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2 Safety effects of horizontal curve design, and lane 3 and shoulder width on single motorcycle accidents in 4 Norway

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11 Abstract

12 Factors related to the road infrastructure contribute to the occurrence of motorcycle accidents.
13 This study investigates how design parameters of the existing rural two-lane road network in
14 Norway influence the occurrence of single motorcycle accidents. The design elements
15 considered in this study are horizontal curvature (curve type, degree of curvature, and
16 adjacent curve requirements), and lane and shoulder widths. A matched case-control study
17 design was applied to investigate the safety effects of these elements. Cases were defined as
18 segments experiencing at least one single motorcycle accident during the study period 2013-
19 2017, while controls were defined as segments not experiencing an accident in the same
20 period. In order to identify the segments, a GIS analysis was performed on data collected
21 from the National Road Database (NVDB). In case-control studies, matching allows to
22 control for confounding variables. AADT and speed limit were used as matching variables in
23 this study. A matching ratio of 4:1 (i.e. four controls per case) was used, resulting in 752
24 controls being matched to 188 cases. The results indicate horizontal alignment to have a more
25 significant effect on single motorcycle accidents compared to lane and shoulder widths.
26 Segments with several adjacent reverse curves, with high curvature ($R < 200$ m) have high
27 odds for an accident. Further, if the requirements for adjacent curves are not fulfilled (i.e.,
28 considerable variation in adjacent curve radii), the odds increase even more. While the results
29 are not statistically significant, trends seen indicate that wider lanes were associated with
30 increased odds for an accident, while wider shoulders were associated with decreased odds.
31 In comparison with a similar study considering passenger vehicles, the results of this study
32 also indicate that horizontal alignment has a greater effect on single motorcycle accidents
33 than on passenger vehicle accidents.
34

35 Introduction

36 Vision Zero, a national level goal of reaching zero killed or severely injured in traffic, has
37 been a guiding principle in traffic safety in Norway for several decades [1], resulting in a
38 large reduction of the number of severely injured and killed in traffic accidents. This
39 reduction is primarily a result of a reduced numbers of severely injured and killed car

40 occupants, which decreased by 58% and 62%, respectively, in period 2001-2019, compared
41 to 14% and 53% for motorcyclists [2]. Risk levels have decreased over time for all road user
42 groups in Norway, including for motorcycles [3], however the numbers of accidents victims
43 are still far from the Vision Zero target. In 2019, 16 motorcycle riders died, while 118 were
44 severely injured [2].

45
46 The risks associated with motorcycle driving have been subject to extensive traffic safety
47 research. As motorcyclists are more vulnerable and less protected than car occupants, the risk
48 of fatality or severe injury when involved in an accident is several times higher for
49 motorcycle riders than for car occupants [4]. A majority of the research has been focused on
50 human-related risk factors such as alcohol abuse [e.g. 5, 6], the extent of injury [e.g. 7, 8] and
51 other features like age, gender and the use of safety equipment [e.g. 9-11]. While research has
52 considered risk factors related to motorcycle accidents and road geometry [e.g. 12-16], there
53 is limited research specific to single-vehicle accidents on rural, two-lane roads. A recent
54 analysis of fatal motorcycle accidents in Norway showed that a considerable part (40%) of
55 these accidents only included a single vehicle. It also showed that factors related to the road,
56 such as road geometry (most often curve geometry), were contributory factors in every fourth
57 fatal motorcycle accident [17].

58
59 In Norway, the requirements for road geometry and design are provided in standards
60 published by the Norwegian Public Roads Administration (NPRA). These standards are
61 revised regularly, and design parameters are frequently changed. However, these changes are
62 typically not based on safety research, or at least documented as such [18].

63
64 The aim of this study is to investigate the relationship between single motorcycle accidents
65 and road geometry. The elements within road geometry that will be investigated are
66 horizontal curvature, lane width, and shoulder width. These elements affect the motorcyclists'
67 behavior, as the distance to an upcoming horizontal curve has a significant impact on the
68 change of throttle and the brake force applied by the motorcyclist [19], and the lane width
69 and adjacent roadside affect overtaking speed and lateral positioning [20].

70
71 Horizontal curves are an essential element of the road geometry which is why many studies
72 have examined their safety effects. Elvik [21] investigated the transferability of accident
73 modification functions for horizontal curves by comparing models developed in several
74 different countries. The models included in the study reported a decrease in accident rate with
75 an increasing radius. Though a small curve radius is associated with increased risks for an
76 accident, more recently Elvik [22] found that small adjacent curves are associated with a
77 lower accident rate compared to larger adjacent curves. Elvik [22] also found that the
78 presence of several curves with shorter straight distances (i.e., 50 m) in between each curve
79 results in lower accident rates. While some literature on curve radius show increased risk of
80 an accident in sharp curves, the presence of several sharp curves can have a positive effect, as
81 it could encourage lower speeds and more careful driving.

