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1 Observing the observation of (vulnerable) road user behaviour and

2 traffic safety: a scoping review

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Observing the observation of (vulnerable) road user behaviour and traffic safety: a scoping review

15 Behavioural observation studies in road safety research collect naturalistic data of 16 road users that are not informed (beforehand) of their participation in a research 17 project. It enables the observation of behavioural and situational processes that 18 contribute to unsafe traffic events, while possible behavioural adaptations due to 19 the road users' recognition of being observed are minimized. The literature in this 20 field is vast and diverse, with studies dating back to the 1930s. The aim of this 21 paper is to summarize the research efforts in the domain of road user behavioural 22 observation research to examine trends and developments of this type of research, 23 using a scoping review. After the definition of certain selection criteria, 600 journal 24 articles found in three major online databases were retrieved and included in this 25 review.

26 The number of publications regarding road user behavioural observation studies 27 has increased rapidly during recent years, indicating the importance of behavioural 28 observation studies to study traffic safety. Most studies collected data on car drivers (81%), while vulnerable road users have been observed in 32% of all 29 30 studies, with pedestrians and (motor)cyclists as the most common road user types. 31 The results showed that the main goal of behavioural observation is to monitor 32 (51%), followed by the evaluation of a specific safety improving measure (38%) 33 and the development of behavioural models (10%). Most topics relate to traffic 34 events where interactions with other road users are necessary, indicating that the 35 examination of behavioural processes underlying single-vehicle crashes has 36 received little attention. The ongoing developments of automated video analysis 37 software tools can be the next methodological step forward in video-based 38 behavioural observation studies, since it enables a more objective data collection
39 and data analysis process.

40 Keywords: behavioural observation; behavioural indicators; scoping review;
41 traffic safety; vulnerable road users

42 **1. Introduction**

43 Road safety literature has identified road user behaviour as a key aspect of road safety, 44 which plays an important role in the complex interactions between road users, the vehicle 45 and the environment (Polders, Van Haperen and Brijs, 2018, p127). Several studies 46 highlight the importance of examining road user behaviour, since it is in 94 % of all 47 crashes a contributing factor, while the environment and the vehicle are partly responsible 48 in 18 % and 8 % of all crashes (Reason, 2000; Sabey and Taylor, 1980; Treat et al., 1979). 49 However, crash data usually lacks information on behavioural aspects (e.g. Laureshyn, 50 2010). Therefore, several traffic safety evaluation methodologies that do not rely on crash 51 data have been proposed and applied in the scientific literature. These approaches focus 52 on both dangerous situations and actual crashes, either in real world or hypothetical traffic 53 situations. According to Shinar (1998), research methodologies for evaluating traffic 54 safety are either experimental or observational. In experimental research, one can 55 manipulate traffic conditions to trigger events of interest (e.g. in a simulation) or question 56 participants about what they would do when confronted with a certain situation (e.g. in 57 interviews). For observational research, on the other hand, researchers are dependent on 58 the behaviours that are shown in real-world environments by users or test subjects under 59 observation. Table 1 provides an overview of these different approaches, including some 60 concrete examples of methodologies.

	Observational	Experimental			
Reported	Observed	Simulated	Interviewed		
	Naturalistic Driving	Driving Simulator	Questionnaires		
Crash data Behavioural Observation* Traffic conflict observation		Microsimulation	Interviews		
		Virtual reality	Focus groups		

61 **Table 1** The most common safety evaluation methods used in scientific literature.

62 * focus of this scoping review

63 Observational studies collect naturalistic data in settings in which the road user behaviour 64 of interest occurs (Eby, 2011). There is no control over the traffic situations that 65 participants will encounter. Several methodologies have been used to observe behaviour. 66 Naturalistic driving techniques use instrumented vehicles to collect detailed behavioural 67 data of its driver, but participants are usually aware that they are part of a research 68 experiment (e.g. Pariota & Bifulco, 2015). This review focuses solely on behavioural observation studies in which the road user is not informed (beforehand and usually not 69 70 afterwards either) about participation in the research project. This is an important 71 difference, because natural settings in which road users are unaware of being observed 72 reduce bias caused by behavioural adaptation effects (i.e. changing one's behaviour when 73 one knows one is being observed) and increase the likelihood to observe the whole 74 diversity of behaviours, including risky and aggressive driving behaviours (Shinar, 1998). 75 Although it cannot be guaranteed that road users passing the observation site remain 76 unaware that road user behaviour is been monitored, it is not likely that they have time 77 enough to adapt their behaviour, if they would like to do so, once the observing equipment 78 (e.g. human observers or cameras) has been detected. Furthermore, behavioural 79 observation studies capture the behaviour of all the road users passing the observation 80 site, while naturalistic driving studies continuously observe selected participants. A

special form of behavioural observation studies is traffic conflict observation, which has
the specific aim to measure traffic safety in terms of the expected number of crashes.
These studies were not included in this review, but have been the topic of another scoping
review (Johnsson, et al., 2018)

The scientific literature in the field of road user behavioural observation studies is vast and diverse, with publications dating back to the 1930s. This study sets out to summarize these research efforts to examine trends and developments that are important for future research efforts. Studies that focus directly or indirectly on road safety aspects using road user behavioural observation techniques are included in this scoping review.

