

This is a repository copy of *Theory of planned behaviour*, *psychological stressors and intention to avoid violating traffic rules: A Multi-Level modelling analysis*.

White Rose Research Online URL for this paper: <u>https://eprints.whiterose.ac.uk/205204/</u>

Version: Accepted Version

Article:

Shukri, M., Jones, F. and Conner, M. orcid.org/0000-0002-6229-8143 (2022) Theory of planned behaviour, psychological stressors and intention to avoid violating traffic rules: A Multi-Level modelling analysis. Accident Analysis & Prevention, 169. 106624. ISSN 0001-4575

https://doi.org/10.1016/j.aap.2022.106624

© 2022, Elsevier. This manuscript version is made available under the CC-BY-NC-ND 4.0 license http://creativecommons.org/licenses/by-nc-nd/4.0/. This is an author produced version of an article published in Accident Analysis & Prevention. Uploaded in accordance with the publisher's self-archiving policy.

Reuse

This article is distributed under the terms of the Creative Commons Attribution-NonCommercial-NoDerivs (CC BY-NC-ND) licence. This licence only allows you to download this work and share it with others as long as you credit the authors, but you can't change the article in any way or use it commercially. More information and the full terms of the licence here: https://creativecommons.org/licenses/

Takedown

If you consider content in White Rose Research Online to be in breach of UK law, please notify us by emailing eprints@whiterose.ac.uk including the URL of the record and the reason for the withdrawal request.



eprints@whiterose.ac.uk https://eprints.whiterose.ac.uk/

1	Theory of Planned Behaviour, Psychological Stressors and Intention to Avoid Violating
2	Traffic Rules: A Multi-Level Modelling Analysis
3	
4	Madihah Shukri ^{1,*} , Fiona Jones ² , Mark Conner ²
5	¹ Department of Psychology and Counseling, University Malaysia Terengganu, Malaysia
6	E-mail address: madihah@umt.edu.my
7	² School of Psychology, University of Leeds, UK
8	E-mail address:f.a.jones@leeds.ac.uk
9	E-mail address:m.t.conner@leeds.ac.uk
10	*Correspondence:
11	Madihah Shukri, Department of Psychology and Counseling, Faculty of Business, Economics
12	and Social Development, University Malaysia Terengganu, 21030, Kuala Terengganu,
13	Malaysia.
14	Email: madihah@umt.edu.my
15	Telephone number: 60139066990
16	
17	
18	
19	
20	
21	
22 23	
23 24	
24 25	

26 ABSTRACT

This study applies a multilevel model approach to test the predictive effect of the theory of 27 planned behaviour (TPB) plus moral norm, past behaviour and crash history to account for 28 intentions to avoid traffic violations within the context of commuting to or from work. This 29 study also extended the theory by adding psychological stressors of perceived stress and 30 31 work-family conflict. In this study, we systematically tested the direct and mediated models. A sample of Malaysian drivers (N = 482; 44.6% were men and 55.4% women), with the 32 average age of 36.7 years (SD =10.0) was surveyed. The self-report questionnaire contained 33 multiple observations nested within individual drivers, with respect to 3 different driving 34 violations. As predicted, multi-level modelling showed that within-person predictor variables 35 of all the TPB components emerged as independent predictors, with injunctive norm being 36 the most predictive variable, followed by self-efficacy and cognitive attitude. Intention was 37 also predicted by moral norms and crash history. Between-person variables, gender, 38 39 commuting hours and work-family conflict also had direct influences on intention (i.e., men and those with longer commuting hours and higher work-family conflict reported lower 40 intentions). Substantial support for the mediation model was found, confirming that stressors 41 indirectly influence intentions through the effects of the socio-cognitive components. The 42 implications of the linkage between the social cognition and stressors for developing potential 43 broader interventions focusing on multiple violation behaviours and designing appropriate 44 safety policies to reduce commuting crashes are discussed. 45

46

47 Keywords; The Theory of Planned Behaviour, traffic violations, work-family conflict,

- 48 perceived stress, commuting, multi-level analysis
- 49

50 **1. Introduction**

According to WHO (2018), the global rate of traffic death continues to rise steadily, 51 52 accounting for 1.35 million deaths each year, while between 20 and 50 million people suffer nonfatal injuries and disabilities. Statistics show that low- and middle-income countries 53 (LMICs) have the highest proportions of road crash fatalities (Gupta & Bandyopadhyay, 54 55 2020). Statistics indicate that road traffic deaths globally are approximately 18 per 100, 000 population, with LMICs severely affected, contributing a high burden to 90% of the world's 56 road traffic deaths (Staton et al., 2016). While much attention has been focused on traffic 57 safety and violations in developed countries (Bhalla et al., 2020), little attention has been paid 58 to LMICs, despite these alarming figures. Furthermore, in recent years, the frequency of 59 commuting crashes that take place on the way to and from the place of work (International 60 Labour Organization, 2010) has become a serious issue in many parts of the world (Bin, 61 2014; Turgeman-Lupo & Biron, & 2017; Vargas-Garrido et al., 2021) and is a source of 62 63 much concern especially in LMICs (Bin, 2014). Unlike developed or high-income countries, many LMICs have made little progress in addressing this issue (Ning et al., 2016). 64

The present study was conducted in Malaysia, one of the LMICs with 65 disproportionately high risk and burden of road traffic crashes, in which the crash death rate 66 is the third highest in Asia (WHO, 2018). A report from the Ministry of Transport of 67 Malaysia (2021) highlights the fact that the number of road crashes in Malaysia has increased 68 gradually during the last ten years from 414,421 in 2010 to 567,516 in 2019, killing 6,000 to 69 7,000 yearly. The burden is expected to escalate because of rapid urbanisation and 70 71 motorisation (Musa et al., 2020). Importantly, the rising trend of the occurrence of commuting related crashes that contribute to the data is posing an enormous challenge (Bin, 72 2014; Sukor et al., 2018; Zuwairy et al., 2020). For instance, a report by the Social Security 73

Organization suggests that the trend for commuting crashes increased each year, from 28,037
cases in 2014 to 35,243 in 2018 (SOCSO, 2018).

76 There is ample evidence that traffic violations, defined as deliberate contraventions of safe driving practice (Parker et al., 1995), are a main contributory factor to traffic crashes 77 (Zhang et al., 2019). In light of the existing data, it seems prudent to understand factors 78 79 underpinning motives behind traffic violations during commuting. Within the traffic safety field, several studies have found the overspill of stress from other sources into the driving 80 environment (Bowen et al., 2020; Rowden et al., 2011), suggesting that the potential link 81 between stressors and traffic violation is a challenging research issue. Yet, the possible 82 mechanisms explaining stress-violation relationships have not fully explored (Westerman & 83 Haigney, 2000). This is noteworthy, considering the need for theory-based studies in order to 84 guide appropriate intervention, this study thus integrates the contribution of a stress 85 perspective on the theory of planned behaviour (TPB) in understanding traffic violations. 86 87 Specifically, we investigate the influence of psychological stressors, with particular attention to work-family conflict, perceived stress, and additional variables in relation to intentions to 88 avoid traffic violations, guided by the framework of TPB within the context of commuting in 89 isolation from other driving behaviours. 90

91 *1.1 Theory of planned behaviour and traffic violation*

Reviews and analyses have noted the TPB (Ajzen, 1991) as an influential model for understanding social behaviour (Ajzen, 2011; Armitage & Conner, 2001; Conner & Norman, 2015; McEachan et al., 2011). Such findings have sparked vigorous investigation into the efficacy of the model within the context of various health behaviours. An underlying assumption of the TPB is that behavioural intention is a key determinant of behaviour. Behavioural intention reflects an individual's motivation to perform a particular behaviour based on his/her efforts and planning. In the TPB, behavioural intention is a function of three

independent determinants: attitudes, subjective norms, and perceived behavioural control 99 (PBC). Attitude refers to a favourable or unfavourable evaluation of the behaviour (Ajzen, 100 1991), which conceptually comprises cognitive (the extent to which the behaviour is 101 perceived as beneficial) and affective (the extent to which the behaviour is perceived as 102 pleasant) components (Lawton et al., 2009). The second determinant of intention is subjective 103 norm, which is defined as an individual's perception of whether important people would 104 105 approve or disapprove of the behaviour. Researchers (Cialdini et al., 1991; Conner et al., 2007) have further distinguished between injunctive (i.e. perceptions of others' approval of 106 107 the behaviour in question) and descriptive norms (i.e. perceptions of whether others are doing the behaviour in question). PBC is the third independent determinant of intention, 108 conceptualised as the perceived ease or difficulty of performing the behaviour (Ajzen & 109 Madden, 1986). Many studies have reported the multidimensional nature of PBC constructs 110 (Trafimow et al., 2002). Despite this research, the dimensionality of PBC remains 111 112 controversial. Among the two distinct yet interrelated components often included in TPB studies are perceived difficulty (i.e. perception of the ease or difficulty of performing the 113 behaviour in question) and self-efficacy (i.e. perception of how confident the actor is that he 114 or she can perform the behaviour in question). Empirical studies have reported the relative 115 importance of these three components, which vary depending on the behaviour in question 116 (Armitage & Conner, 2001; McEachan et al., 2011). In addition, a number of TPB studies 117 (Hagger et al., 2007; Hassan et al., 2016; Shukri et al., 2016) have proposed specific 118 hypotheses for the impact of TPB components across cultures and populations, hence there 119 should be the possibility of cross-cultural variation in the influence of the TPB components in 120 this Malaysian sample as opposed to previous samples. 121

The TPB has been used to predict traffic violations (Elliot & Thomson, 2010;
Lheureux et al., 2016) and intention to commit violations (Atombo et al., 2016; Forward,

124	2006, 2009; Parker et al., 1992; Rowe et al., 2016). In general, the findings for the TPB
125	varied across samples and road violations, explaining 33% (dangerous overtaking; Forward,
126	2009) and 45% to 69% (speeding; Conner et al., 2003; Rowe et al., 2016, respectively) of the
127	variance in intentions

128 *1.2 Roles of additional predictor variables*

129 Researchers have proposed the use of moral norms to explain traffic behaviours (Chorlton et 130 al., 2012; Parker et al., 1995), usually as an additional form of normative pressure (Conner & Armitage, 1998). Moral norms can be defined as feelings of personal responsibility and moral 131 obligation to perform or not perform a behaviour (Ajzen, 1991). In general, traffic violations 132 are thought to be unacceptable with regard to generally accepted norms (i.e. immoral 133 134 actions), partly because such behaviour can provoke harm by creating road hazards and endangering drivers or other road users. A few studies (Conner et al., 2003; Conner et al., 135 2007; Elliot et al., 2010; Parker et al., 1995; Shevlin & Goodwin, 2019) have demonstrated 136 137 the predictive effect of moral norms on various driving behaviours, reflecting the fact that perceived moral obligation seems to be important with regard to intention formation to avoid 138 traffic violations. 139

The construct of past behaviour has been commonly added to the TPB and been found 140 to contribute to the prediction of intention and future behaviour, explaining variance beyond 141 142 the original TPB variables across different behaviours (Ajzen, 1991; Conner & Armitage, 1998; McEachan et al., 2011; Ouellette & Wood, 1998). Some studies on traffic safety have 143 found that the addition of past behaviour has led to statistically significant increments in 144 145 explaining variance in intentions (Conner et al., 2003, 2007; Forward, 2009; Shevlin & Goodwin, 2019; Vankov et al., 2021). Regardless of supporting evidence, the discussion of 146 the vague conceptualisation of past behaviours continues (Jovanović et al., 2017). However, 147 in the present study, we operationalized past behaviours as violation behaviours on the road 148

in response to external or internal stimuli committed in the past (Ajzen, 1991). The role of
past behaviour in the TPB has been ascribed to the notion that frequent (violation) behaviours
in the past may inspire subsequent violation acts by providing drivers with experience of the
behaviour and through the formation of habitual processes (Ouellette & Wood, 1998).