82
83 Only a few studies consider motorcycles and horizontal curvature exclusively, specifically
84 for single-vehicle accidents on two-lane roads. One study that did so was conducted by
85 Schneider, et al. [23]. The study estimated the accident frequency with the use of a negative
86 binomial regression model and 225 police-reported single motorcycle accidents in Ohio. The
87 results showed that both radius and curve length had a significant impact on the accident
88 frequency, with sharper and longer curves increasing the motorcyclists' risk. The study also
89 found that accidents occur most frequently in curves and that the frequency decreases as the

90 motorcyclist travels further away from the curve. These findings might be explained by the
91 fact that sharp curves are more demanding for riders and can attract more risk-seeking riders
92 compared to straight road sections.

93
94 Another study, again using a negative binomial regression model, investigated the
95 relationship between single-motorcycle accidents and horizontal geometry [24]. The data was
96 collected on rural two-lane road segments located in Florida and involved 439 motorcycle
97 accidents over 11 years. The results indicate the same effects as the study from Schneider et
98 al. [23], that sharper and longer curves induce an increased accident frequency. The study
99 also investigated the effects of different curve types (i.e., single curves, compound curves,
100 and reverse curves) and found that the accident frequency is reduced when a reverse curve is
101 present. A reverse curve was defined as a curve consisting of two jointed curves in opposite
102 directions. The same accident dataset was included in a more recent study by Xin, et al. [25],
103 which aimed to estimate the accident modification factors (AMFs) for horizontal curve
104 features on single-motorcycle accidents using a case-control study design. The findings were
105 consistent with the previous two studies. The AMF was highest for sharp non-reverse curves.
106

107 Similar to horizontal alignment, a large number of studies on the safety effects of the traffic
108 lane and shoulder widths have been conducted worldwide, but the specific research on
109 motorcycle accidents remains limited. In general, the safety literature on lane and shoulder
110 widths show a variability of results. According to The Handbook of Road Safety Measures
111 [26], lane width seems to be related to accidents, however the relationship depends on many
112 other factors and can be either positive or negative. Gitelman, et al. [27] used a negative
113 binomial regression model and a case-control study to investigate the safety effects of traffic
114 lane widths. The results provided by the two methods were consistent and showed that the
115 number of severe accidents was less when traffic lanes were narrow. However, these results
116 are inconsistent with the results from a study by Gross and Donnell [28] who also applied a
117 case-control study design, along with a cross-section design. The results showed an increased
118 risk for narrow lanes, which also is supported in a study by Gross and Jovanis [29]. Wider
119 traffic lanes provide extra recovery space, which can help reduce the number of accidents.
120 However, they might also encourage higher speed levels.

121
122 Regarding shoulder widths, studies report very different findings depending on local context,
123 data quality, different sample sizes, local specifics regarding the reporting of the accidents,
124 among other factors. For example, one study from Israel reported a non-monotonous
125 relationship between shoulder width and accident risk, with increasing risk for widths up to
126 2.2 m [27], while several American studies reported a monotonous link with decreased risk
127 for wider shoulders [28, 29]. Similar to lane width, some of these results can be explained by
128 the extra recovery space provided by the shoulders and the possibility to conduct an
129 emergency stop without interfering with other traffic [26]. On the other hand, wider shoulders
130 might also encourage higher speed levels, which again could increase risk. When considering
131 traffic lane and shoulder width simultaneously, a study by Gross, et al. [30] found no clear
132 trends on whether it was beneficial to increase the traffic lane width or the shoulder width for
133 a fixed total width. These results were inconsistent with a previous study by Zegeer, et al.
134 [31], which found it to be beneficial to increase the traffic lane width.

135
136 There was only found one study on lane and shoulder widths that focused explicitly on single
137 motorcycles accidents on rural-two lane roads. Schneider et al. [21] identified 6 ft (1.8 m) to
138 be the critical shoulder width regarding single motorcycle accidents. Based on a negative

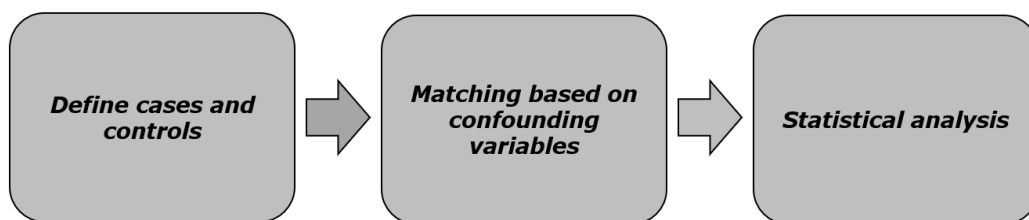
139 binomial regression model, the accident frequency is expected to increase by more than 50%
 140 if the shoulder width is less than 1.8 m.

141
 142 This study described within this paper is also linked with a previous matched case-control
 143 study by Pokorny, et al. [32], that investigated the safety effects of lane and shoulder widths
 144 on single and head-on motor vehicle accidents on rural two-lane roads in Norway. In order to
 145 compare the findings, the same methodology and dataset have been applied. The results of
 146 this study increase the knowledge of risk factors related to single motorcycle accidents in
 147 Norway, which, if considered, could increase the safety level of future road facilities.
 148