90 2. Methodology

91 Scoping reviews are a means to "map rapidly the key concepts underpinning a research 92 area and the main sources and types of evidence available" (Mays, & Roberts, & Popay, 93 2001). They are highly effective in research areas that are not reviewed comprehensively 94 before. Such reviews can be used for many applications, even outside the authors' 95 intended purposes (Armstrong & Hall, & Doyle, & Waters, 2011) and that guiding future 96 research and reducing duplicate efforts are important additional objectives (Wee & 97 Banister, 2016). An important strength of a scoping review is that a systematic literature 98 retrieval process, based on a search protocol, is used, which provides transparency to the 99 reader of the review. This is not the case with narrative literature reviews, in which 100 implicit processes are used to provide evidence that reinforces the ideas and research 101 objectives of the author (Garg, & Hackam, & Tonelli, 2008). With such studies, the reader 102 cannot determine if the evidence presented is based on the author's experience, how 103 extensively the literature was searched for and if specific studies were ignored due to 104 contradicting findings (Van Haperen, 2016). A scoping review is also very useful when 105 the research aim does not focus on a specific issue (e.g. the effectiveness of a certain 106 traffic safety improving measure), but examines the extent, range and nature of research 107 activities within a particular research domain. The main difference with a systematic 108 review is that for scoping reviews the research question is rather broad and that the quality 109 of the retrieved evidence is generally not evaluated (Dijkers, 2015). To describe the exact 100 focus of this study, the following key-concepts are defined (Van Haperen, 2016):

<u>Road users</u> are all users of the road infrastructure that can move freely and are not
 constraint to guiding systems (e.g. trains on rails). Transportation modes that are
 guided are excluded because drivers/riders of those modes have limited control
 over their direction.

<u>Safety</u> is the absence of possible unintended harm to road users or damage to the
 vehicle of their mode of transportation (based on Evans (2004, p6)).

Behavioural observation studies are studies observing the behaviour of road users,
 in which the observed road users are not informed (beforehand) of their
 participation into the research project. These studies focus on how road users pass
 the observation site and should be related to traffic safety. Traffic conflict studies
 fit that definition, but will not be covered in this review as stated in the
 introduction.

<u>Vulnerable road users (VRUs)</u> are those road users that do not have a protective
 shell around them (Wegman & Aarts, 2006). Those road users include, among
 others, pedestrians, cyclists and motorcyclists.

126 This paper builds on the findings published in Van Haperen (2016). Therefore, it 127 makes use of the same methodology and literature selection processes that are described 128 in the following sections. For more information, readers are referred to the Van Haperen 129 (2016) report.

130 2.1 Search Protocol

131 A search protocol was created, which included information on the databases searched, the 132 search terms used and the in- and exclusion criteria applied. After testing several 133 combinations, the search term "Traffic AND (Behavio*r OR Safety)" was used in the 134 online databases Web of Science, ScienceDirect and TRID (Van Haperen, 2016). Only 135 studies published in English in peer-reviewed journals were included. Publications up to 136 and including 2015 were retrieved. The databases identified 21.243 references, which 137 were all imported into the Endnote referencing software (2015). After the automatic and 138 manual removal of duplicate entries, 12.188 references remained for screening.

139 2.2 Screening

140 As can be seen in Figure 1, three rounds of screening were used by the review team, 141 consisting of two members, to identify eligible references. The first screening round 142 focused on excluding all studies that were not peer-reviewed journal articles published in 143 English. Afterwards, both reviewers evaluated the title and abstract of each reference to 144 determine the relevance of the remaining 7.072 entries. Different decisions were 145 discussed between the members of the research team and if no consensus was reached, 146 the reference was kept for the final round of screening. During this final stage, full-text 147 articles were read and relevant information was extracted and stored into a codebook, 148 programmed in Microsoft Access (2015). Each article was coded by both reviewers until 149 a satisfactory level of coding consistency (> 90 % of identical coding per paper) was 150 reached, minimizing coding bias. Additionally, a subsample of papers was coded by both 151 review members during the entire process to continue testing coding consistency. 152 Whenever a reviewer was not sure about certain aspects of the extracted information or 153 if an article did not seem to be eligible for information extraction, a notation was made

and the references was fully checked by the other review member as well (Van Haperen,2016).

The automatic text retrieval function in Endnote was used to retrieve the full-text articles. Articles that could not be found automatically were searched for manually through Google Scholar and Research Gate. Also, a list of missing articles was created and sent to several international partners. Finally, the library services of Hasselt University were consulted for trying to acquire missing articles. In total, 23 articles that are potentially relevant (3 %) could not be retrieved. A list of all references that were included in the review and a list of potential relevant journal articles can be found in Van Haperen (2016).



164 **Figure 1** Flow diagram of the literature inclusion process.

165 **3. Trends in road user behavioural observation research**

166 Road user behavioural observation studies have been published in the scientific literature 167 for almost 80 years, presenting a vast amount of diverse information. Appendix A 168 provides a descriptive summary of the main findings, focusing on important study 169 characteristics. More detailed information can be found elsewhere (Van Haperen, 2016), 170 since the focus of this paper is to highlight important trends and developments that can 171 be observed in the long history of road user behavioural observation studies. Information 172 regarding study purposes, data collection processes, study characteristics and topics and 173 indicators are discussed in the following sections.