In addition, crash history was included in the model to provide insight into the 153 association between past involvement in crashes and intention. The link between crash 154 history and traffic behaviour has been investigated in several studies. While it is assumed that 155 drivers who have been involved in a crash would subsequently intend to behave more safely 156 on the road (Ngueutsa & Kouabenan, 2017), the results of these studies do not always support 157 this idea. For instance, Simon and Corbett (1996) found that past crashes were related to 158 159 increased traffic violations. Another study (Ngueutsa & Kouabenan, 2017) found that drivers who reported involvement in more than three crashes or in a severe crashes were reported to 160 be less safe than those involved in fewer or less severe crashes. However, Weinstein (1989) 161 162 found no relationship between personal crash and injury experience with subsequent safety behaviour (i.e. seat belt use). 163

164 *1.3 Psychological stressors and traffic violation*

Increasing evidence supports the hypothesis that psychological stress undermines driving 165 safety (Legree et al., 2003). Stress within the field of traffic violation studies has been 166 broadly conceptualised to include properties specific to driving experience and personal 167 factors originating from interpersonal and job problems (Roidl et al., 2014; Rowden et al., 168 2011). For instance, a previous study (Westerman & Haigney, 2000) found that high levels of 169 driver stress (i.e. specific to the driving situation) were associated with increased lapses, 170 errors, and traffic violations among professional drivers. Another study has indicated that 171 stressors derived from domains outside of driving experience appear to predispose drivers to 172

a number of negative driving outcomes (Rowden et al., 2011). Ge et al. (2014) found that the
global perception of stress derived from ongoing life circumstances and expectations
concerning future events contributed to the risk of dangerous driving behaviour.

In addition to considering a global assessment of stress, investigators have explored 176 the possible varying effects of specific types of stressors (Bowen et al. 2020; Rowden et al., 177 178 2011). Many studies have demonstrated that work-related stress has a negative impact on driving behaviours (Havârneanu & Havârneanu, 2012; McLinton & Dollard, 2010). 179 Meanwhile, ample evidence supports the detrimental effect of work-family conflict on 180 various work, non-work, and health-related outcomes (Amstad et al., 2011). Work-family 181 conflict is an inter-role stress that results from incompatible demands from work and family 182 183 domains (Greenhaus & Beutell, 1985). According to the conservation of resources theory (Holmgreen et al., 2017), such inter-role conflict leads to stress because personal resources 184 (e.g. time and energy) are lost in the process of juggling both work and family roles, leading 185 186 to a negative state of being leading to petulance, fatigue, physiological tension, and negative emotions. Despite the fact that interest in the work-family domain is not new, the potential 187 impact of work-family conflict on road safety has been largely ignored. However, Turgeman-188 Lupo and Biron (2017) demonstrated that work-family conflict leads to increased unsafe 189 commuting behaviours, and Shukri et al. (2021) extended this framework to study dangerous 190 driving acts, finding that work-family conflict predicts dangerous driving behaviours via the 191 role of negative affect. 192

Although evidence suggests that stress has the potential to impair road safety, the nature of the association between violations and stress is less clear (Westerman & Haigney, 2000). There is a need to empirically examine this issue to provide a more elaborate understanding of the mechanisms underlying the detrimental effect of stress within the traffic violation context. We posit that stressors may influence intention formation in two ways.

First, stressors are expected to directly influence intention formation. This is based on the 198 assumption that people's behavioural intentions are formed from their beliefs about 199 performing (violation) behaviour (Ajzen & Fishbein, 2005) and that external factors, 200 including stressors, can potentially influence such beliefs. Stressors have been discussed in 201 terms of their detrimental effects on cognitive functioning, such as inhibiting appropriate 202 decision-making, directing attention, and impeding goal-directed choices by reducing self-203 204 control (Maier et al., 2015). While there are various lines of evidence demonstrating that 205 stress can precipitate a variety of maladaptive outcomes at the behavioural level as reviewed 206 above, most of which are indicative of poor self-control and self-regulation failure (Baumeister & Heatherton, 1996), it is also possible that stress is a potent threat to self-207 regulation that operates at the goal and intentional stage (Wagner & Heatherton, 2013). Thus, 208 209 based on the depletion of self-regulatory resources (Baumeister, 1997), one could expect that stressed drivers who became emotional because of uncontrollable personal demands were 210 211 less inclined to avoid rule violation compared to less stressed drivers because of the notion that stress lowered the perception of self-control at the motivational level. In addition, a few 212 investigators (Louis et al., 2009; Pak et al., 1999) have noted that aversive stress is linked to a 213 214 broad range of (negative) outcomes based on basic hedonistic principles, the idea that human motivation is a function of the pursuit of pleasure and the avoidance of displeasure (Williams, 215 2018). At the motivational level, it is anticipated that people will be motivated to engage in 216 law-breaking on the road to the extent that it is hedonically rewarding (Lawton et al., 1997; 217 Rowe et al., 2016) and provides relief from the displeasure of stress. Conversely, stressed 218 people are often less motivated to engage in safety behaviours, partly because such 219 behaviours reduce pleasure. 220

221 Second, in line with the TPB framework (Ajzen & Fishbein, 2005), we postulate that 222 stressors may influence the formation of intentions through the influence of behaviour-

specific cognitions. In attempting to explain the role of stress in the TPB, Louis et al. (2009) 223 proposed that the hedonic nature of stress has the ability to alter people's attitude towards a 224 particular behaviour, disrupt social and normative influences, and weaken self-efficacy and 225 self-regulation. This suggests that psychological stress may directly shape the three 226 antecedents of intentions: attitude, norms, and PBC. However, few health behaviour studies 227 have tested the role of TPB components as stress mediators, though these found some support 228 229 for the mediation hypothesis. For example, Budden and Sagarin (2007) reported the mediating role of PBC in the relationship between job stress and intention to exercise. In 230 231 another study, Shukri et al. (2016) found that specific stressors (i.e. job demands) can have important indirect effects on healthy eating intention via its effect on attitudes and PBC. 232 While several lines of research in health decision-making have included stress variables 233 within the TPB framework (Budden & Sagarin; Louis et al., 2009; Payne et al., 2005; Shukri 234 et al., 2016), this study is among the first to integrate the contribution of a stress perspective 235 with the TPB approach in the transport safety field. 236

In our reading of the TPB literature, there have been limited studies on the mediating 237 role of moral norms with respect to the relationship between predictors (i.e. stress) and 238 intentions. While moral norms are expected to have an important influence on the drivers' 239 choice to obey or transgress the rules (Holman & Popusoi, 2018), findings suggest that stress 240 appears to directly affect moral reasoning (Starcke et al., 2011; Youssef et al., 2012). For 241 example, in a series of experimental studies, Shalvi et al. (2012) found that individuals under 242 stressful conditions (i.e. time pressure) were more likely to engage in unethical decision-243 244 making, such as cheating.

245 *1.4. The current study:*

This study extends existing research in two distinct ways. While previous work 246 highlights important conclusions regarding the power of the TPB components to predict 247 248 violations on the road, such studies may imply that intervention programs should target a selected single violation behaviour. However, there are also proposals for promising 249 interventions that may be cost effective and efficient ways to broadly address multiple 250 behaviours (Jackson et al., 2012). Thus, it is necessary to examine the key predictors of 251 252 multiple violation behaviours simultaneously. To serve this purpose, the current study employed a multilevel approach in which a comprehensive design and analytic framework 253 254 was used to account for variance in intentions across three violation behaviours (Steenbergen & Jones, 2002). By considering the simultaneous influence of the predictors at different 255 levels; three related violation (i.e. driving above the speed limit, illegal overtaking, running 256 red light) variables (level-1) clustered within individuals (level-2) on the outcome variable, 257 this study avoids the methodological problems in applying traditional techniques (Conner et 258 al., 2016). In particular, the multi-level modelling with random effects makes it possible to 259 deal with the issue of dependence of observations, estimating correct standard error and thus 260 providing a more appropriate significance test (Raudenbush & Bryk, 2002; Vanlaar 2005). 261 The advantages of multilevel modelling analyses were convincingly illustrated in previous 262 TPB studies (Conner et al., 2016; Conner et al., 2017; Sandberg et al., 2016; Schüz et al., 263 2020). Hence, the study adds to the relevant literature by expanding previous TPB studies 264 utilising multilevel modelling analyses (Conner et al., 2016; Conner et al., 2017; Schüz et al., 265 2020) to include psychological stressors to account for variance in intentions. Secondly, 266 previous meta-analyses of the TPB (Conner et al., 2017; McEachan et al., 2011) suggested 267 differences in the predictive power of the TPB for risk and protective behaviours. Since there 268 is an extensive body of TPB literature on traffic violations, viewed within risky behaviour 269 (i.e. motives behind speeding and other violations), which can be hedonistic in nature 270

(Lawton et al., 2009), it is of particular interest to extend the literature to understand a
preventive behaviour framework (i.e. motives to not commit traffic violation during
commuting).