149 **Method**

150 Observational studies (e.g., before-after studies and cross-section studies) are commonly used
 151 to estimate the safety effects of geometrical road features. Before-after studies are usually
 152 preferred over cross-section studies but can be time-consuming as collecting data can take
 153 several years, and it can be challenging to find a sufficient sample size. Therefore, some
 154 features are better examined by a cross-section study (e.g., horizontal curves). However, the
 155 challenge with cross-section studies is that it can be difficult to identify sections with similar
 156 features, besides the feature of interest to use within the analysis. Unlike cross-section
 157 studies, case-control studies can examine the safety effect of several features simultaneously
 158 (i.e., horizontal curves and traffic lane widths). The case-control study design also provides
 159 the ability to control for confounding variables when a matching scheme is applied [33].
 160 Based on this, the case-control study design was considered suitable for the current study.
 161

162 The case-control study design was initially used within epidemiology but has in more recent
 163 times also been used within traffic safety research [28]. The purpose of the case-control study
 164 design is to investigate the effect of risk factors by comparing a group of cases and controls.
 165 Case-control studies should not be mistaken with cross-section studies. Unlike cross-section
 166 studies, case-control studies select sites based on the outcome (accident or no accident) rather
 167 than the presence of a specific feature [33]. The approach of this case-control study is
 168 separated into three main steps, illustrated in Figure 1.
 169



170
 171 Figure 1: The three main steps of a case-control study design.

172
 173
 174
 175 One of the main challenges with the case-control study design is defining cases and controls.
 176 The results produced can be unclear if the definition of cases and controls is not specific. It is
 177 also essential that the cases and controls are representative of the sites of interest [33]. For
 178 this study, a case is defined as a rural two-lane road segment experiencing at least one single
 179 motorcycle accident within the study period, 2013-2017. A control is defined as a rural two-
 180 lane road segment which has not experienced an accident during the same period.

181 The case-control study design should recognize differences between segments with multiple
 182 accidents and single accidents. If this is not taken into account, the safety effect can be
 183 underestimated [34]. In this study, six segments experienced multiple accidents. These were
 184 defined as multiple cases (i.e., one segment experiencing two accidents is separated into two
 185 cases), making the features associated with multiple accidents more frequent among the
 186 cases.

187

188 Applying a matching scheme allows controlling for confounding variables. Controls are
 189 matched to each case based on the same value of the confounding variables. The confounder
 190 must be associated with both the risk factors (horizontal curvature and lane and shoulder
 191 width) and the outcome (single motorcycle accident). If this is not the case, one can
 192 experience a biased result due to over-matching [35]. The traffic volume (AADT) and the
 193 speed limit were identified as confounding variables in the current study. They are both
 194 related to road geometry as the design classes in Norway are adapted to speed limit and
 195 AADT, among other factors (i.e., dimensioning vehicle type and topography) [30]. The speed
 196 limit is used to determine the minimum curve radius, while wider roads usually are associated
 197 with higher AADT [36, 37]. Although AADT does not indicate the proportion of
 198 motorcyclists, it has been proven to impact the frequency of single motorcycle accidents (1%
 199 increase in AADT results in 0.43% increased frequency of single motorcycle accidents) [23].
 200 Speed has also been proven to affect the risk of a motorcycle accident in studies by
 201 Vlahogianni, et al. [11] and Jevtić, et al. [38]. In this study, the speed limit is considered as a
 202 surrogate measure of speed.

203

204 The power of a matched case-control study increases when the control-to-case ratio increases
 205 (i.e., several controls are matched to each case). However, the power stagnates when the ratio
 206 exceeds four [28]. Due to a large number of controls available in this study, a 4:1 ratio was
 207 applied, with four controls randomly matched to each case by using the random function in
 208 the Python programming language.

209

210 The case-control method cannot be used to determine the expected accident frequency.
 211 Instead, it is used to find an approximation of the relative risk presented as an odds ratio. The
 212 odds ratio indicates the increased or decreased risk associated with a treatment [32]. It is
 213 expressed as the change in relative risk compared to a baseline. For binary risk factors
 214 (absence or presence), the baseline is usually considered as the risk factor being absent. For
 215 categorical risk factors, any category can be considered as the baseline [26]. In this study the
 216 most frequent parameter for each category was considered as the baseline.

217

218 Conditional logistic regression is a commonly used technique to estimate the odds ratio in
 219 case-control studies [25, 27, 39]. The probability of a single motorcycle accident is given by
 220 Eq. (1), and is further used to calculate the odds ratio, as cited by [25, 30, 34]:

221

$$Pr(y_{ij} = 1) = \frac{1}{1 + \exp[-(\alpha_i + \sum_k \beta_k x_{ijk})]} \quad (1)$$

222

223 where:

224 y_{ij} = outcome in the j^{th} segment in the i^{th} stratum (1=case and 0=control)

225 α_i =effect of matching variables for each matched stratum (sets on 4 controls and 1 case)

226 β_k = estimated coefficients for unmatched variables

227 x_{ijk} = the k^{th} unmatched covariate in the j^{th} segment in the i^{th} stratum