174 **3.1 Road user focus and number of publications**

175 Around one third (n=193, 32 %) of all identified studies collected data on at least one 176 VRU-type (from here on mentioned as VRU-studies), with the first study dating back to 177 1973. Of these studies, pedestrians have been observed most (70 %), followed by cyclists, 178 including electric bikes and mopeds (28%), and motorcyclists (14%). Over 80% 179 (n=485, 81 %) of the studies collected data on at least one non-VRU-type (from here on 180 mentioned as Driver-studies), with the first study dating back to 1939. Car drivers were 181 included in all but one of these studies. Proportions of other road user types (e.g. buses 182 and heavy good vehicles) could not be correctly identified, since authors have not always 183 clearly stated which vehicle-types were included in their research. Certain studies (n=78, 184 13 %) have been categorized both as a VRU- and driver-study, since information of both 185 road user categories was collected. Figure 2 provides an overview of the number of annual 186 publications in the period 1935-2015, split into study type, including a line showing 187 studies that belonged to both study types. The trend lines show an exponential increase 188 in the number of publications during recent years, highlighting that during recent years

189 more studies have been published. More than 70 % (n=343) of Driver-studies have been 190 published since the 2000s, while almost 60 % (n=112) of all VRU-studies have been 191 published during the 2010s. A clear peak in the number of Driver-studies can be observed 192 during the early 1980s, possibly caused by the increased interest in evaluating the 193 effectiveness of the implementation of mandatory seatbelt laws in the United States. As 194 expected, the graphs further show that both VRU- and Driver-studies follow the same 195 trend in terms of in- and decreasing number of publications between consecutive years 196 from the 1990s onwards.



Figure 2 The annual amount of publication per study-type. The dotted line shows an
exponential trend line. Note that certain studies are represented twice: as VRU- or
driver study and both.

The increasing number of publications is in line with the results of Hagenzieker et al. (2014), who found that studies in the domain of road safety research in general have increased since 2000. Contributing factors to this increase are possibly that during the 1990s the field of road safety research moved towards "an increasingly scientific and cross-disciplinary phase" (OECD, 1997) and that the topic of road safety received more attention and recognition after the publication of the World Report on Road Traffic Injury Prevention of the WHO (Peden et al., 2004), in which road traffic fatalities were predicted to be the third leading cause of death worldwide by 2020. The fact that the increasing number of publications since 2000 in the domain of road safety research in general also applies to behavioural observation studies suggests that the latter are an important tool to study traffic safety.

212 3.2 Data collection

213 Figure 3 shows the use of the two most common data collection tools for road user 214 behavioural observation studies. On-site human observers have been most often used for 215 more than 60 years until the mid-2000s. They can collect data relatively quickly and 216 efficiently, but the main criticism of using trained observers is that the data collection 217 process is influenced by inter- and intra-coder reliability (e.g. Williams, 1981) and that 218 there is a certain degree of subjectivity (Grayson, 1984). Furthermore, it can be very 219 difficult to collect all data when multiple events occur simultaneously. These drawbacks 220 become more important when the data collection process is more complex and when the 221 measurements are based on estimations that cannot be verified afterwards (e.g. speed). 222 The introduction of new data collection tools like video cameras, loop detectors and speed 223 guns has enabled the more reliable and detailed measurements of behavioural indicators 224 that are based on speed, distance and time. Finally, using human observers to collect and 225 analyse data is a time consuming process with potentially high labor costs. The use of 226 video cameras as primary data source has surpassed the use of direct human observations 227 during the mid-2000s, the same period in which the number of publications started to 228 increase rapidly. Even though most often human observers review the video data, the 229 opportunity exists to repeat the entire data selection and analysis process. Other 230 advantages of video cameras over on-site human observers are the possibilities to 231 continuously collect data during longer periods of time, the opportunities to replay videos as many times as necessary to extract relevant information and that the videos provide an
efficient means of communicating results to other researchers and stakeholders.
Furthermore, the costs of using cameras has decreased due to their increased usage,
making it more attractive to use them (St-Aubin, Saunier & Miranda-Moreno, 2015).





239 Given the fact the cameras are most often used during the data collection process 240 nowadays, the development of automated video analysis tools is an area of active research 241 with already promising results and may become the next methodological step forward for 242 behavioural observation studies. First, fully functional tools will be able to collect and 243 analyse video data in a completely objective manner, assuming that the algorithms created 244 by humans are working properly. Secondly, the costs for analysing large datasets are 245 reduced, since no human observers are needed to review the videos manually. Also, the 246 analysis process can run continuously on the background. Finally, traffic cameras are 247 becoming part of the road infrastructure system in many countries nowadays, so road 248 users are likely to be used to them and not to adapt their driving behaviour after noticing 249 one. Furthermore, the already installed cameras could be used to collect data for research

12

250 purposes, avoiding additional costs for installing new ones.

251 Many researchers have already focused on the development of software tools that 252 can (semi-)automatically analyse videos (e.g. T-Analyst (2017) and Traffic Intelligence 253 (Jackson et al. 2013; Saunier, 2012)). Such research efforts were only found sporadically 254 in this review (n=4), most likely because the developments of (semi-)automated video 255 analysis software has not only potential for behavioural observation studies, but is also 256 promising for all kinds of purposes, including traffic management, incident management 257 and security in general. Technological problems (e.g. accuracy of identifying road users 258 and their exact position) are not the only challenges for the development of automated 259 video analysis software tools. The review suggests that privacy legislations limiting the 260 possibilities to collect (personal) data can be an important issue. This is especially 261 important if one is interested in inside-vehicle behaviour. Only two studies were found 262 that positioned cameras in such a way that it was possible to look inside vehicles 263 (Summala et al, 1996; Tenkink & Van der Horst, 1990) without the drivers' knowledge of 264 being observed, but these publications are over 20 years old. Most often, trained human 265 observers on-site are used to collect this type of data, with the drawback that the data 266 needs to be collected and analysed manually. Other methodologies exist that can collect 267 video data inside the vehicle (e.g. naturalistic driving), but in these cases the driver is 268 usually aware of being observed. Privacy issues can also relate to outside-vehicle 269 behaviour as well since cameras might record license plate numbers or even capture 270 crashes on tape. These issues are typically not mentioned in published articles, but privacy 271 legislations can potentially influence the decision whether or not to use video cameras as 272 a data collection tool.