The first aim of the current study was to explore the influence of TPB variables on 274 intentions to avoid traffic violations. In light of the previous literature, we expected that the 275 components of attitude, subjective norms, and PBC will account for significant variation in 276 277 intentions (H_1) . Second, in addition to the TPB variables, we examined the direct contributing role of moral norms, past behaviours, and traffic crash history in the prediction of intentions. 278 279 In accordance with the literature, it was hypothesised that the proposed additional variables will account for a significant increase in explained variance in intentions (H_2) . Next, we 280 simultaneously investigated both the effect of the general perception of stress and the specific 281 nature of stressors (i.e. work-family conflict) on intention. This may help identify the 282 distinctive effect of each stressor, and thus tailor specific behavioural measures. It is expected 283 that perceived stress (H_3) , work-family conflict (H_4) , and intention are negatively related. 284 Specifically, as the stress increases, the intention to avoid violating rules decreases. Finally, 285 we aim to test the mediating effects of TPB components on stress-intention relations within 286 287 the context of traffic violation and further extend previous studies by examining whether any influence of stressors on intention formation is transferred by the effect of moral norms. 288 Based on previous research, it was hypothesised that attitude, social norms, PBC of the TPB 289 components (H_5) , and moral norms (H_6) mediate the relationship between stressors and 290 intentions. 291

292 **2. Method**

293 *2.1 Sample and procedure*

The protocol for the research for this study was approved by the Ethics Committee of Universiti Malaysia Terengganu (UMT/JKEPM/2020/44). The participants were recruited

296	through a convenience sampling procedure from three large cities in Malaysia. This sample											
297	consists of employees working full-time in a wide range of services, including education											
298	(49.1%), banking (20.9%), telecommunication (11.5%), and government offices (18.5%),											
299	identified via the human resources departments of the respective organisations. The inclusion											
300	criteria were as follows: having had a driver's license and driving regularly to and from work.											
301	Initially, 511 sets of data were collected. However, for this study, data from 482 participants											
302	(94.3%) were analysed because of missing data. There were 215 (44.6%) men and 267											
303	(55.4%) women. The majority of respondents were married and had children (75.5%). The											
304	average age was 36.7 years (SD = 10.0 years), ranging from 18 to 60 years, who, on average,											
305	possessed a full license for 15.43 years (SD = 9.04 years). Half of the participants reported											
306	driving in less than 30 min to work (53.3%), 33.6 % took within 1 h to commute to work, and											
307	13.1% took more than 1 h. For further detail see Table 1.											
308												
309	Insert Table 1 about here											
310												
311	2.2 Measures											
312	Appendix displays the measurement items used in this study.											
313	2.2.1 Demographic information											
314	Basic demographic information including age (in years), gender, marital status, driving											
315	experience (in years), and commuting hours were compiled for each participant.											

316 2.2.2 Components of the TPB

In this study, we focused on intention to avoid committing three violation acts¹: driving 317 above the speed limit, illegal overtaking, and running red lights, all related to driving to work 318 319 (and back home). Definitions for driving above the speed limit, illegal overtaking, and running red lights were provided to the participants. For this study, driving above the speed 320 limit was defined as driving in excess of the national speed limits². Illegal overtaking denotes 321 overtaking another vehicle from the left side, overtaking at a double line and overtaking on 322 narrow roads, a bridge and at places where overtaking is prohibited. Running red light, by 323 324 definition, refers as any vehicle entering the intersection (i.e. crossing the stop line) after onset of red signal. The items used to measure the TPB components were similar across the 325 326 three types of traffic violations. Overall, the basic components of the TPB were measured 327 using standard questions from the literature (Conner & Norman, 2015). All TPB components, moral norms, and past behaviour items, except history of traffic crashes, were measured on 7-328 point response scales. 329

330 *2.2.3 Intention*

Intention was assessed using two items for each of the relevant violations. For example, 'I intend to refrain from driving above the posted speed limit, while driving to and from work over the next two weeks' (*strongly disagree–strongly agree*). Cronbach's α for the scales ranged from 0.74 to 0.79 across the three behaviours.

335 *2.2.4 Attitudes*

¹ The traffic offenses included in this study are subjected to the Malaysian Road Safety Act 1987.

² The participants were given information related to Malaysian default speed limits (highways: 110 km/h (68 mph); federal roads: 90 km/h (56 mph); state roads: 90 km/h (56 mph); town: 60 km/h (37 mph); school areas: 35 km/h (22 mph).

Attitudes were measured using four items, for example, 'For me, to refrain from driving
above the posted speed limit while driving to and from work would be...', followed by
endpoints (*foolish–wise; harmful–beneficial*) for cognitive attitude and endpoints (*not enjoyable–enjoyable; unpleasant–pleasant*) for affective attitude. Cronbach's α for the scales
ranged from 0.88 to 0.93 across the three behaviours.

341 *2.2.5 Social norms*

Injunctive norms were measured using two items, for example, 'Most people who are important to me think I should refrain from driving above the posted speed limit, while driving to and from work' (*strongly disagree–strongly agree*). Descriptive norms were measured using two items consisting of the statement, for example, 'I think most people who are important to me refrain from driving above the posted speed limit, while driving to and from work' (*strongly disagree–strongly agree*). Cronbach's α for the two scales ranged from 0.82 to 0.86 across the three behaviours.

349 *2.2.6 PBC*

Self-efficacy was measured using a single item, for example, ('If it were entirely up to me, I am confident that I could refrain from driving above the posted limit, while driving to and from work', *strongly disagree–strongly agree*). Two items made reference to perceived difficulty, for example, 'How difficult is it to refrain from driving above the stated speed limit when you are really in a hurry, while driving to and from work?' (*very easy–very difficult*). Cronbach's α for perceived difficulty ranged from 0.72 to 0.82 across the three behaviours.

357 2.3 Additional predictors

358 *2.3.1 Moral norms*

Moral norms were measured using a single item, for example, 'It will be quite wrong for me to drive above the posted speed limit, while driving to and from work' (*definitely nodefinitely yes*). The use of a single item was based upon previous studies (Conner et al., 2003; Conner et al., 2007; Elliot & Thomson, 2010) using this construct to allow comparable findings.

364 2.3.2 Past violation behaviours

Past behaviours were measured using two items, for example, 'In the past, I frequently drove above the posted speed limit, while driving to and from work' (*strongly disagree–strongly agree*). Cronbach's α for the scales ranged from 0.77 to 0.78 across the three behaviours.

368 2.3.3 History of traffic crash

The participants completed single-item measures for past crash involvement across the three behaviours, for example, 'How many times were you involved in a traffic crash by driving above the posted speed limit in the past two years' (range *0–more than seven times*).

372 2.4 Psychological stressors

373 2.4.1 Perceived stress

The Perceived Stress Scale (PSS; Cohen et al. 1983) was used to measure the perception of stress over the past month. An abbreviated version of the PSS was used, which contained 10 items using a 5-point scale, for example 'How often have you been upset because of something that happened unexpectedly' (*never-very often*). The ten-item scale has been used widely in various cultures and populations (Lee, 2012). It has been found that the measure provides a psychometrically useful tool to measure perceived stress as compared to those of the original instrument (Remor, 2006; Lee, 2012). Cronbach's α for the scale was 0.75.

381 2.4.2 Work-family conflict

Work-family conflict³ was measured using scales based on Carlson et al. (2000), capturing
time and strain-based work-family conflict. Twelve items were used and scored on a 5-point
scale, for example 'My work keeps me from my family activities more than I would like'
(*strongly disagree– strongly agree*). Higher scores indicated greater conflict. Cronbach's α
for the scale was 0.91.

387 2.5 Statistical analysis

The data were analysed using SPSS for initial analysis (means, SDs, reliabilities, and intercorrelations) and Hierarchical Linear Model 8 software (multilevel random coefficient modelling; Raudenbush & Congdon, 2021) with the default setting of full maximum likelihood.

Data sets from 482 participants were used, providing 1,446 within person-behaviours data. In 392 each multilevel model, every participant was therefore associated with a regression line that 393 included an intercept and slope. Thus, each participant provided data at two levels, with level 394 1 being the within-person variables, including TPB components, past behaviours, moral 395 norms, and crash history. Level 2, the between-persons model, included gender, age, marital 396 status, driving experience and commuting hours, work-family conflict, and perceived stress. 397 In the current study, all standardised coefficients were modelled as fixed effects (i.e. dropping 398 the random error term) because of convergence problems (Nezlek, 2001). Level 1 predictors 399 400 were centred around the grand mean. To check whether multilevel modelling is appropriate and needed in our study, we used a full-unconditioned model to estimate the intraclass 401

³ In the initial stages, we have evaluated the bidirectional nature of work interference with family (WIF) and family interference with work (FIW) as recommended by most work-family research (e.g. Amstad et al., 2011). However, we detected multicollinearity problems that undermine the statistical significance of the model. Therefore, it was decided to use only a global measure of work-family conflict.

402 correlation coefficient (ICC)⁴ which measures the proportion of variance in the outcome
403 variable (i.e. intentions) that is due to between person variance and a chi-square statistic
404 (Garson, 2013). Next, the deviance value was used as the basis for model fit measures, with a
405 greater decrease in the deviance (-2LL), suggesting an (significant/insignificant)
406 improvement in model fit (Garson, 2013). To test the mediation hypotheses, we performed
407 multilevel mediation effects with the MLmed Macro in SPSS (Rockwood & Hayes, 2017).

408 **3. Results**

409 *3.1 Correlational analyses*

Table 2 shows that all TPB components are significantly correlated with intentions. The 410 directions of all TPB-intention relationships were positive, except for perceived difficulty, 411 which correlated negatively with intention because of the way the construct was 412 operationalised (easy-difficult). Moral norms and crash history (negative correlation) were 413 also significantly correlated with intentions. However, past behaviours were not related to 414 intentions. All level 2 variables were significantly correlated with intention, except for 415 416 marital status. As expected, both stressors were negatively correlated with intention, in that higher stress was related to lower intentions. Older and more experienced drivers were 417 associated with a higher intention to avoid violations. Descriptive statistics showed that men 418 (mean = 4.90, SD = 1.96) and those with longer commuting hours (mean = 5.03, SD = 1.87)419 reported lower intentions than women (mean = 5.37, SD = 1.86) and those with shorter hours 420 (mean = 5.27, SD = 1.94).421

422

423

Insert Table 2 about here

424

425 *3.2 Predicting intentions*

⁴ Calculated as the intercept variance component in the null model divided by the total of variance components (Garson, 2013).

To test the main effects, intention was regressed on level 1 and level 2 variables. Model 1 426 included only demographic background as control variables; model 2 added stress variables 427 (work-family conflict, perceived stress); model 3 added TPB variables, past violation 428 behaviour, moral norms, and past crash history. While it is noted that past behaviour was not 429 significantly correlated bivariately with intention, the construct was included in the analyses 430 as a control variable, rather than as a component of the model (Terry & O'Leary, 1995). The 431 432 estimated ICC for the fully unconditional model was .55 and the Chi-square was also significant (χ^2 =2276.5, df = 481, p < .001). Thus, 55% of the variance in intentions was 433 434 significantly explained by between-persons differences (i.e. Level 2 variables). These results justify the use of a multilevel model to understand how intentions vary as a function of both 435 within-person and between-person variables. 436

As shown in Table 3, the results of the multilevel analysis showed that adding level 2 437 between-person demographic variables (Model 1) significantly reduced the deviance statistic 438 compared to the intercept-only model ($\Delta \chi^2$ (5) = 24.28, p < .001). At this step, gender and 439 commuting hours were significant predictors, indicating that women and those who commute 440 fewer hours reported a significantly higher intention to avoid violations. Adding stress 441 442 measures (Model 2) as a between-person predictor further significantly reduced the deviance statistic ($\Delta \chi^2$ (2) = 14.42, p < .001). At this step, work-family conflict had a negative 443 significant effect, while perceived stress was insignificant, and gender remained significant. 444 Higher work-family conflict was found to significantly reduce intention to avoid violation, 445 confirming H_4 . 446

The inclusion of all TPB variables and additional predictors (Model 3) further significantly reduced the deviance statistic ($\Delta \chi^2$ (9) = 509.97, p < .001). Confirming *H_I*, all components of the TPB were statistically associated with intentions, moral norms, and crash history. Hence, *H₂* is partially supported. Injunctive norms had the highest value, followed by 451 self-efficacy and cognitive attitude. Importantly, the impact of level 2 variables (demographic 452 background and stressors) was not significant at this step, indicating that their effect on 453 intention was fully mediated by TPB variables. However, consistent with the correlation 454 results, past violation behaviour was not significant.

