

Do distinct mind wandering differently disrupt drivers? Interpretation of physiological and behavioral pattern with a data triangulation method

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▶ To cite this version:

Guillaume Pepin, Severine Malin, Christophe Jallais, Fabien Moreau, Alexandra Fort, et al.. Do distinct mind wandering differently disrupt drivers? Interpretation of physiological and behavioral pattern with a data triangulation method. Consciousness and Cognition, 2018, 62, pp.69-81. 10.1016/j.concog.2018.04.006. hal-01867964

HAL Id: hal-01867964 https://hal.science/hal-01867964v1

Submitted on 4 Sep 2018

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- 1 Title: Do distinct mind wandering differently disrupt drivers? Interpretation of physiological
- 2 and behavioral pattern with a data triangulation method
- 3
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- 12
- 13 Keywords: Mind-wandering, Task-unrelated thoughts, Driving simulation, Heart rate, Ocular
- 14 behavior, Neuroergonomics

15 1. INTRODUCTION

16 In absence of a specific task demand, it is extremely difficult to prevent our minds to wander 17 (Corballis, 2013). Even during our daily living activities, our minds commonly escape from the here and now (Killingsworth & Gilbert, 2010). Mind-wandering, also known as off-task 18 19 thoughts, is a remarkable evolutionary achievement allowing to plan self-relevant events or 20 remember memorable contents. But although this state can be beneficial, it can also be detrimental by impairing current task performance (McVay & Kane, 2009). For this reason, it 21 22 is damaging for tasks requiring sustained and divided attention, as can be the driving activity. 23 Recent findings seemed to be indicating that all mind wandering may not be equal (Burdett, 24 Charlton, & Starkey, 2016; Galera et al., 2012; Golchert et al., 2017). The present paper intends 25 to delve into characteristics of off-task thoughts to assess their respective detrimental impacts 26 on driving.

27 1.1 Attention and driving

28 Since a decade now, epidemiological studies have indicated that drivers' inattention and 29 distraction accounted for 25 to 50% of road accidents (Mosedale, Purdy, & Clarkson, 2004). Inattention and distraction have been described as states with different impacts on drivers while 30 31 they would be responsible for an equivalent part of accidents (Galera et al., 2012). Although 32 different taxonomies have been proposed to better understand and distinguish these states and 33 their respective impacts on drivers, they are still inconsistently defined. Indeed, the relationship 34 between them remains unclear, generating serious difficulties for researchers to study and measure same phenomenon. In the present study, despite the taxonomy of (Regan & Strayer, 35 36 2014), inattention is defined as a state in which attention have endogenously slid from the main 37 activity to thoughts and feelings. However, inattention does not really exist per se; our mind is always focused on something but not necessarily on the main activity and people are not all 38 39 time aware of where their thoughts are focused. Considering the constant fluctuations of people's mind and conscious, it could be hard to spot the different moments when they are no 40 41 longer focused on the main activity. These fluctuations go from being fully on-task to being in 42 a mind-blanking state (Ward & Wegner, 2013) by going through a wide range of inattentive 43 states. This is why inattention is not a homogeneous state and can be differently critical for safe 44 driving.

45 Inattention gathers several states including Mind-Wandering (MW) which corresponds to a shift in the content of thoughts away from an ongoing task to self-generated thoughts and 46 47 feelings (Smallwood & Schooler, 2015). But even with a specific definition of MW, it remains difficult to unbendingly categorize driver's thoughts and, more broadly, driver's states. Indeed, 48 49 MW is by nature an unprompted, constantly fluctuating state, which presence varies 50 spontaneously over time (Chaparro, 2015). MW does not correspond to all off-task thoughts 51 but to self-generated and stimulus-independent thoughts (SITUTs). For example, thinking to 52 the next step of our trip is not considered as MW because it is related to the driving task. But in 53 a different context, it could be considered as MW showing the difficulty to categorize driver's 54 thoughts. Assessing the presence of MW is even more essential since it represents between 30 55 to 50% of our daily life thoughts and this phenomenon occurs frequently in all forms of activity (Berthié et al., 2015; Bixler & D'Mello, 2014; Killingsworth & Gilbert, 2010). It is also a
recurring phenomenon in driving: four drivers out of five declare having being aware of their
wandering thoughts during their last journey and felt being in this state for more than a third of
the time (Berthié et al., 2015). The occurrence of MW is also negatively correlated with task
demand (Braboszcz & Delorme, 2011; He, Becic, Lee, & McCarley, 2011). As an ubiquitous
state whether in driving or in everyday life, MW can have serious consequences.

62 1.2 Consequences of MW behind the wheel

63 MW, as defined across studies, has adaptive and useful roles in our life such as autobiographical planning, creative thinking or self-reflection (Baird, Smallwood, & Schooler, 2011; 64 Mooneyham & Schooler, 2013; Smallwood et al., 2011). But it is a detrimental state in driving 65 since it interferes with the driving activity. MW with high disrupting content multiplies by 2.12 66 the risk to be responsible for a road accident (i.e., 1.98 for sleep deprivation, 1.76 for 67 psychotropic drug use and 1.06 for MW with little disrupting content; (Galera et al., 2012). This 68 69 higher crash risk could be explained by the perceptual decoupling (Smallwood, McSpadden, & 70 Schooler, 2008) which could underlie the looked-but-failed-to-see phenomenon (Brown, 2005). 71 Perceptual decoupling corresponds to the capacity for the mind to flexibly disengage attentional 72 processes from perception (Smallwood & Schooler, 2015). Besides, changes in the brain during MW (Christoff, Gordon, Smallwood, Smith, & Schooler, 2009; Greicius, Krasnow, Reiss, & 73

74 Menon, 2003; Raichle et al., 2001) will affect driver behavior.

75 MW might degrade the driver's control of the vehicle, with a decrease of speed microregulations and larger lane departures (Lemercier et al., 2014). In addition, it seems to increase 76 77 the reaction time variability and decreases safety distances (Yanko & Spalek, 2014). MW also 78 might cause a failure to scan the environment because of a visual attention focused narrowly 79 on the road ahead (He et al., 2011). Although people control the location of where they are 80 looking, it is physically impossible for drivers to control or manipulate fixations and saccades 81 (Rayner, 1998). Such lack of control suggests that gaze behavior might provide a relevant 82 behavioral marker of directed attention and seems responsive to MW (He et al., 2011). In sum, 83 perceptual decoupling leads to changes in driver's behavior leading to higher frequency of errors, which may explain the important role of MW on the occurrence of accidents. MW also 84 85 leads to changes in drivers' physiological functions. It increases heart rate (Smallwood et al., 86 2004) and leads to changes in several cardiac markers (Ottaviani et al., 2014). It seems therefore 87 appropriate to investigate MW by using behavioral and physiological measurements.

88 But, in the light of previous results (Galera et al., 2012), it seems that all kind of mind-89 wandering are not equal and could generate different level of risk for drivers. Consequently, it 90 seems appropriate to investigate factors involved in the dangerousness of MW. Indeed, a 91 wandering mind can suffer from a higher crash risk because of a highly disrupting content or 92 not. In the driving context, to further improve road safety, it is therefore relevant to investigate 93 how our attention is drawn from the main activity and how the kind of thought would differently 94 affect drivers and potentially increase their level crash risk.