273 3.3 Research purpose

This review identified four main purposes of behaviour observation studies. Thesecategories are exclusive and defined as follows:

Monitoring: One location or multiple similar locations are observed to monitor
 the road user behaviour. The goal of such studies is to 'look what happens' and
 not to examine a certain intervention or safety improving measure. An example is
 the observation of the effect of mobile phones on pedestrians' crossing behaviour
 (Hatfield, & Murphy, 2007).

• <u>Evaluation</u> of certain safety improving measures: Using a before-after, withwithout or cross-sectional research design, the effect of an infrastructural intervention or safety improving measure is evaluated (e.g. the evaluation of the impact of red light cameras on dilemma zone behaviour (Polders et al, 2015)).

- Model development: Real world data is used to develop/calibrate/validate
 behavioural models for simulation tools (e.g. microsimulation models), for
 example gap-acceptance models (e.g. Kadali, & Vedagiri, & Rathi, 2015).
- Automated video-analysis <u>software development</u>: Video data of traffic events is
 used to develop and test automated video-analysis tools (e.g. tracking algorithms
 and road user classification). In these cases, the behavioural observation serves as
 a case study to test the developed algorithms. An example is the study of Zaki &
 Sayed (2014) in which non-conforming pedestrian behaviour was observed.

293 Monitoring has been the main aim (around 51%), followed by the evaluation of a safety 294 treatment (38%) and the development of behavioural models (10%). The same 295 distribution of study purposes was found for both VRU- and driver-studies, indicating 296 that the approaches towards examining VRU- and driver safety are similar. Figure 4 297 contains the research purposes per road user type over the years, to investigate if the 298 purposes have remained constant over time. Only studies investigating drivers' behaviour 299 during the 1980s and 1990s focused more on the evaluation of safety improving 300 treatments rather than on monitoring. Furthermore, studies focusing on cyclists and the 301 evaluation of safety improving treatments have been conducted mainly since 2010. 302 Cyclists have rarely been included in model development studies. The only two studies 303 found did not focus on cyclists specifically but on any road user type that passed the 304 location of interest. Finally, it can be observed that the number of studies have increased 305 over time for all research purposes for the four road user types.



Number of published studies [#]

Figure 4 The number of publications, presented according to research purpose andpublication year.

309 3.4 Topics and indicators

306

310 Behavioural processes targeted by behavioural observation studies were examined. To do 311 so, two important steps were followed: first, titles and abstracts of the included studies 312 were examined to determine the main topic and secondly, the full-text papers were accessed to identify which indicators were collected to draw conclusions. Following this
procedure, we identified 24 research topics and 38 behavioural indicators. Indicators that
related to aspects other than behaviour, for example personal characteristics like age,
gender and ethnicity, were ignored. More information on the defined topics and indicators
can be found in Van Haperen (2016).

318 *3.4.1 Topics*

319 Table 3 shows the categorization of the research topics, based on the three pillars of 320 contributing crash factors, i.e. the road user, the vehicle and the infrastructure (Sabey and 321 Taylor, 1980), to examine how these pillars are related to behaviour observations 322 investigated in the literature. Most studies focused on topics that relate to interactions 323 with other road users, both for VRU- and driver-studies (78 % and 68 % respectively). 324 To further investigate these behavioural processes, a categorization of the types of 325 interactions is used. The first category, direct interaction, is composed of situations in 326 which two or more road users need to negotiate with each other and anticipate each other's 327 actions, to pass each other safely. Examples are crossing and yielding behaviour, where 328 direct communication between the road users involved is necessary. This type of 329 behaviour has been researched most often, in the case of VRU-studies it even comprises 330 66 % of all retrieved publications. Secondly, an indirect interaction is defined as an event 331 where a road user's behaviour is influenced by the presence of another road user, but 332 where direct communication is not necessary. For example, during an overtaking 333 manoeuvre the driver overtaking needs to interact with the driver that is being overtaken, 334 but does not need to communicate with the other driver to safely start or finish the 335 overtaking manoeuvre. Another example is car-following, where the driver following 336 another vehicle needs to adapt his driving behaviour to the leading driver, but where the leading driver does not need to adapt his/her behaviour to the driver behind. Thirdly, a
possible interaction is defined as an event where a road user's behaviour is not necessarily
influenced by the presence, and may be more influenced by the absence of other road
users (e.g. speeding).

341 The findings indicate that direct interactions have received most research 342 attention, especially for VRUs. This may be because during these traffic events VRUs are 343 at their most vulnerable. Furthermore, topics that were categorized in the other interaction 344 categories are mostly not applicable to pedestrians and cyclists. When looking at driver 345 studies, it can be observed that most research efforts have dealt with topics related to 346 direct interactions (30%), and that the topic of 'speeding' has received most attention 347 (16%). This finding may be explained by the fact that a microscopic relationship between 348 average speed and crash risk has been proven (Elvik, & Christensen, & Amundsen, 2004).