- 455
- 456
- 457

Insert Table 3 about here

458 *3.3 Mediation analyses*

A multilevel mediation analysis was performed to further explore the mediating effect of 459 TPB on the stress-intention relationship. Considering the effect of perceived stress on 460 intention individually, significant mediated effects were found for cognitive attitude (B = -461 .0173, SE = .0070, z = -2.4660, p = .0137, 95% CI -.0315, -.0037), descriptive norms (B = -462 .0098, SE = .0039, z = -2.5277, p = .0115, 95% CI -.0180, -.0027), self-efficacy (B = -.0268, 463 SE =.0073, z = -3.6525, p = .0003, 95% CI -.0418, -.0126), and difficulty (B= -.0115, SE 464 =.0038 -3.0220, p=.0025, 95% CI -.0199 -.0048) but not affective attitude (B = -.0091, SE = 465 .0061, z = -1.4782, p = .1394, 95 % CI -.0215, .0029), injunctive norms (B =-.0265, SE = 466 .0095, z = -2.7928, p = .0052, 95 % CI -.0456, .0078), and moral norms (B =-.0113, SE = 467 .0072, z = -1.5636, p = .1179, 95 % CI -.0259, .0029). In each case, the direct effect of 468 perceived stress was not significant, indicating a full mediation effect. When considering all 469 significant mediators simultaneously, the analysis showed that the direct effect of perceived 470 stress was not significant (B = -.0005, SE = .0101, t = -.0509, p = .9594, 95% CI -.0204, 471 .0194). There were parallel significant mediation effects for cognitive attitude (B = -.0114, 472 SE = .0047, z = -2.4064, p = .0161, 95% CI - .0210, -.0025), self-efficacy (B = -.0188, SE = 473 .0053, z = -3.5230, p = .0004, 95% CI - .0298, -.0089) and difficulty (B= -.0043, SE = .0021, 474 z = -2.0121, p =.0442, 95% CI -.0090, -.0008), suggesting a full mediation effect. 475

Furthermore, we conducted a similar multilevel mediation analysis to test the extent 476 to which the TPB variables and moral norms mediated the effects of work-family conflict on 477 478 violation intention. When the potential mediator was added individually, significant mediation effects were found for cognitive attitude (B= -.0141, SE = .0041, z = -3.4144, p = 479 .0006, 95% CI -.0226, -.0061), affective attitude (B = -.0093, SE = .0036, z = -2.5764, p =480 .0100, 95% CI -.0167, -.0023), injunctive norms (B=-.0178, SE = .0056, z = -3.1864, p =481 482 .0014, CI 95% -.0290, -.0067), self-efficacy (B =-.0177, SE = .0043, z = -4.0898, p = .0000, CI 95% -.0265, -.0092), difficulty (B= -.0097, SE =.0026, z = -3.744, p =.0002, CI -.0153, -483 484 .0051), and moral norms (B =-.0096, SE = .0042, z = -2.2581, p = .0239, 95 % CI -.0182, -.0012) but not for descriptive norms (B = -.004, SE = .0022, z = -1.9503, p = .0511, 95% -485 .0089, -.0002). The direct effect of work-family conflict became non-significant in each case, 486 suggesting full mediation, except for cognitive attitude, difficulty, and moral norms, which 487 remained significant (partial mediation effect). When the significant mediators were entered 488 simultaneously, self-efficacy (B = -.0071, SE= .0020, z = -3.5075, p =.0005, 95% CI -.0114, -489 .0036), difficulty (B = -.0045, SE = .0015, z = -2.9077, p = .0036, 95% CI -.0078, -.0018), and 490 injunctive norms (B = -.0147, SE = .0046, z = -3.1606, p = .0016, 95% CI -.0240, -.0056) 491 remained as significant mediators. The direct effect of work-family conflict became non-492 significant (B = -.0014, SE = .0052, t = -.2663, p = .7901, 95% CI -.0116, .0088), indicating 493 full mediation effects. In summary, H_5 and H_6 are supported. 494

495 4. Discussion

496 Unlike the majority of tests of the TPB that focus on individual behaviours, the 497 current research examined effects across multiple behaviours. The former approach 498 focuses on between individual differences (i.e. does the individual with the strongest attitude 499 have the strongest intention). The latter approach focuses more on within-person differences 500 across behaviours (i.e. does the person most strongly intend to perform the behaviour for

which they have the strongest attitude). It could be argued that the latter approach is more 501 consistent with the TPB as a model of individual decision making about behaviour. In 502 503 addition, it is important to note that most existing studies have applied the TPB to predict intentions to commit violations, and there is a scarcity of studies on the intention to avoid 504 violating rules. The results showed that both social norm components emerged as significant 505 predictors of intentions, with injunctive norms as the strongest. Such a result is not often 506 507 found in TPB studies. Specifically, reviews have reported comparative weakness of the subjective norm-intention relationship in other domains (Armitage & Conner, 2001; 508 509 McEachan et al., 2011). Nonetheless, a number of studies (Hagger et al., 2007; Hassan et al., 2016) have found variations in TPB variables drawn from Hofstede's (1980) collectivistic 510 versus individualistic cultural dimensions. Supporting these findings, a review of TPB studies 511 (Hassan et al., 2016) highlights differences in relationships between subjective norms and 512 intentions that vary across countries, in that such relationships were stronger in people in 513 collectivistic cultures than in individualistic cultures. In contrast, no systematic variation was 514 found for either attitude or PBC in their review. Overall, it may be that the relative salience of 515 the subjective norm components found in this Malaysian sample, who generally practise 516 collectivist lifestyles (Noordin, 2009), is dependent on such cultural sensitivity. The finding 517 that injunctive norm was a more powerful predictor of intention than descriptive norm is in 518 line with a meta-analysis by Manning (2009). Thus, the perception that most people 519 disapprove of violation behaviour is more important than the perception that others 520 commonly do not commit violations. As put forward by Parker et al. (1992), perceived 521 expectations of others could be a source of guidance in case of driving violations, partly 522 because driving behaviour is more or less a social performance, and one's action is likely to 523 have important implications for others. 524

In line with previous TPB studies (Atombo et al., 2017; Conner et al., 2007; Elliot & 525 Thomson, 2010; Rowe et al., 2016), the present findings confirmed attitude components as 526 527 significant predictors of intention. Previous studies on predicting intention to commit unsafe driving (Atombo et al., 2017; Elliot & Thomson, 2010) have shown that affective measures 528 of attitude are more closely linked to intentions than to cognitive attitudes. These studies 529 support the role of feelings in predicting hedonic and impulsive violation behaviours, such as 530 531 speeding (Lawton et al., 2009). In contrast, we found that cognitive attitude was a stronger predictor than affective attitude. This may add further support for the idea that, in the case of 532 533 preventive behaviour (avoiding violation), people are driven more by cognition than by affect (McEachan et al., 2016). 534

This study also found that both PBC components were significant. That is, drivers 535 who reported a higher efficacy and lesser difficulty associated with the behaviour had 536 stronger intentions not to violate. Previous general road violation literature found a mixed 537 538 role for PBC on intentions. One explanation is the conceptual clarity of the PBC constructs and behavioural relevance of control constructs (Rodgers et al., 2008). In this study, PBC 539 comprised items dealing with ease or difficulty and people's confidence in performing a 540 behaviour, which tapped the component of capacity (McEachan et al., 2016). Therefore, our 541 results were similar to those of studies that deal primarily with the component of capacity 542 (Cristea & Gheorghui, 2016; Elliott et al. 2005; Forward, 2006; Jovanović et al., 2017; Rowe 543 et al., 2016; Parker et al., 1992) as a superior predictor of intentions. Other researchers have 544 also considered the perceived controllability construct that reflects the extent to which 545 individuals perceive the performance of behaviours as separate facets of PBC (Rodgers et al., 546 2008). However, this does not account for significant variance in violation intentions (Elliot 547 & Thomson, 2010). Given that different aspects of control have differential importance 548

across different contexts (Rodgers et al., 2008), it can be argued that this field of research will
benefit from more studies that assess multiple facets of PBC.

551 Moral norms added to the predictions of intentions when controlling for the basic components of the TPB. This supports previous TPB studies (Conner et al., 2007; Elliot & 552 Thomson, 2010), which further highlights the potential importance of moral norms for traffic 553 554 behaviours. Nonetheless, depending on the types and motives of violation behaviours, people may interpret traffic violations as (non) normative actions (Havârneanu & Havârneanu, 555 2012), which may have important moral underpinnings (Holman & Popusoi, 2018). Further 556 studies are needed to determine the extent to which a moral perspective relates to obedience 557 to traffic rules. It is interesting that past behaviours were not relevant predictors in the present 558 559 case, suggesting that such violation behaviours are less habitual. Nevertheless, in cases where past behaviour acts as a determinant, it may be difficult to implement appropriate 560 interventions to address its influence (Chorlton et al., 2012). Another finding is that crash 561 562 history was related to a lower intention to avoid a violation. This could be that drivers with a crash history might become habituated to the dangers and tended to underestimate risks 563 (Ngueutsa & Kouabenan, 2017). Our findings suggest the potential role of a history of 564 crashes as an important indicator of driver's behavioural profile that makes subsequent 565 crashes more likely. This is consistent with research reporting that errors and violations 566 factors predicted accidents prospectively and retrospectively (see de Winter & Dodou, 2010). 567 As with any cross-sectional study, caution must be exercised in relation to attributing 568 causality of the present findings. Further support needs to be provided through longitudinal 569 570 data.