95 1.3 Different kinds of thought

96 As already said, inattention is difficult to assess regarding its spontaneous fluctuation. And this 97 state seems even more complicated to study since it is not uniform. Indeed, inattention corresponds to Task-Unrelated Thoughts (TUTs) gathering all the kinds of inattentive thoughts 98 99 such as Task-Related Interferences (TRIs) or Stimulus-Independant Task-Unrelated Thoughts 100 (SITUTs) (Lemercier et al., 2014; Stawarczyk, Majerus, Maj, Van der Linden, & 101 D'Argembeau, 2011). SITUTs correspond to the typical MW experience. In the past decade, 102 MW has been popularized and drawn scientists' attention to better understand the stream of 103 thoughts and consciousness. Research on this topic has seen a substantial increase boosted by 104 many studies (for a review, see Smallwood & Schooler, 2015). Mind-wandering is generally 105 conceptualized as a two steps state. The onset phase represents the initial moment when the 106 mind drifted away from task focus to off-task focus. The maintenance phase represents the 107 cognitive experience and duration of the off-task episode (Smallwood, 2013). This last phase 108 could be maintained due to failures in attentional disengagement which might be due to the 109 attentional tunneling phenomenon (Dehais, Causse, & Tremblay, 2011). During the onset phase 110 of MW, a first self-generated drift of attention toward an off-task focus occurs. Then, cognitive 111 resources are drawn to sustain the MW state. Different kinds of thought can be generated from

112 these resources.

113 It appears that each thought owns specific features considering its willfulness (intentional vs. 114 self-generated), awareness (aware vs. unaware), content: temporality (past, present or future), 115 emotional valence (positive vs. negative) etc... Internal mental task as well as mentally solving 116 problems can not be considered as MW at once; thoughts features should be dug deeper to 117 classify the kind of thought although all inattentive thoughts belong to the TUTs category. For 118 example, intentional TUTs such as Problem Solving Thoughts (PSTs) (Golchert et al., 2017), 119 and unintentional TUTs such as MW are different states and are characterized by distinctive 120 neural networks (Smith et al., 2006). Moreover, at a brain level, what researchers call MW 121 (unaware and unintentional) arise with an activation of the default mode network (DMN) alone 122 while intentional off-task thoughts such as PSTs arise from an activation of the DMN with a 123 region of grey matter associated with intentional off-task thoughts (Golchert et al., 2017). For 124 this reason, the impact of intentionality of TUTs has to be assessed to explain the disruptiveness of MW (Seli, Ralph, Konishi, Smilek, & Schacter, 2017). Moreover, MW experience are 125 126 unaware (during the onset phase) and self-generated (not primed by an external element) while 127 PSTs are aware and intentional. Those features shape the kind of thought (Spronken, Holland, 128 Figner, & Dijksterhuis, 2016) and the intentionality of MW seems promising to explain 129 different impacts of TUTs (Kopp, D'Mello, & Mills, 2015) on drivers' behavior and 130 physiological signals, and more broadly on their respective dangerousness. Indeed, intentional 131 and unintentional off-task thoughts are underpinned by distinct neural networks which could 132 explain different level of dangerousness (Smith et al., 2006). Considering links between MW 133 and oculometric indicators (He et al., 2011) and the fact that intentional processes are often 134 regulated by executive control allowing operators to regulate their state, it could then generate 135 a higher level of gaze fixity or larger lane departures for MW than for PSTs. More gaze fixity 136 or lane departures might reflect a higher level of dangerousness for the driver. But, when

investigating MW or off-task thoughts in general, studies can suffer from a too low 137 experimental control because of the multiplicity of features, thoughts and experiences lived by 138 139 participants. It is therefore necessary to be cautious on this particular regard and improve the 140 experimental control to avoid biases (Smallwood & Schooler, 2015).

141 1.4 The neuroergonomics approach

In 2003, Parasuraman introduced a new interdisciplinary field called "neuroergonomics," which 142 143 aspires to be the best methodological approach for studying the "brain at work". The interaction 144 between ergonomics and neurosciences would improve our understanding of the brain in action 145 and our ability to study internal states. Using objective and direct data drew from neurosciences 146 or related to it (Parasuraman, 2003) would allow to enhance knowledge about internal mental 147 states. By highlighting behavioral and/or physiological pattern of MW, the first stone of a 148 detection model of MW would be laid. Indeed, it is already possible to use datamining 149 methodology on objective data to detect an internal mental state (Liang, Reyes, & Lee, 2007; 150 Liang & Lee, 2014). Previous authors managed to build and prove the worth of a detection 151 model of distraction. In the same vein, a detection model could be proposed to detect MW while 152 driving. Considering that notable behaviors such as eyes-off the road are not sensitive enough 153 to spot inattention, the search of MW indicators should focus on physiological data and on leaner behavior, almost impossible to control. To achieve this goal, a data triangulation 154 155 methodology has been set up, whereby we use the confluence of behavioral, physiological and 156 self-report data (J. W. Schooler & Schreiber, 2004) to improve the experimental control, 157 essential to study MW (Smallwood & Schooler, 2015). Such method allow validating each 158 dimension as measures of "what they say they measure" (Seth, Dienes, Cleeremans, Overgaard, 159 & Pessoa, 2008).

160 Given a detection model of disruptive MW as a long-term objective, we need to expand our 161 understanding of MW, delving the characteristics underlying this state. More specifically, we 162 need to understand if the intentionality of TUTs will affect the disruptiveness of MW. To do 163 so, it is relevant to investigate how the kind of thought differentially disrupts driver's behavior 164 (speed, lane departure) and impact physiological signatures. Subjective data on the other hand allow classifying drivers' state and then make comparisons between on-task and off-task 165 166 moments using physiological and behavioral metrics. It could therefore be possible to better 167 understand the most deleterious aspect of MW in order to detect it during risk situations while 168 permitting the mind to wander when the driving demand is low.

169 1.5 Aim of the paper

170 There are three main objectives for the present study. First, it intends to assess the physiological 171 and behavioral correlates of Task-Unrelated Thoughts (TUTs) in driving. Second, it intends to 172 explain the differences between intentional (PSTs) and unintentional (MW) off-task thoughts by making a clear distinction between these kinds of thought to better describe their respective 173 174 impacts on drivers. Third, with the use of a data triangulation methodology, it aims at 175 highlighting different physiological and behavioral signatures for Problem-Solving Thoughts

176 (PSTs) and (MW) while driving.

177 2. MATERIALS AND METHODS

178 2.1 Participants

Twenty healthy volunteers (10 males; age 34.15 ± 11.93) consented to participate in the present study. Before starting the experiment, participants were asked about their health status and none declared cardiovascular disease, attentional or sensorial deficit or any comprehension difficulty were included. All of them reported normal or corrected to normal visual acuity and had been holders of a valid driving license for at least 3 years. All participants gave written consent and received 30 euros for their participation. No participant declared having consumed coffee, alcohol or drug the day of experiment.

186 2.2 Experimental design

187 One repeated measure (temporal-windows: [-5.5s; +5.5s]) and one within-subject factor (the
188 kinds of thought: MW and PSTs) were studied.

189 In order to evaluate the impact of the kind of thought on behavioral and physiological 190 measurement, two tasks were proposed. For the first one, participants were told to keep their 191 attention on the driving task as much as possible and to indicate whenever they realized that 192 their attention had drifted away to MW. For that they had to push the headlights close to self-193 report (SR) their MW episodes. MW was defined for participants as "when you are thinking 194 about something that has nothing to do with driving. For example, something you were doing 195 before the experiment, something you will do later or thinking about people or a particular 196 person" (Burdett et al., 2016). Each time they pushed the headlights, participants declared 197 unintentional off-task thoughts. Participants then had to focus on the driving activity. The 198 second task consisted in asking participants to find innovations on specific topics while driving 199 (for instance: "how to improve mobility for disabled or older persons"). Innovations should not 200 exist yet and had to be as sophisticated as possible. Participants had to say "Stop" when they 201 considered their ideas were elaborated enough. Such task allowed generating Problem Solving 202 Thoughts (PSTs) whose characteristics are close to MW except that thoughts are intentional. 203 Moreover, participants were not asked to think about a personal goal or issue to control the 204 content of thought (temporal orientation and distance, emotional valence...). By saying "Stop" 205 at the end of each PSTs phase, participants declared having intentional off-task thoughts.