349 **Table 3** The types of behavioural topics, sorted on occurrence in VRU-studies. Between
350 squared brackets are the occurrences in percentage for VRU- and driver-studies.

ROAD USER	VEHICLE	ENVIRONMENT			
[78% ; 68%]	[5%;12%]	[17% ;12%]			
	T 1'1	C'			
Direct interaction	In-vehicle	Circumstances			
[66% ; 30%]	[2%;9%]	[3%;6%]			
Crossing [44%; 11%]	Protective clothing [2%; 0%]	Shared space [2%; 1%]			
Yielding [18%; 14%]	Seatbelt [0%; 7%]	Work zone safety [1%; 3%]			
Road sharing [3%; 1%]	Child restraint [0%; 1%]	Weather conditions [0%; 2%]			
Merging [1%; 4%]	Turn indicator [0%; 1%]				
Indirect interaction		Outside-vehicle devices			
[7%;15%]		[14%;8%]			
Gap acceptance [3%; 4%]		Red-light running [10%; 4%]			
Overtaking [2% ; 5%]		Phase change warning [4%; 3%]			
Car-following [1%; 4%]		Emergency Vehicle Alert [0%; 1%]			

Lane change [1%; 2%]		
Possible interaction		
[3% ; 20%]		
Speeding [2%; 16%]		
Dilemma zone [1%; 4%]		
Other	Other	
[2%;3%]	[3% ; 3%]	
Risky driving [1%; 2%]	Mobile phone [2%; 2%]	
Violations [1%; 1%]	Other Distraction [1%; 1%]	



351 Note: Few studies were identified as having two topics. Studies that could not be put into these



352 categories are not included: hence, the percentages do not necessarily add up to 100%.

353 Finally, it was investigated if the topics that received most research attention changed 354 over the years. Table 4 contains the top three research topics for VRU- and driver-studies 355 per decade, starting at the decennium in which at least two studies investigated the same 356 topic. It shows that VRU-studies mainly focused on locations where interactions with 357 other road users is required, with crossing being examined most often. Yielding behaviour 358 and red-light running are the other two topics that complete the top three of research 359 topics in each decennium. For Driver-studies more variation can be observed, namely that 360 speeding, yielding and seatbelt use have been the most important research topics. 361 Furthermore, in earlier decennia the research focus shifted more often, showing different 362 top three topics between the 1970s and 1990s. However, since the 1990s the main 363 research efforts have focused on the same three topics. Finally, only two studies during 364 the 1980s were found that focused on yielding. There is no clear explanation why this 365 topic received relatively little attention, while it was present in the top three research 366 topics during the other decades.

367 Table 4 Evolution of the top three research topics per road user category from 1970, for
368 topics that have been researched at least twice per decennium. Between brackets is the
369 number of publications.

	1970-1979	1980-1989	1990-1999	2000-2009	> 2010
	(maging (2)	Crossing (2)	Crossing (7)	Crossing (23)	Crossing (51)
VRU	Crossing (2)	Yielding (2)	Yielding (2)	RLR (4)	Yielding (13)
	Yielding (7)	Seatbelt (12)	Speeding (11)	Yielding (22)	Speeding (33)
Driver	Speeding (3)	ding (3) Speeding (11) Cro		Speeding (20)	Yielding (28)
	Overtaking (2) Crossing (6)		Yielding (6)	Crossing (18)	Crossing (21)

370 *3.4.2 Behavioural indicators*

371 An overview of the 38 identified behavioural indicators is given in Table 5. They were 372 categorized to gain insights into the complexity of the measurements by distinguishing 373 between simple yes/no or other binary measurements and more detailed types of 374 measurements (e.g. continuous and categorical data types). It was found that most 375 indicators (23/38) have been examined using yes/no-measurements, including four 376 indicators for which both types of data were collected. Yielding, for example, was found 377 to be measured as a yes/no-variable in older studies, while more recent studies included 378 more detailed measurements (e.g. hard, soft or no yield). The findings show that yes/no-379 measurements are most common: at least 78% of VRU- and 49% of Driver-studies 380 included at least one of such observation. Speed has been measured most often for both 381 study types, followed by red-light running for VRUs and headways for Drivers. 382 Furthermore, the results show that the data collection process focuses on multiple aspects 383 while examining the behaviour of interest. For example, only 16% of Driver-studies 384 focused on speeding behaviour specifically, but almost 60% of all Driver-studies included 385 speed measurements.

- **Table 5** The types of behavioural indicators, sorted on occurrence in VRU-studies.
- 387 Between squared brackets the occurrence in percentage for VRU- and Driver-studies.