571 Extending the findings of previous work-family studies in the safety field, it was 572 found that work-family conflict emerged as a significant between-person variable, suggesting 573 that the intention to avoid violation weakened as work-family conflict increased. This can be

explained through the lens of self-regulatory failure assumption (Baumeister & Heatherton, 574 1996), in that individuals with higher work-family conflict may experience self-regulation 575 576 breakdown because holding multiple roles may require them to use their resources to regulate and suppress emotions other than managing the limited time and energy. Such situations may, 577 in turn, impair the motivation to take safety measures into driving-related tasks. Similarly, 578 many researchers support the assumption of saving time and energy as the prevalent reason 579 580 for traffic violations under time pressure (Lawton et al., 1997; Salminen, & Lähdeniemi, 2002). Another possible explanation for the hedonism principle may include the idea that 581 582 stressed drivers (i.e. those with competing roles) are motivated to escape from unpleasant feelings by shifting their attention to immediate rewards while ignoring long-term 583 implications (Heatherton & Wagner, 2011), perhaps as a form of coping. Forward (2006) 584 pointed out that drivers who committed specific violations (speeding) reported perceived 585 gains (i.e. getting to the destination faster) rather than perceived negative outcomes such as 586 traffic crashes. 587

In line with this hypothesis, substantial support for the mediating model was obtained. 588 Thus, a contribution of the present study to the literature is that our findings clarify the role of 589 stressors within the TPB in the context of traffic violations. As discussed earlier, unlike work-590 family conflict that is directly linked to intention, the influence of perceived stress is less 591 592 straightforward. When modelled simultaneously, the effect of perceived stress was fully mediated by cognitive attitudes. Our study suggests that an important way in which proximal 593 stress perception may lead to a weaker intention is by lessening positive attitudes towards 594 traffic obedience. This corroborates a study (Hu et al., 2013) that found that drivers with a 595 negative emotional state could not rationally form an appropriate attitude and were likely to 596 drive dangerously. Additionally, work-family conflict was related to a lower propensity to 597 598 obey traffic rules, partly mediated by the lower level of social pressure to comply with traffic

laws. This is in line with the evidence indicating that selective biases in attention that occur in 599 response to stress may lead to neglect of social influences (Driskell et al., 1999), increasing 600 601 individual self-focus (Baumeister, 1984) and promoting egoistic intentions (Starcke et al., 2011) in the driving setting. Importantly, the effects of both work-family conflict and 602 perceived stress on intentions were largely mediated by PBC components. It is evident that 603 stressors have the ability to hinder self-efficacy and impair the sense of internal control, 604 605 thereby reducing the motivation to follow traffic law. This supports the assumption that 606 control is a key mediator of stressful experiences in various domains (Steinbeis et al., 2015). 607 Further, the partial mediating role of moral norms suggests moral norms as a mechanism through which work-family conflict leads to less intent in traffic obedience. 608

609 Finally, although assessing traditional variables to explain violation was not the main objective of this study, the results showed that between-person variables, particularly gender, 610 611 added to the prediction of intentions. These findings align with previous studies, which 612 indicated that male drivers committed traffic violations more often (González-Iglesias et al., 2012; Parker et al., 1995) and had lower intentions to avoid violations than did female drivers 613 (Atombo et al., 2016). Supporting a previous study (Sadeek et al., 2019), longer commuting 614 hours are also related to reduced intention to avoid violation, partly because of driver fatigue 615 (Häkkänen & Summala, 2001) and time reasons. Thus, intervention programs should target 616 these specific populations. 617

This study has several limitations. The generalisability of the current study is limited by the use of convenience sampling techniques. A potential avenue for further studies would be to replicate this study using a national probability sample. Given that cross-national studies suggest variations in TPB components (Hassan et al., 2016) and cultural differences in stressors (Allen et al., 2020), it would also be worthwhile to confirm the present findings using samples originating from different countries and cultures. Future studies should

primarily focus on overcoming the limitations of self-report measures, where data are 624 vulnerable to a number of biases, including socially desirable responses. Although not always 625 626 practical, the use of observation/naturalistic behavioural assessments (e.g. driving simulators) and physiological stress measures (e.g. heart-rate monitor and cortisol reactivity) may be 627 useful to address this drawback. In addition, as noted earlier, the present study used a cross-628 sectional design that does not permit conclusions about causality. It would be valuable for 629 630 future longitudinal designs to shed light on the temporal sequencing of the variables specified in this study. Additionally, a dynamic study is recommended to examine within-person 631 632 effects (i.e. daily fluctuations) of social cognition factors, stressors, and actual violation experiences. Additional theoretically relevant variables (e.g. personal characteristics), which 633 might serve as alternative, third variable explanations of the obtained stress-intention findings 634 were not assessed and should be a focus of future work. Previous studies for instance, 635 suggests that personality traits (i.e. impulsivity, risk taking, hostility) were important 636 variables contributing to stress reactions (Finy et al., 2014) and various unsafe outcomes 637 including traffic violations (Bıçaksız, & Özkan, 2016). The present findings require 638 replication with reference to other types of violations, including disobeying traffic signs, 639 driving under the influence of drugs or alcohol, and using mobile phones while driving. 640 Because there is a possibility that violations are also often carried out outside commuting 641 (Tseng, 2013), further research should further examine the current framework within non-642 commuting context such as leisure purposes. Finally, because our study did not consider the 643 differences between the dual nature of work-family conflict (Allen et al., 2020), it remained a 644 645 matter of future study to address this gap.

646 **5. Practical implication**

647 Importantly, it is worthwhile to consider the practical implications of this study for648 developing broader and longer-term safety education strategies focusing on multiple violation

behaviours aiming to prevent commuting crashes. Therefore, we recommend that the 649 government incorporate the rational-based explanations offered by the TPB into such 650 651 programs, targeting social norms, personal attitudes, internal control, and moral norms to bolster intentions to comply with traffic rules and ultimately reduce driving violations. While 652 educational programmes represent one of the core road safety measures, the efficiency of 653 these programs in changing traffic related behaviours is still rather unclear (Topolšek et al., 654 655 2019). In fact, a number of studies reported the opposed and unintended effects of educational intervention (Glendon et al., 2014; Poulter & McKenna, 2010). This highlights 656 657 the needs for further work to refine and extend existing safety education approaches to enhance our knowledge of the benefits of these interventions. Still, evidence on TPB 658 intervention studies (Cuenen et al., 2016; Cutello et al., 2020; Floreskul et al., 2016; Stead et 659 al., 2005; Steinmetz et al, 2016) exists claiming some promising results. In keeping with 660 suggestions raised by Glendon et al. (2014), before every intervention, a pilot evaluation 661 662 assessment may be of crucial importance to identify any potential threat of unintended effects and to improve any theoretical based components that was not tapped in the concrete 663 intervention materials (Stibe, & Cugelman, 2016). 664

From a theoretical perspective, our study sheds further light on the underlying 665 processes by which contextual factors (i.e. specific stressors versus overall life stress) may be 666 implicated in increasing the tendency to commit traffic violations. Our results provide a new 667 insight into how stressors embedded within a particular context (i.e. work-family conflict) 668 have a potential direct threat to road safety during commuting, adding it to the list of 669 psychological stressors known to influence traffic offences. Understanding this process could 670 help identify specific stressors tied directly to work and family roles, which eventually lead to 671 more appropriate road crash prevention. Therefore, steps are needed to create awareness of 672 673 the carryover effects of work and family pressures on the driving environment. Strengthening

work-life policies at national and organisational levels would be an important target to reduce
the negative exposure to work-family conflict, which has the potential to increase commuting
safety behaviour. This would also point to the need to expand the investigations of effective
policies that promote work-life balance and thus minimise potential spillover effects of the
work and family domains into driving areas.

679 The indirect effect of stressors on intention formation by influencing the sociocognitive components could be a potential target for prevention and intervention. Efforts are 680 needed to incorporate, for example, stress management and relaxation skills to foster 681 emotional capacity to cope with daily stressful encounters and target the strengthening of 682 social cognition factors. In particular, because self-regulatory failure may play a role in the 683 stress process (Beimester & Heatherton, 1996), consistent with the suggestions of Gwyther 684 and Holland (2012), there may be significant advantages in incorporating self-regulatory 685 skills as a potential risk management strategy to reduce traffic violations. 686

687 6. Conclusion

This study has advanced our knowledge of traffic violations by strengthening the explanatory 688 effect of the TPB by adding stressors to understand the individual motives behind commuting 689 violation prevention. It presents compelling evidence that TPB components explain a 690 substantial part of the variance in intentions. In particular, work-family conflicts can directly 691 influence intentions. Of particular relevance is the mediation of social cognition variables 692 693 between stressors and intentions, supporting the idea that psychological stressors play an important role in intention formation in traffic violation situations. We believe that our study 694 695 suggests an important line of research in attempting to test the hypothetical links among stressors, the social cognition model, and road safety outcomes for commuting employees. 696

697 Funding

This work was supported by Universiti Malaysia Terengganu, Malaysia [TAPE-2018-55126].

699

700 **References**

- Ajzen, I. (1991). The theory of planned behavior. Organizational Behavior and Human
 Decision Processes, 50(2), 179-211.
- Ajzen, I. (2011). The theory of planned behaviour: Reactions and reflections. *Psychology and Health*, 26 (9), 113-1127.
- Ajzen, I., and Fishbein, M. (2005). "The Influence of Attitudes on Behavior," in *The Handbook of Attitudes*, D. Albarracín, B. T. Johnson, and M. P. Zanna (eds.),
 Mahwah, NJ: Erlbaum, pp. 173-221.
- Ajzen, I., & Madden, T. J. (1986). Prediction of goal-directed behavior: Attitudes, intentions,
 and perceived behavioral control. *Journal of Experimental Social Psychology*, 22(5),
 453-474.
- Allen, T. D., French, K. A., Dumani, S., & Shockley, K. M. (2020). A cross-national metaanalytic examination of predictors and outcomes associated with work–family
 conflict. *Journal of Applied Psychology*, *105*(6), 539- 576.
- Amstad, F. T., Meier, L. L., Fasel, U., Elfering, A., & Semmer, N. K. (2011). A metaanalysis of work–family conflict and various outcomes with a special emphasis on cross-domain versus matching-domain relations. *Journal of Occupational Health Psychology*, *16*(2), 151.
- Armitage, C. J., & Conner, M. (2001). Efficacy of the theory of planned behaviour: A metaanalytic review. *British Journal of Social Psychology*, 40(4), 471-499.
- Atombo, C., Wu, C., Zhong, M., & Zhang, H. (2016). Investigating the motivational factors
 influencing driver's intentions to unsafe driving behaviours: Speeding and overtaking
 violations. *Transportation Research Part F: Traffic Psychology and Behaviour*, 43,
 104-121.
- Atombo, C., Wu, C., Zhang, H., & Wemegah, T. D. (2017). Perceived enjoyment,
 concentration, intention, and speed violation behavior: Using flow theory and theory
 of planned behavior. *Traffic Injury Prevention*, 18(7), 694-702.
- Baumeister, R. F. (1997). Esteem threat, self-regulatory breakdown, and emotional distress as
 factors in self-defeating behavior. *Review of General Psychology*, *1*(2), 145-174.
- Baumeister, R. F. (1984). Choking under pressure: Self-consciousness and paradoxical
 effects of incentives on skilled performance. *Journal of Personality and Social Psychology*, 46, 610-620.
- Baumeister, R. F., & Heatherton, T. F. (1996). Self-regulation failure: An overview.
 Psychological Inquiry, 7(1), 1-15.