228

229 **Segmented network**

230 The data on road design parameters, traffic operation, and accidents used in the study was
 231 collected from the Norwegian National Road Database (NVDB) for the study period 2013-
 232 2017. NVDB is provided by the Norwegian Public Roads Administration (NPR). The study
 233 focuses on undivided two-lane rural roads (classified as European, Regional or District roads
 234 according to the Norwegian classification – ERF roads). Roads with low (≤ 50 km/h) and high
 235 (≥ 90 km/h) speed limits were excluded from the network. Additionally, all tunnels and
 236 bridges over 20 m were excluded, along with intersections and all adjacent road sections
 237 within a radius of 100 m. Intersections were defined as intersections between ERF roads and
 238 roads with higher functional classes (thereby excluding forest, agriculture, and other low-
 239 class roads). The segmented network was initially created by Pokorny, et al. [32] and was
 240 reused, with slight modifications, for the current study. The modifications included adding a
 241 parameter on whether the adjacent curves were met the Norwegian standard or not, to provide
 242 more detailed results related to horizontal alignment. In addition, the data was handled by
 243 different software in the two studies, which may also have caused some differences in the
 244 data set. Despite these differences the results are considered comparable as the modification
 245 does not affect the way the road is segmented, only the categorization of the segments. Also,
 246 the way the data is structured within this study allows for the exclusion of the parameter on
 247 adjacent curves when comparing the results of the current study to the results of Pokorny, et
 248 al. [32] For more details on the segmentation process, consult the referenced paper from
 249 Pokorny, et al. [32].

250

251 A description of the final dataset, consisting of 58,815 segments, is provided in Table 1.

252

253

Table 1: Descriptive statistics of the final dataset, 58 815 segments.

<i>Parameter</i>	<i>Number of Segments</i>	<i>% of segments</i>	<i>% of total length</i>	<i>% of accidents</i>	
<i>Lane width</i>	<i>1.5-1.75 m</i>	2347	3.99	3.94	2.13
	<i>1.76-2.0 m</i>	3402	5.78	5.81	2.13
	<i>2.01-2.25 m</i>	5284	8.98	8.92	3.19
	<i>2.26-2.5 m</i>	6351	10.80	10.92	6.91
	<i>2.51-2.75 m</i>	9075	15.43	15.44	11.17
	<i>2.76-3.0 m</i>	15,558	26.45	26.50	33.51
	<i>3.01-3.25 m</i>	12,183	20.71	20.67	27.13
<i>Shoulder width</i>	<i>3.26-3.5 m</i>	4615	7.85	7.81	13.83
	<i>0-0.25 m</i>	15,611	26.54	26.94	32.45
	<i>0.26-0.5 m</i>	25,037	42.57	21.44	45.21
	<i>0.51-0.75 m</i>	12,644	21.50	42.49	16.49
	<i>0.76-1.0 m</i>	3549	6.03	5.91	4.26
<i>Region</i>	<i>>1 m</i>	1974	3.36	3.22	1.60
	<i>East</i>	20,115	34.20	33.71	45.21
	<i>Middle</i>	9259	15.74	15.38	8.51
	<i>North</i>	16,426	27.93	28.93	14.89
	<i>South</i>	4576	7.78	7.75	10.64
<i>Road type</i>	<i>West</i>	8439	14.35	14.23	20.74
	<i>European</i>	7164	12.18	12.52	14.36
	<i>County</i>	47,123	80.12	79.67	76.60
<i>AAADT</i>	<i>District</i>	4528	7.70	7.81	9.04
	<i><500</i>	25,514	43.38	43.73	23.40

	<i>501-1500</i>	18,851	32.05	31.85	35.64
	<i>1501-4000</i>	11,319	19.25	19.23	31.38
	<i>4001-6000</i>	1914	3.25	3.22	4.79
	<i>6001-8000</i>	601	1.02	0.99	1.06
	<i>> 8000</i>	616	1.05	0.98	3.72
<i>% of long vehicles</i>	<i>< 8%</i>	11,172	19.00	18.61	16.49
	<i>8-12%</i>	29,599	50.33	50.06	51.60
	<i>>12%</i>	18,044	30.68	31.34	31.91
<i>Speed limit</i>	<i>60 km/h</i>	8934	15.19	14.58	13.83
	<i>70 km/h</i>	2611	4.44	4.33	4.26
	<i>80 km/h</i>	47,270	80.37	81.09	81.91

254

255 For segments with a variation in lane and shoulder width (but not enough variation to create a
 256 new segment), a weighted average was used as an estimate. The coefficient of variation (CV)
 257 was calculated to evaluate the precision of the weighted average estimate. 99.9% of the
 258 segments showed a sufficient coefficient of variation ($CV < 0.5$) [27].
 259

260

261 The horizontal alignment was treated slightly different from Pokorny, et al. [32], as it was
 262 relevant to include adjacent curve requirements in the current study. The segments were
 263 categorized according to curve type, degree of curvature, and adjacent curves, all based on
 264 the radius information. First, the segments were divided into four classes: straight ($R=0$ or
 265 $|R| > 1750$ m, as suggested by Norwegian design standards [36]), single curve, multiple curves
 266 in the same direction, and multiple curves in opposite directions. Furthermore, the curved
 267 segments were divided into two categories determining whether the curvature was high
 268 ($R < 200$ m) or low ($R > 200$ m). The value of 200 m was used as a limit value, as the relative
 269 accident rate seems to be increasing drastically for radii below 200 m [21]. For multiple
 270 curved segments, a weighted average of the radiuses R_w (using absolute values) were
 271 calculated to determine the high or low classification.