Yes/No [78% ; 49%] ¹	More detailed [65% ; 43%] ¹	Both [53%; 68%] ¹
Red-light running [38%; 10%]	Crossing path [21%; 2%]	Speed [40% ; 57%]
Jaywalking [19%; 0%]	Waiting time [20%; 4%]	Looking [24%; 3%]
Gap acceptance [15%; 10%]	Waiting position [15%; 1%]	Yielding [13%; 15%]
Evasive action [12%; 3%]	Lateral position [11%; 11%]	Merging [1%; 4%]
Protective clothing [7%; 0%]	Crossing time [9%; 1%]	
Carrying items [7%; 0%]	Gap size [7% ; 5%]	
Pedestrian Push Button Usage [6%; 0%]	Headway [5% ; 18%]	
Mobile phone [5%; 4%]	Yielding distance [3%; 2%]	
Wrong-way driving [5%; 0%]	Other distractions [3%; 1%]	
Turn indicator [4%; 3%]	Other violations [2%; 1%]	
Lane change [3%; 7%]	Lane choice [1%; 1%]	
Stop-sign compliance [3% ; 2%]	Distance to Stop Line [0%; 4%]	
Use of lights [3%; 1%]	Merging distance [0%; 2%]	
Stop/go decision [2%; 8%]	Overtaking attempts [0%; 1%]	
Yellow-light running [2%; 4%]	Intersection Entry Time [0%; 1%]	
Overtaking [2%; 4%]		
Smoking [1%; 1%]		
Seatbelt [0%; 10%]		
Child restraint [0%; 1%]		

388

¹ At least one indicator in this category has been measured

389 *3.4.3 Single-vehicle crashes*

Aarts, L.T. et al (2016) examined crash data in the period 2000-2014 of nine EU-member states and found that between 22-49% and 64-85% of all recorded crashes of car occupants and bicyclists respectively were single-vehicle crashes. Furthermore, the recording of single-vehicle crashes is subject to underreporting, especially with regard to cyclists where reporting levels are estimated to be around 10% (Elvik & Mysen, 1999).

395 This is important, since the previous paragraphs showed that most publications have 396 focused on traffic events where interaction with other road users is required (either 397 directly or indirectly). However, behaviours that are related to single-vehicle crashes and 398 are not influenced by the presence of other road users have received less attention. A 399 substantial portion of driver studies (16%) investigated speeding behaviour, but for 400 vulnerable road users almost no studies investigating other aspects than interacting 401 behaviours were observed. Possibly, research questions targeting this issue have used 402 other methodologies that, until now, are more suitable (e.g. naturalistic driving and self-403 reported driving behaviour studies), since it is difficult to predict when and where a 404 single-vehicle crash will occur.

405 *3.4.4 Validity*

406 Although a wide variety of indicators has been used to measure road user 407 behaviour, efforts to validate them are very rare. The literature only shows a direct 408 relation between speed and safety (Elvik, 2004). It seems that in general behavioural 409 indicators are selected based on engineering judgement, since typically no justification or 410 insights in the selection of the indicators is given. Behavioural observation studies focus 411 on revealed behaviour under 'normal' traffic conditions, since it is not possible to predict 412 where and when crashes will occur. It is possible that during data collection periods 413 crashes are observed, however, they will not provide a sufficient sample size to base 414 conclusions on. In order to make conclusions about safety, these studies most often 415 compare revealed behaviour with guidelines (e.g. lateral overtaking distance), law 416 violations (e.g. red-light running) or the extent to which behaviour changes after 417 implementation of a safety improving measure (e.g. more yielding after installation of a 418 yielding sign). Naturalistic driving studies may offer the opportunity to validate these 419 behavioural indicators, if necessary, since this methodology enables the collection of 420 detailed information of both actual crashes and 'normal' traffic conditions. Another 421 opportunity to validate and study behavioural indicators in more detail is the use of the 422 increasing number of cameras and other traffic data collection devices (radar and lidar) 423 installed by governments and road agencies. However, acquiring the necessary

424 permissions to use these data can be a challenge, given that these traffic data collection
425 devices are mainly installed for monitoring purposes and that privacy legislations are
426 becoming more strict.

427 3.5 Methodological aspects

428 3.5.1 Research set-up

429 One limitation of behavioural observation studies is that there is no possibility to 430 manipulate traffic conditions, so researchers are dependent on what happens at the 431 observation site. Several researchers have used different approaches to overcome this 432 limitation. For example, Goddard et al (2015) used a semi-controlled research design, in 433 which instructed pedestrians were used to force yielding events on a zebra-crossing. It 434 enabled them to efficiently collect data on motorists' yielding behaviour. Other studies 435 made use of a moving observer to overcome the problem that one cannot predict at which 436 location a certain traffic event will take place. For example, Walker (2007) instructed a 437 cyclist to cycle a certain route and measured the lateral overtaking distance between 438 motor vehicles and the instructed cyclist. The use of these methodologies shows a certain 439 degree of flexibility in the methodological setup of road user behavioural observation 440 studies, in order to overcome some limitations. However, as a trade-off, only the 441 behaviour of the uninstructed road user could be analysed, since the behaviour of the 442 instructed road-user will not provide any meaningful information.

443 3.5.2 Selection of locations

When performing an on-site behavioural observation study, two approaches can be used for selecting relevant locations: selecting locations where the number of reported crashes is relatively high, possibly due to location-specific aspects, or selecting locations that are

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447 as similar as possible and differ based on the characteristics of interest, to limit the 448 influence of confounding factors. In our review we only encountered studies that used the 449 latter approach. This is most likely explained by the fact that the observation of locations 450 with high crash occurrence are too specific in such a way that estimating the 451 transferability of the acquired results is difficult. Such studies are probably published as 452 research reports in the grey literature. Furthermore, it should be mentioned that sampling 453 bias and the limited number of locations that are typically observed in a behavioural 454 observation study can also influence the transferability of results.

