success of 505 the takeover. This suggests that avoiding the display of information on the centre console 506 during a TOR (e.g., blanking the screen) in order to discourage drivers from looking at 507 information on the device would lead to better performance. This hypothesis could be tested 508 in future studies.

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510 That said, the perseverance at looking at the tablet did not result in increased collisions in the 511 SA NDT condition, probably because drivers were aware of overtaking vehicles before performing the NDRT. Taken together, the results suggest that continuous – or at least very 512 513 frequent - monitoring of the road scene is essential for building Level 3 SA, according to 514 Endsley's terminology. Level 3 requires developing a mental model of the situation that 515 allows anticipating its future state. The late disengagement from an NDRT may be sufficient 516 to correctly perceive the immediate environment (SA Level 1); however, it may be 517 insufficient to consider the dynamics of the situation. If the TOR intervenes while the driver is 518 engaged in a task on the central console, this can lead to a form of perseverance in looking at 519 the display. However, this perseverance was less critical to the success of the takeover than 520 having a sufficiently elaborated SA in our use case.

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522 Some studies have explored solution to help the driver to rebuild SA during TOR. For 523 instance, Yousfi (2018) tested blind spot warning devices during takeover. She found that 524 the use of the blind spot detector reduced the collision rate with a vehicle in the left lane. 525 White et al. (2019) proposed a "top-down" guidance check after the emergency TOR; 526 drivers who had this system glanced more at their mirrors than drivers without. In the 527 same vein, Carsten & Martens (2019) advised a set of design principles to improve the 528 human-machine interface for automated cars.

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### 530 6. Conclusions531

532 In our study, we manipulated the drivers' engagement in a reading NDRT to prevent or 533 allow them to build and maintain SA. We have shown that as long as SA was adequate, 534 drivers were able to successfully manage the TOR even if they have been distracted for a 535 short period just before the TOR. Two seconds of NDRT did not degrade SA enough to 536 impair take-over quality. In future work, it would be interesting to further manipulate the 537 duration of distraction periods prior to the TOR to better understand from what time point 538 distraction impacts Level 3 SA. Conversely, it would be interesting to reproduce the 539 experiment by increasing the time given to drivers to rebuild SA in the NDT\_SA 540 condition.

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Participants engaged in the NDRT at the time of the TOR exhibited different visual patterns during the first second of the takeover, with more time spent on the display and less time spent at recovering SA (i.e., looking at the road and checking the mirrors). This raises the question of the best design strategy to inform the driver of a need to regain control without delivering a visual alert that may keep the driver's eyes away from the road scene. Driving aids guiding the gaze towards the important elements to be taken into account could even be useful.

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550 The concept of SA appears central in current issues about vehicle automation. The 551 question of how to help drivers to maintain or restore sufficient SA has not yet been 552 definitely answered. Our results confirm the idea that particular effort must be made by 553 designers to restore a good level of SA quickly when the driver is out-of-the-loop. Further 554 work is needed to better identify the behavioural markers of SA, for example in terms of 555 mirror-checking routines or sequences of actions using the vehicle's controls. To conclude, we refer to Louw et al. (2015), who stated that "until there is an effective strategy 556 557 to help drivers regain situation awareness during the resumption of control from Highly 558 Automated Driving, they should be encouraged to remain in the driving loop".

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#### 561 **Conflict-of-Interest Statement:**

562 The authors declare that they have no conflict of interest.

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