206 In each PST phase, participants were given instructions about a specific area (e.g., educational 207 system, sport etc.). They then had to elaborate one innovation. In each scenario, 3 topics were 208 proposed and all participants were asked to reflect upon 6 different innovations during the 209 whole experiment. Instructions about each innovation were previously recorded and 210 broadcasted in the simulator cabin at the beginning of each PST phase. The end of each PST 211 phase was also announced by instructions broadcasted in the cabin. Then, a new MW phase 212 started and participants were reminded they had to push the headlights whenever they realized 213 that their mind wandered. Each MW phase lasted 1 min and a half and each PST phase lasted 214 2 minutes. All participants had the same order of conditions presentation which was MW-PST-215 MW-PST-MW-PST-MW for both scenarios. Considering the changing aspect of MW, 216 alternating tasks appeared to be the more realistic way to create an enabling environment for

- 217 the emergence of MW. For this reason four phases of self-reported MW were alternated with
- three phases of reflections on innovations (PSTs). Each scenario began and ended with a MW
- 219 phase.
- 220 The really nature of the two tasks that participants were asked to perform would lead to a
- different number of events for each kind of thought. During MW phases, participants were ableto self-report several MW episodes while they had to think about one innovation during the
- 222 to sen-report several WW episodes while they had to think about one hinovation during the
- 223 PST phase.
- Moments when participants self-reported their wandering thoughts or said "stop" after reflecting upon innovations were considered as "events". Physiological and behavioral data were compared before and after self-report events and before and after participants said "stop" after thinking on innovations. Therefore, it was possible to compare temporal window designated as inattention interval (before) and temporal window designated as an attentive interval (after) (He et al., 2011).
- 230 2.3 Material & Apparatus
- 231 2.3.1 Driving simulator

232 The driving simulator used in this experiment was a Peugeot 308 cabin (length = 4.27 m; 233 width = 1.81 m) surrounded by seven video projection screens (covering a total angular space 234 of 270° and vertical angular size of 47.5°). Participants drove in a straight line interrupted by 235 right and left curves in an urban residential zone. It was a two-way country road with only few 236 vehicles coming from the opposite direction of the participant vehicle so as to enable the 237 emergence of MW (He et al., 2011). To remain coherent with Braboszcz & Delorme, 2011 and 238 He et al., (2011), the driving environment was purposely refined to encourage MW. The road 239 contained long straights lines interrupted by right and left curves. Participants completed 2 240 scenarios of 12 min using the same visual base. They had a break between the two scenarios to 241 avoid any fatigue effect.

242

243 2.3.2.1 Cardiac measurement

Heart rate was measured using 3 electrodes (Biopac, MP150 using Bionomadix transmitters) during the whole experiment. The positive electrode was placed under the last left rib, the negative electrode on the manubrium of the sternum, and the ground electrode on the right side, just on top of the hip. In a test phase, it has been checked that this positioning satisfies the main conditions to collect correct cardiac signal during driving: compromising with the length of the wires and avoiding a noisy signal due to muscular activity.

2.3.2 Physiological and behavioral measurements and pre-processing

Heart Rate (HR) values were computed using equations provided by Roy, (2015) and illustrated by Pepin et al., (2017). From the cardiac signal, several time-domain indices bringing information about heart rate variability have been calculated from IBI such as the Root Mean Square Successive Differences of NN intervals (RMSSD) and proportion of the number of interval differences of successive NN intervals greater than 50 ms (pNN50).

255 2.3.2.2 Oculometric measurement

256 Eye movements were sampled at 30 Hz with an eye-tracking device (Tobii Glasses v1). To 257 analyze the visual information gathering while driving, a gaze fixity rate indicator has been 258 designed. The gaze fixity was present if at least 90% of eye absolute positions were contained 259 in a visual angle area of 2° for more than 1 s. So, the gaze fixity is a binary indicator and then 260 can take only 2 values (1 when there is gaze fixity and 0 when there is not). An algorithm has 261 been set up to transform the absolute position towards gaze fixity for each time step. In order 262 to convert the absolute gaze position into the gaze fixity, such process has been carried out for 263 each time step for each participant throughout a sliding window conversion. This algorithm, 264 coded 1 if 90% of the 29 next gaze absolute positions (corresponding to 1 sec) were contained 265 in a 2° of visual angle area. The gaze fixity rate is the mean of gaze fixity across all events of 266 each condition.

267 *2.3.2.3 Driving data*

The driving simulator provided several driving measures such as the speed (in kilometer per hour), the lateral position compared to the center of the lane (in meter) and the steering wheel angle (in degree). Measures of driving performance were sampled at a mean rate of 60 Hz and were synchronized with cardiac data through the BioPac MP150 and with the Tobii Glasses 1.

272 2.3.2.4 Questionnaire

Participants had to fill in a questionnaire about personal details (age, gender, driving habits,
driving experience, attentional and auditory disorder, drug consumption etc...).

After each scenario participants had to fill a survey about the content of MW and PSTs. Items enlighten the temporal focus of MW (past, present or future), its emotional valence and its subjective impact on driving performance. For each proposal, participants had to indicate the number of wandering thoughts they remembered having for each dimension.

279 2.4 Procedure

280 Prior to the experiment, participants were informed about the content of the experiment and 281 asked to give their informed consent. They were also aware that they could stop the experiment 282 at any time. Cardiac electrodes were affixed. Then, participants sat in the simulator cabin and a 283 5 min baseline measurement of HR was recorded. A short training session on the driving 284 simulator was performed to familiarize him/herself with the simulator and the driving 285 environment. Then, participants were equipped with the eye-tracker glasses and the calibration phase started. Prior to the beginning of the first scenario, participants were instructed about 286 287 PSTs and MW conditions. Participants were asked to maintain the car speed at 70 Km/h and 288 stay in the center of the lane. After the first scenario, they completed the « Mind Wandering » 289 questionnaire about their attentional focus and the content of their thoughts. After a break, they 290 performed the second scenario. Then, they completed the MW questionnaire once again and 291 the survey about personal information. Finally, at the very end of the experiment, a debriefing 292 session was performed to explain the purpose of the study and answer participants' questions.

293 2.5 Statistical analyses

294 Physiological and behavioral data were compared before and after MW moments and before 295 and after PST moments. Such comparisons allow to make within-subject comparisons. It 296 assumes that participants were in a MW state or were reflecting upon innovation before 297 participants SR their wandering thoughts or said stop after reflecting upon innovation. 298 Moreover, it assumes that they were refocused on the main activity (i.e., driving) after it. 299 Considering temporal windows used in a previous study(He et al., 2011), [-5.5s; 0s] and 300 [0s; +5.5s] temporal windows were chosen here to study and compare respectively off-task 301 (PSTs or MW) and on-task thoughts. This decision is based on assumptions that in the 5.5 302 seconds prior to the event participants were in MW or focus on their PSTs while their attention 303 in the 5.5 seconds following the event was redirected towards driving. These assumptions seem 304 more likely to be verified than with the use of temporal windows used in other studies (He et 305 al., 2011).

- 306 Statistical analyses were conducted to address two experimental questions in particular:
- 307 1) What are the behavioral and physiological correlates of inattentive thoughts308 towards driving?
- 3092) Is it possible to distinguish problem solving thoughts and stimulus-independent310and task-unrelated thoughts (MW)?
- 311 The first step was to check distributions normality using the Kolmogorov-Smirnov test.
- 312 Depending on this result, ANOVAs, Wilcoxon were conducted to compare 1) changes between
- before and after, 2) changes between before and after according to the kind of thought and t-
- tests were conducted to compare 3) differences during before and after according to the kind of
- 315 thought.