455 3.5.3 Control groups

456 Around one third of the VRU-studies and 42% of the driver-studies focused on the 457 evaluation of a certain measure, for which three research designs have been used: before-458 after, with-without and cross-sectional observation. The first two designs compare the 459 safety levels at one location with and without the treatment in place, while cross-sectional 460 research designs compare locations with and locations without the treatment. For before-461 after studies the treatment has a permanent nature (e.g. installation of speed enforcement 462 system), while for with-without study designs series of treatments could be tested (e.g. 463 different designs of pedestrian warning signs at pedestrian crossings). When using these 464 two designs, researchers should be careful of the trend effect: an increase or decrease in 465 traffic safety levels can also be partly due to general trends of road user behaviour in 466 general. To limit this bias, control groups can be used. However, our findings suggest that 467 their use is not common practice in road user behaviour observation studies, since only 468 20 publications (12% of studies using before-after or with-without design) were found 469 that used control groups. These publications reported that results needed to be adjusted, 470 since the trend effect influenced the findings, and in the case of Islam et al. (2014), the

471 effect was significant.

472 3.5.4 Reporting study characteristics

473 There is no standard format for researchers to describe study characteristics, which limits 474 the transparency and transferability of research results. During the information extraction 475 process, difficulties arose in determining the inclusion of heavy goods vehicles. Some 476 authors explicitly stated their in- or exclusion, either by mentioning in-text or including 477 them in result tables, while most studies limited themselves to mentioning motorized 478 vehicles only which, based on descriptions, implied at least the inclusion of car drivers. 479 It was therefore not possible to include heavy goods vehicles as a separate road user 480 category in our review. Secondly, it was observed that information regarding the 481 observation period is not always complete. Our analyses examined three characteristics 482 (peak/off-peak, day/night and week/weekend) that are important aspects when comparing 483 results of different studies, but in many cases one or more of these characteristics was not 484 specified by the authors. Furthermore, almost 20% of the studies did not mention the 485 sample size. To ensure transparency and transferability of research results a certain type 486 of research protocol should be considered, in order to make sure that important aspects 487 of the observation period are included in the description of the study methodology. 488 Finally, the concept of 'interaction' should also be included in such protocol, stating 489 which traffic situations were regarded as an event of interest.

490 **4. Discussion and conclusions**

491 4.1 Strengths and limitations of this study

492 In total, 600 journal articles were included in this scoping review. We could access all

493 but 23 relevant publications, from which information was extracted in order to examine 494 the range and extent of behavioural observation studies. The search limited itself to peer-495 reviewed journal articles published in English, restrictions applied in other scoping 496 reviews as well (Pham, 2014), in order to include some form of quality assessment, which 497 is typically not part of a scoping review (Levac, Colquhoun and O'Brien, 2010). 498 However, examining publications in the grey literature can provide additional insights 499 into the current practices of road user behavioural observation studies in general 500 (Hagenzieker et al., 2014). Furthermore, it is possible that the state-of-the-art presented 501 in this review differs from the current practices that might have been reported in the grey 502 literature more often. This can be an interesting topic for further research.

503 We cannot guarantee that our scoping study is without bias, but efforts were made 504 to avoid bias. Multiple major databases known to contain peer-reviewed journals were 505 selected and two reviewers were used in the entire process of data extraction of eligible 506 articles. However, it should be noted that the categorization and interpretation of the data 507 can be subject to reviewer bias: other researchers for example might approach the 508 categorization of the topics and indicators differently. Finally, this study only examined 509 the literature at a high level, where certain types of data were aggregated in order to 510 provide a detailed yet concise overview of the findings. For example, the measurement 511 of speed included the intrinsic value (e.g. speed), derivatives of this indicator (e.g. 512 acceleration rates) and simplified binary measurements (e.g. slowing down and 513 overspeeding).

514 4.2 Trends and developments

515 This review focused on a high-level description of the findings of the descriptive 516 analysis. As a result, an overview of the most common practices is provided, indicating 517 the areas of road safety research that have been targeted most by behavioural observation 518 studies. This review provides a structured overview and discussion of the main trends that 519 can be observed for behavioural observation studies published in the scientific literature, 520 which can help other researchers to identify relevant topics for further research 521 considering the knowledge that has already been reported in the vast amount of studies 522 published up to and including 2015. Directing future research by highlighting important 523 topics is difficult, since there is no universal list of the most important road safety 524 problems. Furthermore, the topics on such list will most likely be dependent on driving 525 cultures. Nevertheless, researchers with a particular interest for a certain safety problem 526 can, based on this review, identify the research efforts already reported in the scientific 527 literature and approaches used to study it. It should be noted, however, that this study 528 only provides information on traffic safety research based on behavioural observation, 529 while areas that have received little attention may be researched more often using other 530 safety evaluation methods. For example, motorcyclists' behaviour is commonly 531 investigated using driving behaviour questionnaires (e.g. Ozkan et al., 2006, Elliott et al., 532 2007), which focus on the attitudes and beliefs of individuals to perform certain 533 behaviours, rather than direct behaviour observations. This highlights that behavioural 534 observation studies are useful to study revealed behaviour, but that it is not possible to 535 use them when one is interested in the underlying motivations, beliefs and attitudes.

A wide variety of behavioural indicators was found and showed an important challenge of using direct human observations. Over time, many binary measurements have been replaced with continuous variables, providing more depth in the data analysis process. Validation efforts to examine the link between these indicators and traffic safety levels are rarely found. Determining indicators of interest seem the result of engineering judgement, where the comparison with safety is based on how behaviour relates to design

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542 guidelines or traffic rules or to what extent behaviour changes between different 543 conditions.