- Bhalla, K., Mohan, D., & O'Neill, B. (2020). How much would low-and middle-income
 countries benefit from addressing the key risk factors of road traffic injuries?. *International Journal of Injury Control and Safety Promotion*, 27(1), 83-90.
- Bıçaksız, P., & Özkan, T. (2016). Impulsivity and driver behaviors, offences and accident
 involvement: A systematic review. *Transportation research part F: traffic psychology and behaviour*, *38*, 194-223.
- Bin, N. R. (2014). Rising trend of work-related commuting accidents, deaths, injuries and
 disabilities in developing countries: a case study of Malaysia. *Industrial health*, 52(4),
 275-277.
- Bowen, L., Budden, S. L., & Smith, A. P. (2020). Factors underpinning unsafe driving: A
 systematic literature review of car drivers. *Transportation Research Part F: Traffic Psychology and Behaviour*, 72, 184-210
- Budden, J. S., & Sagarin, B. J. (2007). Implementation intentions, occupational stress, and
 the exercise intention-behavior relationship. *Journal of Occupational Health Psychology*, 12(4), 391.
- Carlson, D. S., Kacmar, K. M., & Williams, L. J. (2000). Construction and initial validation
 of a multidimensional measure of work–family conflict. *Journal of Vocational Behavior*, 56(2), 249-276.
- Cialdini, R. B., Kallgren, C. A., & Reno, R. R. (1991). A focus theory of normative conduct:
 A theoretical refinement and re-evaluation of the role of norms in human behavior.
 Advances in Experimental Social Psychology, 24, 201-234.
- Chorlton, K., Conner, M., & Jamson, S. (2012). Identifying the psychological determinants of
 risky riding: An application of an extended Theory of Planned Behaviour. *Accident Analysis & Prevention*, 49, 142-153.
- Cohen, S., Kamarck, T., & Mermelstein, R. (1983). A global measure of perceived stress.
 Journal of Health and Social Behavior, 24, 385-396
- Conner, M., & Armitage, C. J. (1998). Extending the theory of planned behavior: A review
 and avenues for further research. *Journal of Applied Social Psychology*, 28, 1429–
 1464.
- Conner, M., Lawton, R., Parker, D., Chorlton, K., Manstead, A. S., & Stradling, S. (2007).
 Application of the theory of planned behaviour to the prediction of objectively
 assessed breaking of posted speed limits. *British Journal of Psychology*, 98(3), 429453.
- Conner, M., McEachan, R., Lawton, R., & Gardner, P. (2016). Basis of intentions as a
 moderator of the intention-health behavior relationship. *Health Psychology*, 35(3),
 219-227.
- Conner, M., McEachan, R., Lawton, R., & Gardner, P. (2017). Applying the reasoned action
 approach to understanding health protection and health risk behaviors. *Social Science & Medicine*, *195*, 140-148.

- Conner, M., & Norman, P. (2015). Predicting and Changing Health Behaviour: Research
 and Practice with Social Cognition Models. McGraw-Hill Education (UK).
- Conner, M., Smith, N., & McMillan, B. (2003). Examining normative pressure in the theory
 of planned behaviour: Impact of gender and passengers on intentions to break the
 speed limit. *Current Psychology*, 22(3), 252-263
- Cristea, M., & Gheorghiu, A. (2016). Attitude, perceived behavioral control, and intention to
 adopt risky behaviors. *Transportation Research Part F: Traffic Psychology and Behaviour*, 43, 157-165.
- Cuenen, A., Brijs, K., Brijs, T., Van Vlierden, K., Daniels, S., & Wets, G. (2016). Effect
 evaluation of a road safety education program based on victim testimonials in high
 schools in Belgium. *Accident Analysis & Prevention*, *94*, 18-27.
- Cutello, C. A., Hellier, E., Stander, J., & Hanoch, Y. (2020). Evaluating the effectiveness of a
 young driver-education intervention: Learn2Live. *Transportation Research Part F: Traffic Psychology and Behaviour*, 69, 375-384.
- de Winter, J. C., & Dodou, D. (2010). The Driver Behaviour Questionnaire as a predictor of
 accidents: A meta-analysis. *Journal of Safety Research*, 41(6), 463-470.
- Driskell, J. E., Salas, E., & Johnston, J. (1999). Does stress lead to a loss of team
 perspective?. *Group dynamics: Theory, Research, and Practice*, *3*(4), 291-302.
- Elliott, M. A., Armitage, C. J., & Baughan, C. J. (2005). Exploring the beliefs underpinning
 drivers' intentions to comply with speed limits. *Transportation Research Part F: Traffic Psychology and Behaviour*, 8(6), 459-479.
- Elliott, M. A., & Thomson, J. A. (2010). The social cognitive determinants of offending drivers' speeding behaviour. *Accident Analysis & Prevention*, 42(6), 1595-1605.
- Finy, M. S., Bresin, K., Korol, D. L., & Verona, E. (2014). Impulsivity, risk taking, and
 cortisol reactivity as a function of psychosocial stress and personality in adolescents. *Development and psychopathology*, 26, 1093-1111.
- Floreskul, V., Žardeckaitė-Matulaitienė, K., Endriulaitienė, A., & Šeibokaitė, L. (2016).
 Effectiveness of pre-driver education programme for high school students:
 Application of Theory of Planned Behaviour on road risk taking behaviour. *Journal of Behavior, Health & Social Issues*, 8(1), 8-16.
- Forward, S. E. (2006). The intention to commit driving violations–A qualitative study.
 Transportation Research Part F: Traffic Psychology and Behaviour, 9(6), 412-426.
- Forward, S. E. (2009). The theory of planned behaviour: The role of descriptive norms and
 past behaviour in the prediction of drivers' intentions to violate. *Transportation Research Part F: Traffic Psychology and Behaviour*, 12(3), 198-207.

Garson, G. D. (2013). Introductory guide to HLM with HLM 7 software. *Hierarchical linear modeling: Guide and applications*, pp. 55-96.

- Ge, Y., Qu, W., Jiang, C., Du, F., Sun, X., & Zhang, K. (2014). The effect of stress and
 personality on dangerous driving behavior among Chinese drivers. *Accident Analysis*& *Prevention*, 73, 34-40.
- Glendon, A. I., McNally, B., Jarvis, A., Chalmers, S. L., & Salisbury, R. L. (2014).
 Evaluating a novice driver and pre-driver road safety intervention. *Accident Analysis*& *Prevention*, 64, 100-110.
- Greenhaus, J. H., & Beutell, N. J. (1985). Sources of conflict between work and family roles.
 Academy of Management Review, *10*, 76–88.
- González-Iglesias, B., Gómez-Fraguela, J. A., & Luengo-Martín, M. Á. (2012). Driving
 anger and traffic violations: Gender differences. *Transportation Research Part F: Traffic Psychology and Behaviour*, 15(4), 404-412.
- Gupta, M., & Bandyopadhyay, S. (2020). Regulatory and road engineering interventions for
 preventing road traffic injuries and fatalities among vulnerable road users in low-and
 middle-income countries: a systematic review. *Frontiers in Sustainable Cities*, 2,
 10.https://doi.org/10.3389/frsc.2020.00010.
- Gwyther, H., & Holland, C. (2012). The effect of age, gender and attitudes on self-regulation
 in driving. *Accident Analysis & Prevention*, 45, 19-28.
- Hagger, M. S., Chatzisarantis, N. L., Barkoukis, V., Wang, J. C., Hein, V., Pihu, M., ... &
 Karsai, I. (2007). Cross-cultural generalizability of the theory of planned behavior
 among young people in a physical activity context. *Journal of Sport and Exercise Psychology*, 29(1), 1-19.
- Häkkänen, H., & Summala, H. (2001). Fatal traffic accidents among trailer truck drivers and
 accident causes as viewed by other truck drivers. *Accident Analysis & Prevention*, *33*,
 187-196.
- Hassan, L. M., Shiu, E., & Parry, S. (2016). Addressing the cross-country applicability of the
 theory of planned behaviour (TPB): A structured review of multi-country TPB
 studies. *Journal of Consumer Behaviour*, 15(1), 72-86.
- Havârneanu, G. M., & Havârneanu, C. E. (2012). When norms turn perverse: Contextual
 irrationality vs. rational traffic violations. *Transportation Research Part F: Traffic Psychology and Behaviour*, 15(2), 144-151.
- Heatherton, T. F., & Wagner, D. D. (2011). Cognitive neuroscience of self-regulation failure.
 Trends in Cognitive Sciences, 15(3), 132-139.
- Hofstede, G. (1980). Culture's Consequences: International differences in work related
 values. Beverly Hill, CA, Sage.
- Holman A.C. & Popusoi, S. A. (2018). Ethical predispositions to violate or obey traffic rules
 and the mediating role of driving styles. *The Journal of Psychology*, *152* (5), 257-275.
- Holmgreen, L., Tirone, V., Gerhart, J., & Hobfoll, S. E. (2017). Conservation of resources
 theory. *The Handbook of Stress and Health: A Guide to Research and Practice*, pp. 443-457.

- Hu, T. Y., Xie, X., & Li, J. (2013). Negative or positive? The effect of emotion and mood on
 risky driving. *Transportation Research Part F: Traffic Psychology and Behaviour*,
 16, 29-40.
- International Labour Organization (2010). World Social Security Report 2010/11.
 Available: <u>http://www.ilo.org/wcmsp5/groups/public/%2D%2D-dgreports/%2D%2D-dgreports/%2D%2D-dgreports/%2D%2D-publ/documents/publication/wcms_146566.pdf</u>
- Jackson, C. A., Henderson, M., Frank, J. W., & Haw, S. J. (2012). An overview of prevention
 of multiple risk behaviour in adolescence and young adulthood. *Journal of Public Health*, 34(suppl_1), i31-i40
- Jovanović, D., Šraml, M., Matović, B., & Mićić, S. (2017). An examination of the construct
 and predictive validity of the self-reported speeding behavior model. *Accident Analysis & Prevention, 99*, 66-76.
- Lawton, R., Conner, M., & McEachan, R. (2009). Desire or reason: predicting health
 behaviors from affective and cognitive attitudes. *Health Psychology*, 28(1), 56-65.
- Lawton, R., Parker, D., Manstead, A. S., & Stradling, S. G. (1997). The role of affect in
 predicting social behaviors: The case of road traffic violations. *Journal of Applied Social Psychology*, 27(14), 1258-1276.
- Lee, E. H. (2012). Review of the psychometric evidence of the perceived stress scale. *Asian Nursing Research*, 6(4), 121-127.
- Legree, P. J., Heffner, T. S., Psotka, J., Martin, D. E., & Medsker, G. J. (2003). Traffic crash
 involvement: Experiential driving knowledge and stressful contextual antecedents. *Journal of Applied Psychology*, 88(1), 15-26.
- Lheureux, F., Auzoult, L., Charlois, C., Hardy-Massard, S., & Minary, J. P. (2016). Traffic
 Offences: Planned or Habitual? Using the Theory of Planned Behaviour and Habit
 strength to explain frequency and magnitude of speeding and driving under the
 influence of alcohol. *British Journal of Psychology*, *107*(1), 52-71.
- Louis, W. R., Chan, M. K. H., & Greenbaum, S. (2009). Stress and the theory of planned
 behavior: Understanding healthy and unhealthy eating intentions. *Journal of Applied Social Psychology*, *39*(2), 472-493.
- Maier, S. U., Makwana, A. B., & Hare, T. A. (2015). Acute stress impairs self-control in
 goal-directed choice by altering multiple functional connections within the brain's
 decision circuits. *Neuron*, 87(3), 621-631.
- Manning, M. (2009). The effects of subjective norms on behaviour in the theory of planned
 behaviour: A meta-analysis. *British Journal of Social Psychology*, 48(4), 649-705.
- McEachan, R. R. C., Conner, M., Taylor, N. J., & Lawton, R. J. (2011). Prospective
 prediction of health-related behaviours with the theory of planned behaviour: A metaanalysis. *Health Psychology Review*, 5(2), 97-144.