272

273 Lastly, the multiple curved segments were divided into two categories determining whether
 274 the requirements for adjacent curves were fulfilled (OK) or not (NOT OK). These
 275 requirements are given by the Norwegian standard for geometric road design – Handbook
 276 V120 Premises of geometric road design [37]. The purpose is to provide an even and
 277 consistent curvature. For curve radii less than or equal to 300 m, there are requirements for
 278 the minimum and maximum radii adjacent to the curve. The same criterion was applied in
 279 this study. As can be seen in Table 2, although this is a standard requirement within
 280 Norwegian road design, the existing network contains a significant share of segments where
 281 the requirements are not fulfilled.
 282

Table 2: Descriptive statistics on horizontal alignment.

<i>Horizontal alignment categories</i>		<i>Number of Segments</i>	<i>% of segments</i>	<i>% of total length</i>
<i>Curve type</i>	<i>Multiple curves opposite direction</i>	17,921	30.47	34.82
	<i>Multiple curves same direction</i>	6604	11.23	10.33
	<i>Single</i>	4925	8.37	6.18
	<i>Straight</i>	29,365	49.93	48.67
<i>Degree of curvature</i>	<i>High ($R < 200$ m)</i>	4641	7.89	7.22
	<i>Low ($R > 200$ m)</i>	24,809	42.18	44.11
	<i>Straight</i>	29,365	49.93	48.67
<i>Neighbor curves</i>	<i>NOT OK</i>	13,252	22.53	27.91
	<i>OK</i>	11,273	19.17	17.24
	<i>Single</i>	4925	8.37	6.18

<i>Straight</i>	29,365	49.93	48.67
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283

284 Accidents

285 The accident data was retrieved from NVDB, where an accident is registered if it has led to
 286 personal injury or great material damage [40]. In total, 188 single-motorcycle accidents from
 287 the period 2013-2017 were assigned to the segmented network based on their GPS data.
 288 Because of the relatively low number of accidents, all five years were analysed together.
 289 According to the descriptive statistics (see Table 3), most of the accidents occurred in curves,
 290 (most frequently in left-hand curves) and most of the single motorcycle accidents resulted in
 291 slight injury.

292

293

Table 3: Descriptive statistics on accidents.

<i>Accident categories</i>		<i>number of accidents</i>	<i>% of accidents</i>
<i>Degree of injury</i>	<i>Fatality</i>	17	9.04
	<i>Severe injury (severe + very severe)</i>	41	21.81
	<i>Slight injury</i>	127	67.55
	<i>No injury/not registered</i>	3	1.60
<i>Road geometry</i>	<i>Straight</i>	40	21.28
	<i>Left-hand curves</i>	86	45.74
	<i>Right-hand curves</i>	37	19.68
	<i>Unknown</i>	25	13.30

294

295 Statistical model

296 The analysis was conducted in the statistical software SPSS. The COXREG function was
 297 used as a substitute for conditional logistic regression, as the results produced by the
 298 COXREG are equal to the ones produced by a conditional logistic regression. The covariates
 299 included in the statistical model were horizontal alignment, traffic lane width, shoulder width,
 300 region, road type and the percentage of long vehicles (>5.6 m). The three parameters on
 301 horizontal alignment were merged together, resulting in 11 different combinations describing
 302 the horizontal alignment of each segment (as seen in Table 4).

303

304

Table 4: Combinations describing the horizontal alignment in the statistical model.

<i>Curve type</i>	<i>Degree of curvature</i>	<i>Adjacent curve requirements</i>	<i>Number of segments</i>	<i>Percentage of segments</i>
<i>Straight</i>			430	45,74 %
<i>Single curve</i>	<i>High</i>		67	7,13 %
<i>Single curve</i>	<i>low</i>		6	0,64 %
<i>Multiple curves same direction</i>	<i>High</i>	<i>OK</i>	15	1,60 %
<i>Multiple curves same direction</i>	<i>High</i>	<i>NOT OK</i>	1	0,11 %
<i>Multiple curves same direction</i>	<i>Low</i>	<i>OK</i>	40	4,26 %
<i>Multiple curves same direction</i>	<i>Low</i>	<i>NOT OK</i>	58	6,17 %
<i>Multiple curves opposite directions</i>	<i>High</i>	<i>OK</i>	44	4,68 %
<i>Multiple curves opposite directions</i>	<i>High</i>	<i>NOT OK</i>	29	3,09 %
<i>Multiple curves opposite directions</i>	<i>Low</i>	<i>OK</i>	95	10,11 %
<i>Multiple curves opposite directions</i>	<i>Low</i>	<i>NOT OK</i>	155	16,49 %

305 Results

306 The results of the statistical analysis are presented in Table 5, where the significance levels,
 307 odds ratio and 95% confidence intervals are included.

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309

310

Table 5: Results of the statistical analysis. Significant ($p < 0.05$) results presented in bold font.