316 3. RESULTS

317 Overall, 285 events were collected across all conditions and through all participants. Grand

318 mean responses have been computed by averaging data over all events. Different numbers of

319 events from cardiac and oculometric metrics have been removed resulting in different numbers

320 of event suitable for analysis. It appears that 13.68% of eye-tracking data, 7.37% of cardiac data

- and 0% of driving data have been removed. Events were removed from analyses either because
- temporal windows were overlapping other events or because data were unsuitable for analysis.
- 323 It is also possible that participants did not said "stop" because did not complete their innovation
- within the allocated time. The number of each event for each variable is presented in Table 1.

Table 1: Number of usable events, mean, standard deviation and p-value of the difference for each variable. MW
 = Mind-wandering; PST = Problem-Solving Thought

					MW									PST				
	Number of participant with usable data	Mean of usable events by participant	SD of usable events by participant	Sum of usable events	Mean for [-5,5; 0] time- window	SD for [-5,5; 0] time- window	Mean for [0; +5,5] time- window	SD for [0; +5,5] time- window	p-value	Number of participant with usable data	Mean of usable events by participant	SD of usable events by participant	Sum of usable events	Mean for [-5,5; 0] time- window	SD for [-5,5; 0] time- window	Mean for [0; +5,5] time- window	SD for [0; +5,5] time- window	<i>p</i> -value
Gaze Fixity	20	10,00	4,68	200	0,52	0,15	0,41	0,19	<.001	15	2,40	1,82	48	0,46	0,24	0,41	0,22	> .05
Heart Rate	20	9.55	4,02	191	72,51	13,72	73,51	14.40	<.001	17	2,35	1,57	47	73.25	15.00	74.13	15.74	<.01
Speed	20	11,1	5,17	222	70,72	2.26	71,46	2.65	< .05	19	2,70	1,45	54	72,52	4,14	72.27	4.38	> .05

327

3.1 Questionnaires

Participants declared having more future-oriented (47.64%) than past-oriented (13.19%) thoughts (T = 56, z = 3.89, p < .0001). Considering thoughts emotional valence, participants declared having less negative thoughts (15%) than neutral (44.47%) (T = 74, z = 3.69, p < .001) or positive thoughts (40.53%) (T = 88, z = 3.29, p < .001).

- 332 3.2 Comparisons Before/After for TUTs
- 333 Cardiac data

The only significant result among cardiac measurement concerned Heart Rate (HR) which was higher after (m = 73.34, SD = 13.29) TUTs than before (m = 72.33, SD = 12.53) (F(1, 19) = 11.57, p < .01). RMSSD and pNN50 metrics appeared non-significant with Wilcoxon tests (p > .05).

338 Eye-tracking data

The difference in gaze fixity rate between before (m = 0.495, SD = 0.25) and after (m = 0.511, SD = 0.17) gave rise to a significant effect in the [-5.5s; +5.5s] temporal window (F(1, 19) = 10.15, p < .01).

342 3.2.3 Driving data

343 A trend appeared for the vehicle speed is different between before (m = 71.07, SD = 2.36) and

after (m = 71.83, SD = 3.14) and it gave rise to a significant effect in the [-5.5s; +5.5s] temporal window (F(1, 19) = 3.84, p = .065).

- The lateral position and the steering wheel angle comparisons appeared both non-significant (p > .05).
- 348 3.3 Comparisons Before/After for MW and PST
- 349 3.3.1 Cardiac data

350 HR appeared significantly different between before (m = 72.51, SD = 13.72) and after 351 (m = 73.51, SD = 14.40) for the MW condition: F(1, 19) = 10.85, p < .01.

- 352 HR averaged across all participants in the [-5.5s; +5.5s] temporal window according to the kind
- of thought is presented in Figure 1.



Figure 1: Evolution of grand mean heart rate (obtained from raw data) within 11 seconds
surrounding the event, data depict MW and PST conditions.

For PST, a trend appeared for HR between the inattentive phase (m = 73.25, SD = 15.00) and the attentive phase (m = 74.13, SD = 15.74), for the PST thoughts (F(1, 19) = 3.109, p = .093).

359 3.3.2 Eye-tracking data

354

The gaze fixity rate was higher during MW (m = 0.522, SD = 0.15) than during attentive moments (m = 0.413, SD = 0.19) in the [-5.5s; +5.5s] temporal window (F(1, 19) = 10.95, p < .01).

Conversely, the difference in the gaze fixity rate for the PST condition in the [-5.5s; +5.5s]temporal window was not significant (F < 1).

365 Gaze fixity rates according to the type of tasks are presented in Figure 2 and Figure 3.



Figure 2: Grand mean of gaze fixity in the 11 seconds surrounding a MW self-report. Data averaged over 200 events



Figure 3: Grand mean of gaze fixity in the 11 seconds surrounding a PST event. Data averaged over 46 event

- 366 3.3.3 Driving data
- 367 Concerning MW results, differences concerning lateral position as well as the steering wheel 368 angle appeared non-significant (p > .05) between before and after MW.
- 369 A trend appeared for the car speed between before (m = 70.72, SD = 2.56) and after for the MW
- 370 condition (m = 71.46, SD = 2.65) in the [-5.5s; +5.5s] temporal window
- 371 (F(1, 19) = 4.01, p = .060).
- 372 Concerning PST, neither the lateral position, nor the steering wheel angle, nor the vehicle speed
- 373 was significantly different between before and after moments.
- 374 Car speeds according to the kind of task are presented in Figure 4.



Figure 4: Grand mean of vehicle speed in the 11 seconds surrounding events, data depict MW
and PST conditions.

378

375

379 4. DISCUSSION

The objectives of the present study was to (1) make a clear distinction between intentional (Problem Solving Thoughts = PSTs) and unintentional (MW) off-task thoughts, (2) assess the physiological and behavioral signatures of TUTs (both MW and PSTs) and (3) compare MW and PST. Participants had to 1) Self-Report (SR) their wanderings thoughts when they realized their mind drifted away from driving and 2) intentionally generate PST. For this, one repeated measure (temporal-windows: [-5.5s; +5.5s]) and one within-subject factor (the kinds of thought: MW and PSTs) were studied.

387 4.1 MW features

388 Concerning the features of thoughts that participants declared (MW condition), the prospective 389 bias showed in previous studies has been replicated: 48% of SR thoughts were future-oriented 390 while only 13% where past-oriented. These findings support the view of an important role of 391 MW to enable anticipation and planning of personally relevant future goals (Baird et al., 2011; 392 Stawarczyk, Cassol, & D'Argembeau, 2013). Proportion of interfering thoughts related to the 393 task (39% in the present study) is also consistent with prior findings (Gonçalves et al., 2017; 394 Stawarczyk et al., 2011). Moreover, considering links between temporality and valence, the 395 high proportion of neutral or positive thoughts (85%) is also consistent with the prospective 396 bias highlighted here. Results obtained from questionnaires indicate that 1) MW own a useful 397 planning role in our lives and 2) that participants generated ecological off-task thoughts 398 comparable to MW generated during other studies.

399 4.2 TUTs signatures

400 Physiological data analysis showed that Heart Rate (HR) was significantly lower during Task-401 Unrelated Thoughts (TUTs) than in the following seconds, during attentive driving. It means 402 that TUTs could have an impact on HR even on a 11s time-window. No difference has been 403 found for heart rate variability indicators (RMSSD and pNN50). This result is not in line with 404 Smallwood et al., (2004) since HR was found to be higher during TUTs. Such different results could be explained by differences in the dynamic of the tasks the participants had to achieve 405 406 (computer task vs. driving). TUTs moments could consequently be distinguished from attentive 407 moment (on-task thoughts) using heart rate. This potential distinction would be more effective 408 by taking the kind of thoughts into account (see next section).