- McEachan, R., Taylor, N., Harrison, R., Lawton, R., Gardner, P., & Conner, M. (2016).
 Meta-analysis of the reasoned action approach (RAA) to understanding health
 behaviors. *Annals of Behavioral Medicine*, *50*(4), 592-612.
- McLinton, S. S., & Dollard, M. F. (2010). Work stress and driving anger in Japan. Accident
 Analysis & Prevention, 42(1), 174-181.
- Ministry of Transport Malaysia (2021). Malaysia road fatalities index.
 https://www.mot.gov.my/en/land/safety/malaysia-road-fatalities-index, accessed on
 30 April 2021.
- Musa, M. F., Hassan, S. A., & Mashros, N. (2020). The impact of roadway conditions towards accident severity on federal roads in Malaysia. *PLoS One*, 15(7), e0235564.
- Nezlek, J. B. (2001). Multilevel random coefficient analyses of event-and interval-contingent
 data in social and personality psychology research. *Personality and Social Psychology Bulletin*, 27(7), 771-785.
- Ngueutsa, R., & Kouabenan, D. R. (2017). Accident history, risk perception and traffic safe
 behaviour. *Ergonomics*, 60(9), 1273-1282.
- Ning, P., Schwebel, D. C., Huang, H., Li, L., Li, J., & Hu, G. (2016). Global progress in road
 injury mortality since 2010. *PLoS One*, *11*(10), e0164560.
- Noordin, F. (2009). Individualism-collectivism: A tale of two countries. *Problems and Perspectives in Management*, 7(2), 36-45.
- Ouellette, J. A., & Wood, W. (1998). Habit and intention in everyday life: The multiple
 processes by which past behavior predicts future behavior. *Psychological Bulletin*,
 124, 54–74.
- Pak, S. H. K., Olsen, L. K., & Mahoney, B. S. (1999). The relationships of health behaviors to perceived stress, job satisfaction, and role modeling among health professionals in South Korea. *International Quarterly of Community Health Education*, 19(1), 65-76.
- Parker, D., Manstead, A. S., Stradling, S. G., Reason, J. T., & Baxter, J. S. (1992). Intention
 to commit driving violations: An application of the theory of planned behavior. *Journal of Applied Psychology*, 77(1), 94-101.
- Parker, D., Reason, J. T., Manstead, A. S., & Stradling, S. G. (1995). Driving errors, driving
 violations and accident involvement. *Ergonomics*, *38*(5), 1036-1048.
- Payne, N., Jones, F., & Harris, P. R. (2005). The impact of job strain on the predictive
 validity of the theory of planned behaviour: An investigation of exercise and healthy
 eating. *British Journal of Health Psychology*, 10(1), 115-131.
- Poulter, D. R., & McKenna, F. P. (2010). Evaluating the effectiveness of a road safety
 education intervention for pre-drivers: An application of the theory of planned
 behaviour. *British Journal of Educational Psychology*, 80(2), 163-181.
- Raudenbush, S.W., & Congdon, R.T. (2021). *HLM 8: Hierarchical linear and nonlinear modeling*. Chapel Hill, NC: Scientific Software International, Inc.

- Raudenbush SW, Bryk AS. (2002). Hierarchical Linear Models: Applications and Data
 Analysis Methods. 2nd ed. Thousand Oaks, CA: Sage.
- Remor, E. (2006). Psychometric properties of a European Spanish version of the Perceived
 Stress Scale (PSS). *The Spanish Journal of Psychology*, 9(1), 86-93.
- Rockwood, N. J., & Hayes, A. F. (2017). MLmed: An SPSS macro for multilevel mediation
 and conditional process analysis. In Poster presented at the annual meeting of the
 Association of Psychological Science (APS), Boston, MA.
- Rodgers, W. M., Conner, M., & Murray, T. C. (2008). Distinguishing among perceived
 control, perceived difficulty, and self-efficacy as determinants of intentions and
 behaviours. *British Journal of Social Psychology*, 47(4), 607-630.
- Roidl, E., Frehse, B., & Höger, R. (2014). Emotional states of drivers and the impact on
 speed, acceleration and traffic violations—A simulator study. *Accident Analysis & Prevention*, 70, 282-292.
- Rowden, P., Matthews, G., Watson, B., & Biggs, H. (2011). The relative impact of workrelated stress, life stress and driving environment stress on driving outcomes. *Accident Analysis & Prevention*, 43(4), 1332-1340.
- Rowe, R., Andrews, E., Harris, P. R., Armitage, C. J., McKenna, F. P., & Norman, P. (2016).
 Identifying beliefs underlying pre-drivers' intentions to take risks: An application of
 the Theory of Planned Behaviour. *Accident Analysis & Prevention*, 89, 49-56.
- Sadeek, S., Rifaat, S., Mahamud, H., Saif, A., Rimol, A., & Tahmid, A. (2019). Effect of
 fatigue on traffic law violation of bus drivers in context of developing countries. In *Proceedings of the Eastern Asia Society for Transportation Studies* (Vol. 12).
- Salminen, S., & Lähdeniemi, E. (2002). Risk factors in work-related traffic. *Transportation Research Part F: Traffic Psychology and Behaviour*, 5(1), 77-86.
- Schüz, B., Brick, C., Wilding, S., & Conner, M. (2020). Socioeconomic status moderates the
 effects of health cognitions on health behaviors within participants: Two
 multibehavior studies. *Annals of Behavioral Medicine*, 54(1), 36-48.
- Shalvi, S., Eldar, O., & Bereby-Meyer, Y. (2012). Honesty requires time (and lack of justifications). *Psychological Science*, 23(10), 1264-1270.
- Shevlin, B. R., & Goodwin, K. A. (2019). Past behavior and the decision to text while driving
 among young adults. *Transportation Research Part F: Traffic Psychology and Behaviour*, 60, 58-67.
- Shukri, M., Jones, F., & Conner, M. (2016). Work factors, work–family conflict, the theory
 of planned behaviour and healthy intentions: A cross-cultural study. *Stress and Health*, 32(5), 559-568.
- Shukri, M., Jones, F., & Conner, M. (2021) Work-Family Conflict and Dangerous Driving
 Behaviours: The Mediating Role of Affect. *Stress and Health.* 37 (4), 669-681.
- Simon, F., & Corbett, C. (1996). Road traffic offending, stress, age, and accident history
 among male and female drivers. *Ergonomics*, 39(5), 757-780.

- 963SOCSO (2018). Annual Report. https://www.perkeso.gov.my/en/about-us/media-964centre/annual-report.htmlAccessedOctober 2021.
- Staton C, Vissoci J, Gong E, Toomey N, Wafula R, Abdelgadir J, et al. (2016) Road Traffic
 Injury Prevention Initiatives: A Systematic Review and Metasummary of
 Effectiveness in Low and Middle Income Countries. *PLoS ONE*, *11*(1): e0144971.
- Starcke, K., Polzer, C., Wolf, O. T., & Brand, M. (2011). Does stress alter everyday moral
 decision-making?. *Psychoneuroendocrinology*, 36(2), 210-219
- Stead, M., Tagg, S., MacKintosh, A. M., & Eadie, D. (2005). Development and evaluation of
 a mass media Theory of Planned Behaviour intervention to reduce speeding. *Health education research*, 20(1), 36-50.
- Steenbergen, M. R., & Jones, B. S. (2002). Modeling multilevel data structures. *American Journal of Political Science*, 46, 218-237.
- Steinbeis, N., Engert, V., Linz, R., & Singer, T. (2015). The effects of stress and affiliation on
 social decision-making: Investigating the tend-and-befriend pattern.
 Psychoneuroendocrinology, 62, 138-148.
- Steinmetz, H., Knappstein, M., Ajzen, I., Schmidt, P., & Kabst, R. (2016). How effective are
 behavior change interventions based on the theory of planned behavior?. *Zeitschrift für Psychologie*, 224 (3), 216-233.
- Stibe, A., & Cugelman, B. (2016). Persuasive backfring: When behavior change interventions
 trigger unintended negative outcomes. In International conference on persuasive
 technology (pp. 65–77). Berlin: Springer
- Sukor, E. S. A., Suratkon, A., Mohammad, H., & Yaman, S. K. (2018). Safe commuting factors from existing guidelines in Malaysia: a review for the construction sector.
 In *IOP Conference Series: Earth and Environmental Science* (Vol. 140, No. 1, p. 012109). IOP Publishing.
- Terry, D. J., & O'Leary, J. E. (1995). The theory of planned behaviour: The effects of
 perceived behavioural control and self-efficacy. *British Journal of Social Psychology*, 34(2), 199-220.
- 991 Topolšek, D., Babić, D., & Fiolić, M. (2019). The effect of road safety education on the
 992 relationship between Driver's errors, violations and accidents: Slovenian case
 993 study. *European Transport Research Review*, 11(1), 1-8.
- Trafimow, D., Sheeran, P., Conner, M., & Finlay, K. A. (2002). Evidence that perceived
 behavioural control is a multidimensional construct: Perceived control and perceived
 difficulty. *British Journal of Social Psychology*, 41(1), 101-121.
- Tseng, C. M. (2013). Speeding violations related to a driver's social-economic demographics
 and the most frequent driving purpose in Taiwan's male population. *Safety Science*, 57, 236-242.