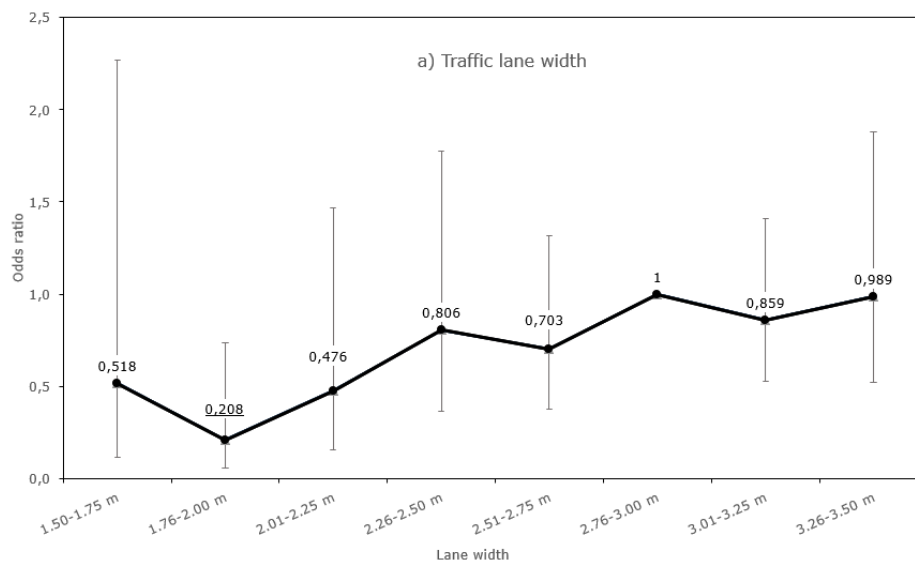
<i>Parameters</i>		<i>Significance</i>	<i>Odds ratio</i>	<i>95.0% CI for the odds ratio</i>	
				<i>Lower</i>	<i>Upper</i>
<i>Lane width</i>	<i>1.5-1.75 m</i>	0.383	0.518	0.118	2.271
	<i>1.76-2.0 m</i>	0.015	0.208	0.059	0.738
	<i>2.01-2.25 m</i>	0.196	0.476	0.155	1.467
	<i>2.26-2.5 m</i>	0.592	0.806	0.366	1.776
	<i>2.51-2.75 m</i>	0.272	0.703	0.375	1.318
	<i>2.76-3.0 m</i>	0.383	1	1	1
	<i>3.01-3.25 m</i>	0.547	0.859	0.525	1.407
	<i>3.26-3.5 m</i>	0.973	0.989	0.520	1.880
<i>Shoulder width</i>	<i>0-0.25 m</i>	0.881	1	1	1
	<i>0.26-0.5 m</i>	0.836	1.047	0.680	1.611
	<i>0.51-0.75 m</i>	0.525	0.837	0.483	1.450
	<i>0.76-1.0 m</i>	0.702	0.817	0.290	2.302
	<i>>1 m</i>	0.514	0.622	0.150	2.586
<i>Region</i>	<i>East</i>	0.343	1	1	1
	<i>Middle</i>	0.304	0.691	0.341	1.398
	<i>North</i>	0.041	0.546	0.305	0.975
	<i>South</i>	0.730	0.885	0.444	1.765
	<i>West</i>	0.659	0.892	0.536	1.483
<i>Road type</i>	<i>County</i>	0.591	1	1	1
	<i>European</i>	0.951	1.022	0.520	2.008
	<i>District</i>	0.351	0.721	0.362	1.435
<i>Heavy vehicles</i>	<i>< 8%</i>	0.653	0.883	0.512	1.521
	<i>8-12%</i>	0.838	1	1	1
	<i>>12%</i>	0.783	1.075	0.644	1.792

Curve type	<i>Straight</i>	0.000	1	1	1
+	<i>Single curve + Low</i>	0.013	10.739	1.653	69.754
High/low	<i>Single curve + High</i>	0.863	0.922	0.367	2.318
+	<i>Multiple opposite dir.</i>	0.000	21.993	8.465	57.141
Adjacent curves	<i>+ High + NOT OK</i>				
	<i>Multiple same dir.</i>	*	*	*	*
	<i>+ High + NOT OK</i>				
	<i>Multiple opposite dir.</i>	0.000	3.341	2.010	5.552
	<i>+ Low + NOT OK</i>				
	<i>Multiple same dir.</i>	0.012	2.582	1.228	5.430
	<i>+ Low + NOT OK</i>				
	<i>Multiple opposite dir.</i>	0.000	14.063	6.213	31.833
	<i>+ High + OK</i>				
	<i>Multiple same dir.</i>	0.000	12.442	3.744	41.346
	<i>+ High + OK</i>				
	<i>Multiple opposite dir.</i>	0.000	4.970	2.752	8.974
	<i>+ Low + OK</i>				
	<i>Multiple same dir.</i>	0.054	2.420	0.984	5.952
	<i>+ Low + OK</i>				