544 The review found adaptations of on-site behavioural observation techniques that 545 enable a more efficient data collection process by forcing events of interest, in which the 546 road user under investigation remains unaware of its participation into a research project 547 (beforehand). Examples include instructed road users and moving observers. The review 548 found that control groups are important to control for trend effects when before-after and 549 with-without research designs are used. Regarding reporting research findings, a more 550 uniform way of reporting characteristics of the observation period is needed for more 551 transparency, comparability between studies and possible transferability of the results. 552 Finally, this review focused on a high-level description of the scientific literature 553 available on behavioural observation research. It was not within the scope of this review 554 to focus on individual studies that possibly highlight important aspects, either 555 methodologically or application-wise, for future research efforts. Further research 556 focusing on these types of studies might formulate concrete recommendations for 557 conducting behavioural observation studies in general.

558 Several important trends were highlighted that can influence future research 559 efforts. The ongoing developments of automated video analysis software tools can be the 560 next methodological step forward in video-based behavioural observation studies. Once 561 fully functional, they will be able to objectively measure behaviour, without human input 562 during the data collection and analysis processes. Other spatial sensors of interest are 563 lidars, which are receiving increased attention in safety research (e.g. Simons-Morton et 564 al. (2005) and Tarko et al (2016)) and enable more detailed measurements. Combined 565 with the increasing number of cameras installed in the road network, it can also enable

566 more research into behaviours that influence single-vehicle crashes, a topic that has not567 yet received much attention.

568 4.3 Road user behavioural observation studies

Road user behavioural observation studies have been published in scientific literature for over 80 years and are being conducted on a large scale today. It was found that the number of publications increased rapidly after 2000, which indicates that behavioural observation research is important to study road user behaviour and examine traffic safety problems at locations or for target road user groups of interest. Their use is diverse, including monitoring, evaluating the safety effects of a specific measure and developing microsimulation models.

576 Behavioural observation is particularly useful to monitor the frequency of behaviour and 577 to evaluate the effects of road safety treatments and strategies. They have as main strength 578 that they use direct observation of road user behaviour in a natural setting, with limited 579 behavioural adaptation effects. Therefore, such studies gain more knowledge and insights 580 in road user behaviour and enables to identify and describe some of its features. As with 581 all road safety research methodologies, limitations exist. For example, generalizability of 582 results can be an issue, since road user behaviour is observed at a specific location with 583 its own unique location specific characteristics. Furthermore, since one does not know 584 when and where crashes will occur, behavioural observation is less favourable when one 585 is interested in quantifying road safety as expected number of crashes. In order to provide 586 a comprehensive overview of traffic safety levels at a certain location, the combination 587 with other road safety methodologies (e.g. crash data analyses, driving simulator research 588 or self-reporting tools) remains necessary.

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726 Appendix A

727 **Table A.1** General characteristics of the included studies split out into the four main

road user types.

Study Type	<u>VRU (n=193)</u>				<u>Driver (n=485)</u>			
Road User Type ¹	Pedestrian Cyclist		<u>Motorcyclist</u>		<u>Car driver</u>			
	<u>(193 =</u>	<u>93 = 100%)</u> <u>(193 = 100%)</u>		<u>(193 = 100%)</u>		<u>(485 = 100%)</u>		
	#	%	#	%	#	%	#	%
Amount of studies	136	70	54	28	28	14	484	100
	(136 =	100%)	(54 =	100%)	(28 =	100%)	(484 =	100%)
	#	%	#	%	#	%	#	%
Publication years ²								
1930 - 1939	-	-	-	-	-	-	1	0
1940 - 1949	-	-	-	-	-	-	1	0
1950 - 1959	-	-	-	-	-	-	4	1
1960 - 1969	-	-	-	-	-	-	4	1
1970 – 1979	4	3	2	4	-	-	19	4
1980 - 1989	6	4	-	-	-	-	56	12
1990 - 1999	10	7	6	11	1	4	56	12
2000 - 2009	47	35	7	13	6	21	134	28
2010 - 2015	69	51	39	72	21	75	209	43
Geographic location ^{1,3}								
The Americas	60	44	18	33	1	4	260	54
Europe	34	25	18	33	6	21	108	23
Africa	-	-	-	-	1	4	2	0
Eastern Mediterranean	13	10	-	-	1	4	30	6
South-East Asia	6	4	2	4	6	21	9	2
Western Pacific	27	20	17	32	13	46	76	16
Data collection tool ¹								
Human observer	62	46	12	22	8	29	158	33
Static camera	76	56	43	80	19	68	241	50
Moving camera	-	-	-	-	-	-	25	5

Loop detectors/pneumatic tubes	-	-	2	4	3	11	68	14
Speed gun	-	-	4	7	5	18	69	14
Sensor	-	-	1	2	1	4	21	4
Other	-	-	-	-	-	-	11	2
Main research Purpose								
Monitoring	73	54	31	57	16	57	228	47
Evaluation	46	34	20	37	6	21	206	43
Model development	14	10	2	4	6	21	48	10
Software development	3	2	1	2	-	-	2	0
Research Design								
Single observation	86	63	32	59	22	79	275	57
Before-after observation	30	22	11	20	1	4	105	22
With-without observation	9	7	5	9	2	7	56	12
Cross-sectional observation	11	8	6	11	3	11	48	10
	1		1		1			

¹ multiple categories per study possible, ² studies up to and including 2015 are included, ³

730 according to the WHO definitions (2017)