- Turgeman-Lupo, K., & Biron, M. (2017). Make it to work (and back home) safely: The effect
 of psychological work stressors on employee behaviour while commuting by car.
 European *Journal of Work and Organizational Psychology*, 26(2), 161-170.
- 1003 Vankov, D., Schroeter, R., & Twisk, D. (2021). Understanding the predictors of young
 1004 drivers' speeding intention and behaviour in a three-month longitudinal study.
 1005 Accident Analysis & Prevention, 151, 105859.
- Vanlaar, W. (2005). Multilevel modeling in traffic safety research: two empirical examples
 illustrating the consequences of ignoring hierarchies. *Traffic Injury Prevention*, 6(4),
 311-316.
- Wagner, D. D., & Heatherton, T. F. (2013). Emotion and self-regulation failure. In J. J. Gross
 (Ed.), *Handbook of emotion regulation* (2nd ed.,). New York, NY: Guilford
 Publications. pp. 613-628.
- Vargas-Garrido, H., Moyano-Díaz, E., & Andrades, K. (2021). Sleep problems are related to
 commuting accidents rather than to workplace accidents. *BMC Public Health*, 21(1),
 1-7.
- Weinstein, N. D. (1989). Effects of personal experience on self-protective behavior.
 Psychological Bulletin, 105(1), 31-50.
- Westerman, S. J., & Haigney, D. (2000). Individual differences in driver stress, error and
 violation. *Personality and Individual Differences*, 29(5), 981-998.
- WHO (2018). Global Status Report on Road Safety 2018 World Health Organization,
 Geneva. https://www.who.int/violence_injury_prevention/road_safety_status/2018/en/
- Williams, D. M. (2018). Psychological hedonism, hedonic motivation, and health-related
 behavior. In D. M. Williams, R. E. Rhodes, & M. T. Conner (Eds.), *Affective determinants of health behaviour*. New York, NY: Oxford University Press. pp. 204–
 234.
- Youssef, F. F., Dookeeram, K., Basdeo, V., Francis, E., Doman, M., Mamed, D., ... & Legall,
 G. (2012). Stress alters personal moral decision making. *Psychoneuroendocrinology*,
 37(4), 491-498.
- Zhang, Y., Jing, L., Sun, C., Fang, J., & Feng, Y. (2019). Human factors related to major road
 traffic accidents in China. *Traffic Injury Prevention*, 20(8), 796-800.
- Zuwairy, M. S., Harith, A. A., Nobuyaki, H., Naim, N. M., & Yon, R. (2020). Road Traffic
 Accidents: A Descriptive Study of Commuting Injury among Healthcare Workers in
 Malaysia 2014-2016. *International Journal of Public Health and Clinical Sciences*, 7(1), 58-71.
- 1034
- 1035
- 1036
- 1037

Table 1

1058 Description of respondents' demographic data ($N_{participants} = 482$)

Description	Frequency	Percentage
0: Male	215	44.6%
1: Female	267	55.4%
1: 18-25	72	14.9%
2: 26-30	75	15.6%
3:31-40	168	34.9%
4:41-50	114	23.7%
	0: Male 1: Female 1: 18-25 2: 26-30 3:31-40	0: Male 215 1: Female 267 1: 18-25 72 2: 26-30 75 3:31-40 168

-		5: 50>	53	11.0%
	Marital status	0: Single	118	24.5%
		1: Married	364	75.5%
	Driving experience	1:Less than 5 years	69	14.3%
		2:6 to 15 years	195	40.5%
		3: 16 > years	218	45.2%
	Driving hours	1:less than 30 min	257	53.3%
		2:30 min to 60 min	162	33.6%
		3: 60 min to 90	40	8.3%
		min		
		4: 90> min	23	4.8%
9				
0				
1				
2				

1067 **Table 2**

1068 Descriptive statistics and correlations

variables	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17
1.Intention	-																
2.Cognitive Attitude	.42**	-															
3.Affective Attitude	.39**	.74**	-														
4.Injunctive Norm	.60**	.40**	.36**	-													
5.Descriptive Norm	.24**	.24**	.30**	.28**	-												
6.Self-efficacy	.39**	.27**	.26**	.38**	.19**	-											
7.Difficulty	20**	15**	14**	13**	.00	17**	-										
8.Moral norm	.40**	.33**	.33**	.47**	.16**	.31**	18**	-									
9.Past behaviour	00	01	.00	00	01	00	.06	01	-								

10.Crash	21**	22**	16**	21**	03	18**	.15*	14**	.03	-							
history																	
11. Gender ^a	.12**	.15**	.13**	.13**	02	.04	06*	.09*	.00	16**	-						
12. Age	.10**	.17**	.16**	.11**	.07**	.16**	14**	.13**	04	17**	29**	-					
13. Status ^b	.05	.10**	.08**	.07**	.03	.09**	06**	.06*	00	13**	.03	.54**	-				
14. Experience	.09*	.16**	.16**	.10*	.07*	.15**	11*	.13**	.00	15**	15**	.64**	.50*	-			
15. Hour ^c	09*	02	02	06	.00	.01	.04	.00	00	03	01	.13**	.14**	.10	-		
16. Stress	10**	09**	05*	10**	09**	12**	.12**	05	.00	.12**	.08**	17**	07*	16**	.00	-	
17.WFC	13**	12**	09*	11**	07*	14**	.19**	07**	.02	.15**	02	-01	.03	.01	.05	.36**	-
Mean	5.16	5.55	5.15	5.24	3.95	5.24	2.56	5.03	1.59	0.46	0.50	36.7	0.49	15.43	0.47	25.46	29.12
SD	1.92	1.91	1.84	1.92	1.75	1.90	1.59	2.09	1.04	1.29	0.50	10.0	0.50	9.04	0.50	5.72	9.52
Note: Status = marital status; Hours = driving hours; Stress = perceived stress; WFC = work-family conflict; ^a (0= man, 1 = woman); ^b (0 =																	
single, 1 = married); $^{c}(0 = \text{less than 30 minutes}, 1 = \text{more than 30 minutes})$; Within-person variables (N _{observations} = 1446), Between-person																	
variables ($N_{\text{participants}} = 482$); For within-person by between-person correlations, we repeat the between variables for each behaviour (then <i>r</i> is																	

1072 based on 3 x N).

1074 **Table 3**

	Step 1 M	Iodel		Step 2 N	Iodel		Step 3 Model				
Predictors	В	SE	β	В	SE	β	В	SE	β		
Intercept (y ₀₀)	5.16	0.07		5.16	0.07		5.16	0.04			
Age (γ ₀₁)	0.00	0.01	0.02	0.00	0.01	0.00	-0.00	0.00	-0.03		
Gender (γ_{02})	0.51	0.14	0.13***	0.52	0.14	0.13***	0.10	0.10	0.02		
Marital (y ₀₃)	-0.04	0.19	0.01	-0.01	0.19	0.00	-0.04	0.13	-0.00		
Experience (γ_{04})	0.02	0.01	0.10	0.02	0.01	0.01	0.00	0.01	0.03		
Hours (γ_{05})	-0.28	0.14	0.07*	-0.26	0.14	0.06	-0.12	0.09	0.03		
Perceived stress (γ_{06})				-0.01	0.01	-0.05	-0.00	0.00	-0.00		
Work-family conflict (γ_{07})				-0.02	0.00	-1.10**	-0.00	0.00	-0.02		
Cognitive attitude (γ_{10})							0.08	0.02	0.08**		

1075 Hierarchical multi-level regressions of intention onto predictors

Affective attitude (γ_{20})	0.08	0.03	0.08**
Injunctive norm (γ_{30})	0.35	0.02	0.35***
Descriptive norm (γ_{40})	0.06	0.02	0.05**
Self- efficacy (γ_{50})	0.10	0.02	0.10***
Perceived difficulty (γ_{60})	-0.09	0.02	-0.07***
Moral norm (γ ₇₀)	0.05	0.02	0.05**
Past behaviour (y ₈₀)	0.00	0.02	0.00
Crash history (γ ₉₀)	-0.08	0.03	-0.05*

1076 Note. B = unstandardized coefficient; β = standardized coefficient; SE = standard error; Experience = driving experience; Hours = Commuting 1077 hours; Intercept only model at Step 0, Deviance = 5565.09; Step 1 model, Deviance = 5540.81, $\Delta \chi^2(5) = 24.28$, p < .001; Step 2, Deviance = 1078 5526.38, $\Delta \chi^2(2) = 14.42$, p < .001; Step 3, Deviance = 5016.41, $\Delta \chi^2(9) = 509.97$ p < .001. *p < 0.05; **p < 0.01; ***p 0.001

1079

1080

1081

Appendix

The theory of planned behaviour

Intentions

I intend to refrain from driving above the posted speed limit, while driving to and from work over the next two weeks (*strongly disagree–strongly agree*).

I will try to refrain from driving above stated speed limit, while driving to and from work over the next two weeks (*strongly disagree–strongly agree*).

Attitude

For me, to refrain from driving above the posted speed limit while driving to and from work would be...

(foolish-wise; harmful-beneficial)

(not enjoyable-enjoyable; unpleasant-pleasant)

Injunctive norm

Most people who are important to me think I should refrain from driving above the posted speed limit, while driving to and from work (*strongly disagree–strongly agree*).

Most people who are important to me want me to refrain from driving above the posted speed limit, while driving to and from work (*strongly disagree–strongly agree*).

Descriptive norms

I think most people who are important to me refrain from driving above the posted speed limit, while driving to and from work (*strongly disagree–strongly agree*)

I think most people I know refrain from driving above the posted speed limit, while driving to and from work (*extremely unlikely*-*extremely likely*)

PBC

If it were entirely up to me, I am confident that I could refrain from driving above the posted limit, while driving to and from work (*strongly disagree–strongly agree*).

How difficult is it to refrain from driving above the stated speed limit when you are really in a hurry, while driving to and from work? (*very easy–very difficult*).

How difficult is it to refrain from driving above stated speed limit while commuting when you are in a bad mood, while driving to and from work? (*very easy–very difficult*).

Additional predictors

Moral norms

It will be quite wrong for me to drive above the posted speed limit while driving to and from work (*definitely no–definitely yes*).

Past behaviours

In the past, I frequently drove above the posted speed limit, while driving to and from work (*strongly disagree–strongly agree*)

To what extent have you been driving above the posted speed limit in the past, while driving to and from work (*not at all– all the time*)

History of traffic crash

How many times were you involved in a traffic crash by driving above the posted speed limit in the past two years (*0-more than seven times*)

Perceived stress scale^a

How often have you been upset because of something that happened unexpectedly? How often have you felt that you were unable to control the important things in your life? How often have you felt nervous and stressed?

How often have you felt confident about your ability to handle your personal problems? How often have you felt that things were going your way?

How often have you found that you could not cope with all the things you had to do? How often have you been able to control irritations in your life? How often have you felt that you were on top of things?

How often have you been angered because of things that happened that were outside of your control?

How often have you felt difficulties were piling up so high that you could not overcome them?

Work-family conflict^b

My work keeps me from my family activities more than I would like.

The time I must devote to my job keeps me from participating equally in household responsibilities and activities.

I have to miss family activities due to the amount of time I must spend on work responsibilities.

The time I spend on family responsibilities often interfere with my work responsibilities.

The time I spend with my family often causes me not to spend time in activities at work that could be helpful to my career.

I have to miss work activities due to the amount of time I must spend on family responsibilities.

When I get home from work I am often too frazzled to participate in family activities/responsibilities.

I am often so emotionally drained when I get home from work that it prevents me from contributing to my family.

Due to all the pressures at work, sometimes when I come home I am too stressed to do the things I enjoy.

Due to stress at home, I am often preoccupied with family matters at work.

Because I am often stressed from family responsibilities, I have a hard time concentrating on my work.

Tension and anxiety from my family life often weakens my ability to do my job.

Note: ^a(*never*-*very often*); ^b(*strongly disagree*- *strongly agree*).