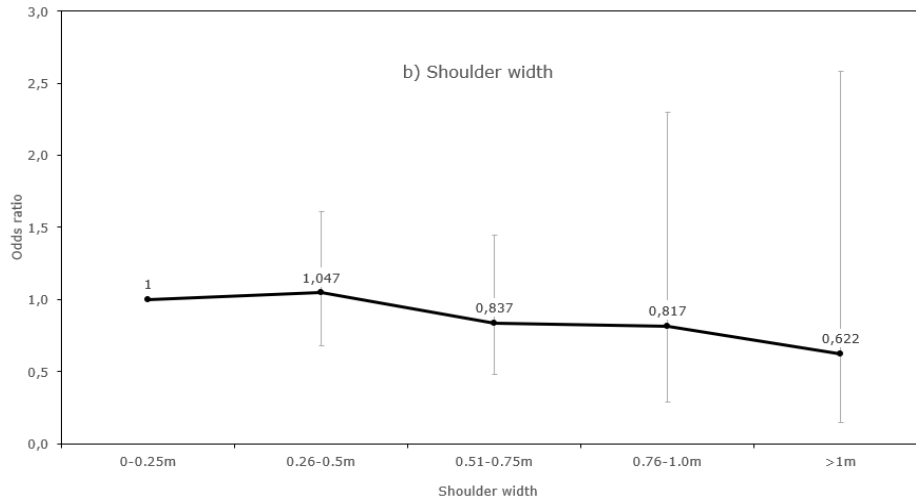
*Only one segment had this specific categorization

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Almost all of the results on lane and shoulder width were not statistically significant (only the result for width 1.76-2.00 m), and the confidence intervals are large. However, the results appear to be presenting some trends. For traffic lane widths (Figure 2 a) the trend appears to be an increased odds ratio for wider lanes. The opposite trend appears for shoulder widths (Figure 2 b), were wider shoulders are associated with lower odds ratio.



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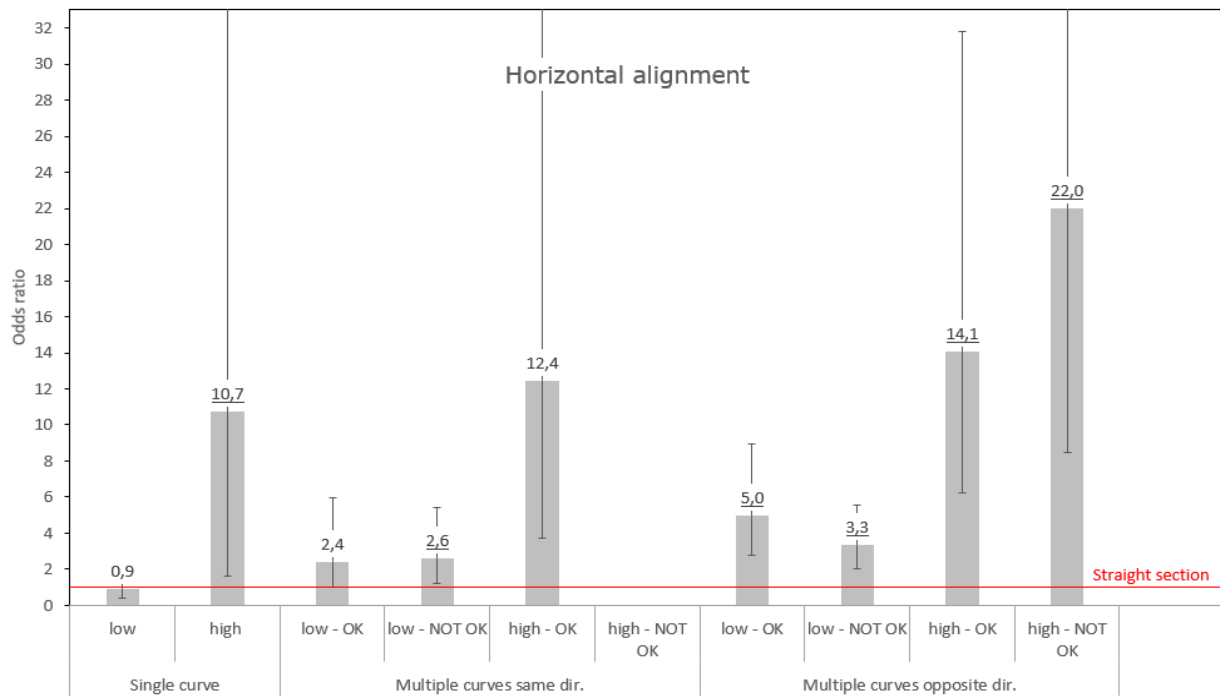
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Figure 2: Odds ratio for a) lane width and b) shoulder-width, and 95% confidence intervals. Significant ($p < 0.05$) result is underlined.

324

325 The results on horizontal curvature were more significant compared to the results on lane and
326 shoulder width. Yet, some of the confidence intervals are large, as seen in Figure 3. The
327 highest odds ratio is associated with multiple curved segments, with high curvature, not
328 fulfilling the requirements for adjacent curves (i.e. considerable variation in curve radii).
329 Generally, the odds increase when the curvature is high ($R < 200$ m) compared to low ($R > 200$
330 m). It is clear from the results that curved sections have higher odds ratios compared to
331 straight sections, except for single curved segments with a radius greater than 200 m,
332 however this result was not significant. As only one segment had the following combination
333 for horizontal alignment: multiple curves in same direction, with high curvature not fulfilling
334 the requirements for adjacent curves, this was excluded from the results.