409 Behavioral data analysis showed that the gaze fixity was higher during TUTs than during 410 attentive driving for on 11s time-window. As drivers' gaze is focused narrowly on the road 411 ahead during TUTs, gaze fixity seems to be a sensitive indicator of TUTs. Our results, in line 412 with He et al., (2011), showed that drivers' visual scanning is reduced their during TUTs. 413 Moreover, it means that TUTs damage their road sides scanning leading to impaired 414 information collection and processing coming from there. This could explain the part of the 415 higher crash risk associated to TUTs and particularly to MW. Considering driving data, the 416 vehicle speed appeared to be lower during TUTs episodes than after strengthening the impact 417 of TUTs on drivers' behavior. So, in line with previous findings, TUTs should have an impact 418 on drivers' behavior and physiological signals (Baird et al., 2011; He et al., 2011; Lemercier et al., 2014; Smallwood et al., 2004). In order to better understand such impact, it is necessary to
categorize the kind of thought drivers are involved in. In the next part, the relative impact of
each kind of thought is described by comparing the Stimulus Independent and Task-Unrelated
Thoughts (SITUTs = MW) and Problem Solving Thoughts (PSTs).

- 423 4.3 Comparisons between MW and PSTs signatures
- 424 4.3.1 Cardiac data

425 Considering cardiac measurement, it appears that heart rate is significantly lower during MW 426 than after being aware of it in the [-5.5s; +5.5s] temporal window. Such significance, which has 427 not been highlighted in previous study, is due to a specific pattern in HR in seconds following 428 participant's SR (Figure 1). This special pattern could be explained by the dynamic of the task 429 in which drivers were involved. Indeed, participants were asked to be focus on the driving task 430 and self-report their MW episodes. This means that in the seconds prior to self-reports, drivers 431 were focused on their personal thoughts rather than driving. Thus, when they became aware of 432 their inattentive state, corresponding to a gain in meta-consciousness (Schooler, 2002) 433 participants declared their thought and were instructed to focus back on the driving task. 434 However, MW impairs the working memory update (Kam, Nagamatsu, & Handy, 2014) by 435 drawing attentional resources from it to feed thoughts (Levinson, Smallwood, & Davidson, 436 2012). This means that drivers could no longer be able to refresh their situational awareness, 437 which corresponds to the state of knowledge about the elements in a dynamic environment 438 (Endsley, 1995). Hence, as soon as they became aware of a wandering thought, drivers seemed 439 to seek information (their speeds, the location of others vehicles etc...), processed it and 440 integrated it to quickly recover a clear and accurate situational awareness. If they did so, they 441 had to spend cognitive resources to shift between the default and the attentional mode (Yanko 442 & Spalek, 2014). This switchover could have a cost in terms of attentional resources. Yet, a 443 recent study has showed the feasibility of detecting the cognitive effort generating by a 444 cognitive demand of a task through heart rate measurement (Pepin et al., 2017). It appears that 445 the specific pattern found here after participants self-reported their MW episodes could 446 correspond to a cognitive effort pattern. Time-windows used for this experiment and in Pepin 447 et al., (2017) are similar. As previously explained, it seems likely that this increase in HR is 448 responsible for the statistical significance highlighted here. The difference is therefore due to 449 an increase in HR, which could come from a cognitive cost. This cognitive cost could have be 450 necessary to shift from a wandering mode underlain by the default mode network (Christoff et 451 al., 2009) to an attentive mode (Mason et al., 2007) underlain by the dorsal attentional network 452 (Vincent et al., 2006) generating the special pattern in [+1s; +4s] following the SR.

The special pattern spelt out here is not present for the PST condition in the same time-window. Nevertheless, different fluctuations in HR have been highlighted between PSTs and attentive driving meaning that PSTs could have a cardiac signature while the only difference for the MW conditions have been found during the attentive driving period (Figure 1). Even if the difference for MW and PSTs is not significant regardless time-window (before and after), this cardiac pattern could be discussed regarding results outlined above. Indeed, the need to reorient our attention to driving could have generated a small cognitive effort, insufficient to reach 460 significance. With a less refine environment and more vehicles, the reorientation of attention 461 could have been more expensive in cognitive resources inducing a larger HR acceleration. The 462 present study has not been able to highlight a cardiac signature of MW or PSTs but found that 463 the reorientation of drivers' attention after a MW episode gets a cognitive cost that could be 464 detectable by averaging heart rate values.

465 4.3.2 Ocular behavior

466 Considering oculometric measurement, the gaze fixity rate was higher during MW episodes than after. The difference is significant in the [-5.5s; +5.5s] time-window. Conversely, no 467 468 difference has been found for PST conditions. Such results support the previous hypothesis in 469 which the specific cardiac pattern is due to a need for drivers to reorient attention towards 470 driving after a MW episodes. Indeed, drivers' gaze appeared to be fixed during MW episodes 471 meaning that the amplitude of their visual scanning is reduced. Drivers do not seem to be as 472 efficient to collect and process information as they were when focusing on driving. Hence, to 473 update their situational awareness, drivers scanned the environment in a broader way after 474 having self-reported their MW episodes (Figure 2). It has already been proven that MW leads 475 to a reduction in drivers horizontal visual scanning (He et al., 2011) but an increase in drivers 476 gaze fixity during MW means that drivers' gaze get stuck straight ahead. A parallel could be 477 made with failure in attentional disengagement among aircraft pilots (Dehais et al., 2011). 478 Indeed, MW could prevent attentional disengagement from drivers' thoughts to driving. This 479 failure in attentional disengagement would lead to a staring gaze and then increase the risk of 480 an accident.

481 Now, considering PST, no difference has been found for the gaze fixity rate. Such result might 482 be the fact that 200 events were averaged to analyze MW while only 46 events have been 483 averaged for PST (Figure 3). Still, it appears that there are substantial differences between MW 484 and PST. Indeed, the gaze is more fixed during MW than during PST. More than 60% of drivers 485 gaze during MW events were fixed in the second before the SR while it barely raise 45% for 486 PSTs (it has to be noted that the gaze fixity baseline reaches 37%). MW impact gaze behavior 487 by reducing the visual scanning and generating an impaired visual attention while the gaze 488 fixity seems to be non-sensitive to PSTs under current experimental conditions.

489 4.3.3 Driving behavior

490 Considering driving behavior, the vehicle speed tends to be lower during TUTs than during attentive driving moments. However, in the present study, vehicles' speed gradually increase 491 492 while it has been shown to decrease while having off-task thoughts (Yanko & Spalek, 2014). 493 When having a closer look and taking into account the kind of thought, it appears that the 494 vehicle speed is lower during MW than during attentive driving but tends to gradually increase 495 up to approximately 1 second after drivers self-reported their wandering thoughts (Figure 4). It 496 could correspond to the necessary time for drivers to reorient their attention towards driving, 497 update information and rectify their speed. While drivers were asked to maintain the speed of 498 their vehicle as close as possible to 70km per hour, it seems that they did not have enough 499 cognitive resources to be focus on their thoughts and control lateral and longitudinal positions 500 of their vehicle. Drivers seemed to experience a failure in their executive control leading to

- 501 higher speeds, which could partly explain the higher crash risk imputable to MW (Galera et al.,
- 502 2012). Some reservations should be made with the present interpretation since only a trending
- 503 effect have been highlighted.

504 Conversely, no statistical significance has been found for the vehicle speed between PSTs and 505 attentive driving moments and between PST and MW for the vehicle lateral position, steering 506 wheel angle or speed. Similarly, no statistical significance has been found after having TUTs, 507 during attentive driving moments, for MW and PST conditions, meaning that the driving 508 behavior seems to be affected by TUTs but globally unaffected by the intentionality of TUTs. 509 Drivers were aware that they were having off-task thoughts during PSTs so they could have 510 been able to set up strategies. Those strategies could have been absent for MW explaining that 511 speed gradually increased at that time. The absence of statistical significance for the lateral 512 position of the vehicle and the steering wheel angle could be partially explained by the presence 513 of curves during driving sessions. Indeed, several events (self-report mind wandering and 514 reflection upon innovation) happened during curves leading to high steering wheel angle values 515 and high variation in the lateral positions values of the vehicle. These alterations of data 516 occurred sometimes during TUTs and sometimes during attentive driving moments. To be able 517 to conclude about the impact of the kind of thoughts on the lateral position of the vehicle and the steering wheel angle, the use of a different task with straight lines and no curve should have 518 519 been used. To conclude about speed, it is also likely that the vehicle speed management is 520 affected by MW while the lateral position and the steering wheel angle are not. Indeed, 521 managing speed requires drivers a constant cognitive resources allocation management. To do 522 so, drivers have to periodically check the speedometer, keep in mind the information and then 523 adapt their behavior. Nevertheless, with an increase in the gaze fixity and an impossibility to 524 update their working memory, drivers fail to process such information generating a 525 perseverative behavior and a gradual speed increase. In conclusion, MW seems to impair 526 drivers' executive control leading to a persistent behavior. During MW, drivers are no longer 527 able to keep watch their speed. This could be problematic, especially under real driving 528 conditions with strong time pressure (Merat, Jamson, Lai, Daly, & Carsten, 2014).

529 4.4 Conclusion

530 The question of how various off-task thoughts might impact drivers is a topic of increasing 531 concern not only for road safety but also for human performance and comprehension. The 532 present study intended to make a distinction between intentional (PSTs) and unintentional 533 (MW) thoughts. Being more specific about the features of thought allow to better understand 534 inattention and to take effective countermeasures to ensure drivers' safety. The present study highlighted behavioral and physiological signatures of Task-Unrelated Thoughts (TUTs). 535 536 During TUTs, the gaze fixity is higher and the speed of the vehicle is lower than during attentive 537 driving moments. When taking the kind of thought into consideration, it appeared that heart 538 rate and speed are affected by both MW and PSTs while the gaze fixity is only sensitive to MW. 539 For this reason, the gaze fixity appeared as a sensitive indicator of MW. Indeed, MW draws on 540 working memory resources (Kam et al., 2014) to trigger and feed self-generated thoughts 541 (Levinson et al., 2012). MW and PSTs seem to have different oculometric signatures 542 strengthening the need to distinguish the kind of thought when studying off-task thoughts. The 543 following perseverative behavior and staring gaze prevent drivers to properly scan the 544 environment. And even if they collect a part of available information, evidences coming from 545 neurosciences have showed that sensory cortices are less active and information are less well-546 processed during MW (Smallwood, Beach, Schooler, & Handy, 2008). Oculometric 547 measurements should therefore be considered more closely when researchers study MW. Consistent with previous findings (McVay & Kane, 2009; Smallwood, 2010), behavioral 548 549 outcomes showing that gaze fixity and speed increase during TUTs unveil a failure in executive 550 control and in resources allocation management. This leads to incapacity to both maintain TUTs 551 and manage speed. Nevertheless, and this is the first limitation of the present study, changing 552 the response mode between MW and PSTs add some variability in data which could explain this difference. Indeed, flashing headlights and say "stop" are two different output modes, 553 554 which could have influence the gaze fixity. Secondly, MW and PST conditions were not 555 averaged over the same number of events leading to more accurate interpretations and 556 conclusions for MW than for PSTs. Moreover, when participants were asked to self-report their 557 wandering thoughts we assume that we can only study MW that became, at a certain moment, 558 conscious. Participants cannot report an unconscious wandering thought and can only wait for 559 this thought to become conscious before being able to report it. This is why the present study 560 only considered unintentional and, in the first place, unaware thoughts that became, at one time 561 aware. Such off-task thoughts might be different from thoughts that would never become aware.

562 This study has not been capable to demonstrate strong differences between PST and MW. But 563 recent findings seemed to direct research towards more specific thoughts features (Golchert et 564 al., 2017) such as awareness (Smith et al., 2006), temporal focus (Smallwood & Schooler, 2015), temporal distance (Spronken et al., 2016), emotional valence (Killingsworth & Gilbert, 565 566 2010), relevance of the thought to the individual (Andrews-Hanna et al., 2013) and task demand 567 (He et al., 2011). A better understanding of the respective impact of these features could be 568 very useful to identify detrimental thoughts responsible for the "disruptive mind-wandering" 569 state doubling the risk to be responsible for a car accident (Galera et al., 2012). But the 570 importance of each factor is difficult to measure considering strong and winding links between 571 them (Ruby, Smallwood, Engen, & Singer, 2013; Smallwood & Schooler, 2015; Stawarczyk et 572 al., 2011). As it has been done with the intentionality in the present study, future research should 573 therefore have to bring to light the impact of temporal focus, emotional valence and subjective 574 relevance of the current thought, which seem to be the most promising thought features to 575 explain that MW while driving is detrimental or not. Indeed, it seems that the temporality and 576 the occurrence of MW are related: the more people have future-oriented thoughts, the more 577 they wander (Baird et al., 2011). It also seems that emotional valence and temporality are linked 578 (Smallwood & Schooler, 2015) and a bidirectional relationship between negative emotion and 579 MW have been highlighted (Smallwood & Schooler, 2015; Techer, 2016). When we consider 580 that the emotional valence of off-task thoughts affect cognitive performances (Banks, Welhaf, Hood, Boals, & Tartar, 2016), all mind wandering seem not be equal. Considering links 581 582 between temporality and other thoughts features, it is therefore highly likely that the content of 583 a wandering thought and particularly its temporality seems promising to explain a higher 584 disruptive effect on drivers (Lemercier et al., 2014).

- 585 Finally, once links between thoughts features and their impacts on drivers will be questioned and spelled out, a detection algorithm of MW could be developed. The idea is to use the gaze 586 fixity and others relevant behavioral (e.g., deviations in the vehicle's lateral position: Lemercier 587 588 et al., 2015) and physiological (e.g., pupil dilation: Konishi et al., 2017) indicators to assess the 589 presence of MW. The final objective being to merge it together to improve the ability of an 590 algorithm to spot MW when it is disruptive. To do so, the selected indicators must be evaluated 591 on their sensitivity, specificity and robustness. It could be also possible to take into account the 592 driving context to better prevent car crash risk. The objective is to monitor drivers' attentional 593 states and pinpoint times when driver's mind dangerously drifts away. Such solution is entirely 594 in continuation with work achieved years ago on distraction using a layered algorithm, dynamic bayesian networks and supervised clustering (Liang et al., 2007; Liang & Lee, 2014). It is 595 596 therefore critical to collect both physiological and behavioral data to expend our understanding 597 of MW through a data triangulation method, use these data mining methodologies to detect MW
- 598 while driving and then still improve road safety.
- 599 Conflict of interest
- 600 All authors declare they have no conflict of interest

601 5. REFERENCES

- 602 Andrews-Hanna, J. R., Kaiser, R. H., Turner, A. E., Reineberg, A., Godinez, D., Dimidjian,
- 603 S., & Banich, M. (2013). A penny for your thoughts: dimensions of self-generated thought 604 content and relationships with individual differences in emotional wellbeing. *Frontiers in*
- 605 *psychology*, *4*, 900.
- 606 Baird, B., Smallwood, J., & Schooler, J. W. (2011). Back to the future: autobiographical
- 607 planning and the functionality of mind-wandering. *Consciousness and Cognition*, 20(4),
- 608 1604-1611. https://doi.org/10.1016/j.concog.2011.08.007
- Banks, J. B., Welhaf, M. S., Hood, A. V. B., Boals, A., & Tartar, J. L. (2016). Examining the
- 610 role of emotional valence of mind wandering: All mind wandering is not equal.
- 611 Consciousness and Cognition, 43, 167-176. https://doi.org/10.1016/j.concog.2016.06.003
- 612 Berthié, G., Lemercier, C., Paubel, P.-V., Cour, M., Fort, A., Galéra, C., ... Maury, B. (2015).
- 613 The restless mind while driving: drivers' thoughts behind the wheel. *Accident; Analysis and*
- 614 Prevention, 76, 159-165. https://doi.org/10.1016/j.aap.2015.01.005
- Bixler, R., & D'Mello, S. (2014). Toward Fully Automated Person-Independent Detection of
- 616 Mind Wandering. In V. Dimitrova, T. Kuflik, D. Chin, F. Ricci, P. Dolog, & G. J. Houben
- 617 (Éd.), User Modeling, Adaptation, and Personalization, Umap 2014 (Vol. 8538, p. 37-48).
- 618 Berlin: Springer-Verlag Berlin.
- 619 Braboszcz, C., & Delorme, A. (2011). Lost in thoughts: neural markers of low alertness
- 620 during mind wandering. *NeuroImage*, *54*(4), 3040-3047.
- 621 https://doi.org/10.1016/j.neuroimage.2010.10.008
- Brown, I. D. (2005). *Review of the « looked but failed to see » accident causation factor.*
- 623 Consulté à l'adresse https://trid.trb.org/view/1156399
- 624 Burdett, B. R. D., Charlton, S. G., & Starkey, N. J. (2016). Not all minds wander equally: The
- 625 influence of traits, states and road environment factors on self-reported mind wandering
- 626 during everyday driving. Accident; Analysis and Prevention, 95(Pt A), 1-7.
- 627 https://doi.org/10.1016/j.aap.2016.06.012
- 628 Chaparro, R. A. H. (2015, novembre 9). *Behavioral and neural correlates of spontaneous*
- 629 *attentional decoupling : towards an understanding of mind wandering* (phdthesis). Université
- 630 Pierre et Marie Curie Paris VI. Consulté à l'adresse https://tel.archives-ouvertes.fr/tel-
- 631 01314225/document
- 632 Christoff, K., Gordon, A. M., Smallwood, J., Smith, R., & Schooler, J. W. (2009). Experience
- 633 sampling during fMRI reveals default network and executive system contributions to mind
- 634 wandering. *Proceedings of the National Academy of Sciences*, *106*(21), 8719-8724.
- 635 https://doi.org/10.1073/pnas.0900234106
- 636 Corballis, M. C. (2013). Wandering tales: evolutionary origins of mental time travel and
- 637 language. Frontiers in Psychology, 4. https://doi.org/10.3389/fpsyg.2013.00485

- 638 Dehais, F., Causse, M., & Tremblay, S. (2011). Mitigation of Conflicts with Automation: Use
- 639 of Cognitive Countermeasures. *Human Factors*, 53(5), 448-460.
- 640 https://doi.org/10.1177/0018720811418635
- 641 Endsley, M. R. (1995). Toward a theory of situation awareness in dynamic systems. *Human*
- 642 *factors*, *37*(1), 32–64.
- 643 Galera, C., Orriols, L., M'Bailara, K., Laborey, M., Contrand, B., Ribereau-Gayon, R., ...
- Lagarde, E. (2012). Mind wandering and driving: a responsibility case-control study. *BMJ British medical journal*, *345*, 7 p. https://doi.org/10.1136/bmj.e8105
- 646 Golchert, J., Smallwood, J., Jefferies, E., Seli, P., Huntenburg, J. M., Liem, F., ... Margulies,
- 647 D. S. (2017). Individual variation in intentionality in the mind-wandering state is reflected in
- 648 the integration of the default-mode, fronto-parietal, and limbic networks. *NeuroImage*, *146*,
- 649 226-235. https://doi.org/10.1016/j.neuroimage.2016.11.025
- 650 Gonçalves, Ó. F., Rêgo, G., Oliveira-Silva, P., Leite, J., Carvalho, S., Fregni, F., ... Boggio,
- P. S. (2017). Mind wandering and the attention network system. Acta Psychologica, 172,
- 652 49-54. https://doi.org/10.1016/j.actpsy.2016.11.008
- 653 Greicius, M. D., Krasnow, B., Reiss, A. L., & Menon, V. (2003). Functional connectivity in
- the resting brain: A network analysis of the default mode hypothesis. *Proceedings of the*
- National Academy of Sciences of the United States of America, 100(1), 253-258.
- 656 https://doi.org/10.1073/pnas.0135058100
- He, J., Becic, E., Lee, Y.-C., & McCarley, J. S. (2011). Mind wandering behind the wheel:
- 658 performance and oculomotor correlates. *Human Factors*, 53(1), 13-21.
- 659 https://doi.org/10.1177/0018720810391530
- Kam, J. W. Y., Nagamatsu, L. S., & Handy, T. C. (2014). Visual asymmetry revisited: Mind
 wandering preferentially disrupts processing in the left visual field. *Brain and Cognition*, 92C,
- 662 32-38. https://doi.org/10.1016/j.bandc.2014.10.002
- 663 Killingsworth, M. A., & Gilbert, D. T. (2010). A Wandering Mind Is an Unhappy Mind.
- 664 Science, 330(6006), 932-932. https://doi.org/10.1126/science.1192439
- Konishi, M., Brown, K., Battaglini, L., & Smallwood, J. (2017). When attention wanders:
 Pupillometric signatures of fluctuations in external attention. *Cognition*, 168, 16-26.
- 667 Kopp, K., D'Mello, S., & Mills, C. (2015). Influencing the occurrence of mind wandering
- 668 while reading. *Consciousness and Cognition*, *34*, 52-62.
- 669 https://doi.org/10.1016/j.concog.2015.03.003
- 670 Lemercier, C., Pêcher, C., Berthié, G., Valéry, B., Vidal, V., Paubel, P.-V., ... Maury, B.
- 671 (2014). Inattention behind the wheel: How factual internal thoughts impact attentional control
- 672 while driving. *Safety Science*, 62, 279-285. https://doi.org/10.1016/j.ssci.2013.08.011

- 673 Levinson, D. B., Smallwood, J., & Davidson, R. J. (2012). The Persistence of Thought:
- 674 Evidence for a Role of Working Memory in the Maintenance of Task-Unrelated Thinking.
- 675 Psychological Science, 23(4), 375-380. https://doi.org/10.1177/0956797611431465
- 676 Liang, Y., & Lee, J. D. (2014). A hybrid Bayesian Network approach to detect driver
- 677 cognitive distraction. *Transportation Research Part C: Emerging Technologies*, 38, 146-155.
- 678 https://doi.org/10.1016/j.trc.2013.10.004
- Liang, Y., Reyes, M. L., & Lee, J. D. (2007). Real-Time Detection of Driver Cognitive
- 680 Distraction Using Support Vector Machines. *IEEE Transactions on Intelligent Transportation*
- 681 Systems, 8(2), 340-350. https://doi.org/10.1109/TITS.2007.895298
- 682 McVay, J. C., & Kane, M. J. (2009). Conducting the Train of Thought: Working Memory
- 683 Capacity, Goal Neglect, and Mind Wandering in an Executive-Control Task. Journal of
- 684 *experimental psychology. Learning, memory, and cognition, 35*(1), 196-204.
- 685 https://doi.org/10.1037/a0014104
- 686 Merat, N., Jamson, A. H., Lai, F. C. H., Daly, M., & Carsten, O. M. J. (2014). Transition to
- 687 manual: Driver behaviour when resuming control from a highly automated vehicle.
- 688 Transportation Research Part F: Traffic Psychology and Behaviour, 27, 274-282.
- 689 https://doi.org/10.1016/j.trf.2014.09.005
- 690 Mooneyham, B. W., & Schooler, J. W. (2013). The Costs and Benefits of Mind-Wandering:
- A Review. Canadian Journal of Experimental Psychology-Revue Canadienne De Psychologie
 Experimentale, 67(1), 11-18. https://doi.org/10.1037/a0031569
- 0.12 Experimentate, 07(1), 11-10. https://doi.org/10.105//d0051505
- 693 Mosedale, J., Purdy, A., & Clarkson, E. (2004). Contributory factors to road accidents.
- 694 Consulté à l'adresse https://trid.trb.org/view/864416
- 695 Ottaviani, C., Shahabi, L., Tarvainen, M., Cook, I., Abrams, M., & Shapiro, D. (2014).
- 696 Cognitive, behavioral, and autonomic correlates of mind wandering and perseverative
- 697 cognition in major depression. *Frontiers in Neuroscience*, *8*, 433.
- 698 https://doi.org/10.3389/fnins.2014.00433
- Parasuraman, R. (2003). Neuroergonomics: Research and practice. *Theoretical issues in ergonomics science*, 4(1-2), 5–20.
- 701 Pepin, G., JALLAIS, C., Fort, A., Moreau, F., Navarro, J., & GABAUDE, C. (2017).
- 702 Towards real-time detection of cognitive effort in driving: contribution of cardiac
- 703 measurement. Le travail humain, 80, 51-72. https://doi.org/10.3917/th.801.0051
- Raichle, M. E., MacLeod, A. M., Snyder, A. Z., Powers, W. J., Gusnard, D. A., & Shulman,
- 705 G. L. (2001). A default mode of brain function. *Proceedings of the National Academy of*
- 706 Sciences of the United States of America, 98(2), 676-682.
- 707 Rayner, K. (1998). Eye movements in reading and information processing: 20 years of
- 708 research. *Psychological Bulletin*, 124(3), 372-422. https://doi.org/10.1037/0033-
- 709 2909.124.3.372

- 710 Regan, M. A., & Strayer, D. L. (2014). Towards an Understanding of Driver Inattention:
- 711 Taxonomy and Theory. Annals of Advances in Automotive Medicine, 58, 5-14.
- Roy, R. N. (2015, juin 4). Étude de corrélats électrophysiologiques pour la discrimination
- 713 d'états de fatigue et de charge mentale : apports pour les interfaces cerveaumachine passives
- 714 (phdthesis). Université Grenoble Alpes. Consulté à l'adresse https://tel.archives-
- 715 ouvertes.fr/tel-01217465/document
- 716 Ruby, F. J. M., Smallwood, J., Engen, H., & Singer, T. (2013). How self-generated thought
- shapes mood--the relation between mind-wandering and mood depends on the socio-temporal
- 718 content of thoughts. *PloS One*, 8(10), e77554. https://doi.org/10.1371/journal.pone.0077554
- 719 Schooler, J. W. (2002). Re-representing consciousness: dissociations between experience and
- meta-consciousness. *Trends in Cognitive Sciences*, 6(8), 339-344.
- 721 https://doi.org/10.1016/S1364-6613(02)01949-6
- Schooler, J. W., & Schreiber, C. A. (2004). Experience, meta-consciousness, and the paradox
 of introspection. *Journal of Consciousness Studies*, *11*(7-8), 17-39.
- 724 Seli, P., Ralph, B. C. W., Konishi, M., Smilek, D., & Schacter, D. L. (2017). What did you
- have in mind? Examining the content of intentional and unintentional types of mind
- wandering. *Consciousness and Cognition*, 51, 149-156.
- 727 https://doi.org/10.1016/j.concog.2017.03.007
- Seth, A. K., Dienes, Z., Cleeremans, A., Overgaard, M., & Pessoa, L. (2008). Measuring
- consciousness: relating behavioural and neurophysiological approaches. *Trends in Cognitive Sciences*, *12*(8), 314-321. https://doi.org/10.1016/j.tics.2008.04.008
- 731 Smallwood, J. (2010). Why the global availability of mind wandering necessitates resource
- 732 competition: Reply to McVay and Kane (2010).
- 733 Smallwood, J. (2013). Distinguishing how from why the mind wanders: a process-occurrence
- framework for self-generated mental activity. *Psychological Bulletin*, 139(3), 519-535.
- 735 https://doi.org/10.1037/a0030010
- 736 Smallwood, J., Beach, E., Schooler, J. W., & Handy, T. C. (2008). Going AWOL in the brain:
- mind wandering reduces cortical analysis of external events. *Journal of Cognitive*
- 738 Neuroscience, 20(3), 458-469. https://doi.org/10.1162/jocn.2008.20037
- 739 Smallwood, J., Davies, J. B., Heim, D., Finnigan, F., Sudberry, M., O'Connor, R., &
- 740 Obonsawin, M. (2004). Subjective experience and the attentional lapse: task engagement and
- 741 disengagement during sustained attention. *Consciousness and Cognition*, *13*(4), 657-690.
- 742 https://doi.org/10.1016/j.concog.2004.06.003
- 743 Smallwood, J., McSpadden, M., & Schooler, J. W. (2008). When attention matters: The
- curious incident of the wandering mind. *Memory & Cognition*, *36*(6), 1144–1150.

- 745 Smallwood, J., & Schooler, J. W. (2015). The science of mind wandering: empirically
- navigating the stream of consciousness. *Annual Review of Psychology*, 66, 487-518.
- 747 https://doi.org/10.1146/annurev-psych-010814-015331
- 748 Smallwood, J., Schooler, J. W., Turk, D. J., Cunningham, S. J., Burns, P., & Macrae, C. N.
- 749 (2011). Self-reflection and the temporal focus of the wandering mind. *Consciousness and*
- 750 *Cognition*, 20(4), 1120-1126. https://doi.org/10.1016/j.concog.2010.12.017
- 751 Smith, R., Keramatian, K., Smallwood, J., Schooler, J., Luus, B., & Christoff, K. (2006).
- 752 Mind-wandering with and without awareness: An fMRI study of spontaneous thought
- processes. In *Proceedings of the Annual Meeting of the Cognitive Science Society* (Vol. 28).
- 754 Spronken, M., Holland, R. W., Figner, B., & Dijksterhuis, A. (2016). Temporal focus,
- temporal distance, and mind-wandering valence: Results from an experience sampling and an
- experimental study. *Consciousness and Cognition*, 41, 104-118.
- 757 https://doi.org/10.1016/j.concog.2016.02.004
- 758 Stawarczyk, D., Cassol, H., & D'Argembeau, A. (2013). Phenomenology of future-oriented
- mind-wandering episodes. Frontiers in Psychology, 4, 425.
- 760 https://doi.org/10.3389/fpsyg.2013.00425
- 761 Stawarczyk, D., Majerus, S., Maj, M., Van der Linden, M., & D'Argembeau, A. (2011).
- 762 Mind-wandering: Phenomenology and function as assessed with a novel experience sampling
- 763 method. Acta Psychologica, 136(3), 370-381. https://doi.org/10.1016/j.actpsy.2011.01.002
- 764 Techer, F. (2016, novembre 3). *Impact de la colère sur l'attention, le traitement de*
- 765 *l'information et les performances en conduite simulée* (phdthesis). Université de Nantes.
- 766 Consulté à l'adresse https://hal.archives-ouvertes.fr/tel-01455218/document
- 767 Vincent, J. L., Snyder, A. Z., Fox, M. D., Shannon, B. J., Andrews, J. R., Raichle, M. E., &
- 768 Buckner, R. L. (2006). Coherent spontaneous activity identifies a hippocampal-parietal
- 769 memory network. *Journal of Neurophysiology*, 96(6), 3517-3531.
- 770 https://doi.org/10.1152/jn.00048.2006
- Ward, A. F., & Wegner, D. M. (2013). Mind-blanking: when the mind goes away. Frontiers
- 772 *in Psychology*, *4*. https://doi.org/10.3389/fpsyg.2013.00650
- Yanko, M. R., & Spalek, T. M. (2014). Driving with the wandering mind: the effect that
- mind-wandering has on driving performance. *Human Factors*, 56(2), 260-269.
- 775 https://doi.org/10.1177/0018720813495280