335



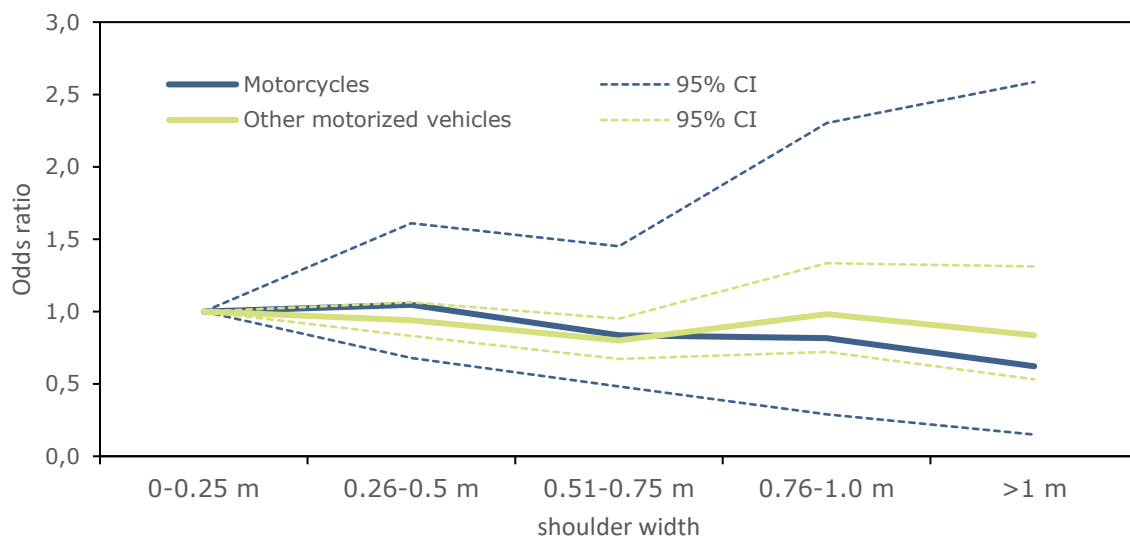
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Figure 3: Odds ratio for horizontal alignment and 95% confidence intervals. Significant ($p < 0.05$) results are underlined.

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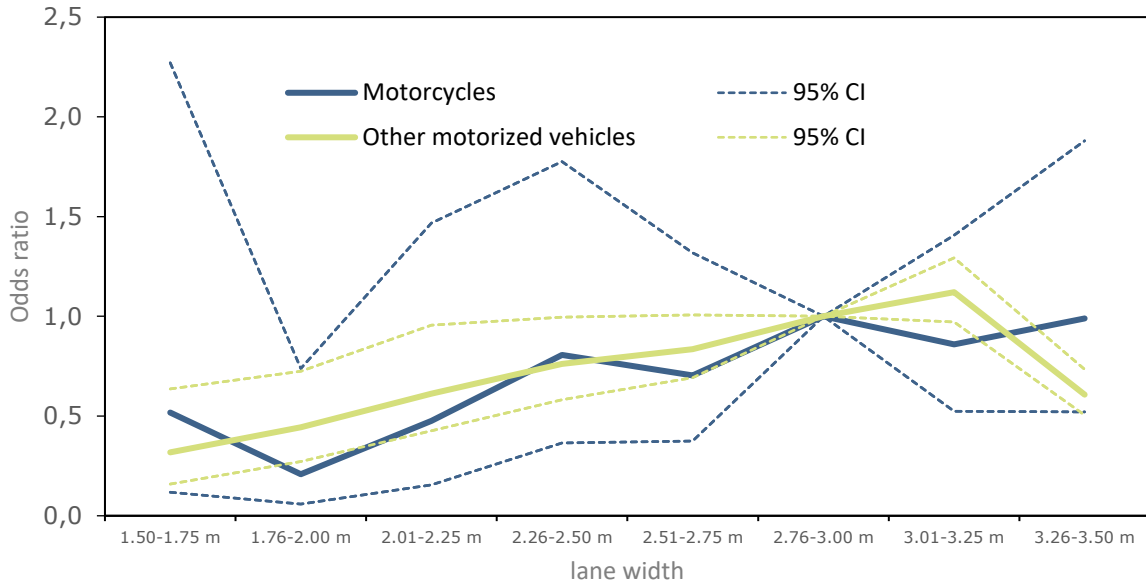
340 Comparison between motorcycles and other motorized vehicles

341 Pokorny, et al. [32] conducted a similar study on 1,886 accidents involving motorized
 342 vehicles (excluding motorcycles). Nearly the same baseline was utilized in the current study,
 343 making it possible to compare the results with those found in the previous study. The
 344 variation between the two studies comes from the way the segmentation executed and is not
 345 believed to impact the comparison. When comparing the odds ratio for shoulder width, the
 346 trends are similar for motorcycles and other motorized vehicles, as seen in Figure 4.
 347 Increasing shoulder width show a decreasing odds ratio. The opposite trend appears for
 348 traffic lane width, as an increasing lane width show an increased odds ratio (as seen in Figure
 349 5). This trend appears for both motorcycles and other motorized vehicles. However, for both
 350 lane and shoulder width, the 95% confidence intervals are larger for motorcycles. This could
 351 be a consequence of the difference of the sample sizes. The results on lane and shoulder
 352 width in the current study show little statistical significance, while the results for other
 353 motorized vehicles has higher levels of statistical significance, especially for traffic lane
 354 width [32].



358 Figure 4: Odds ratio for shoulder widths. Motorcycles and other motorized vehicles (includes data from [32]).
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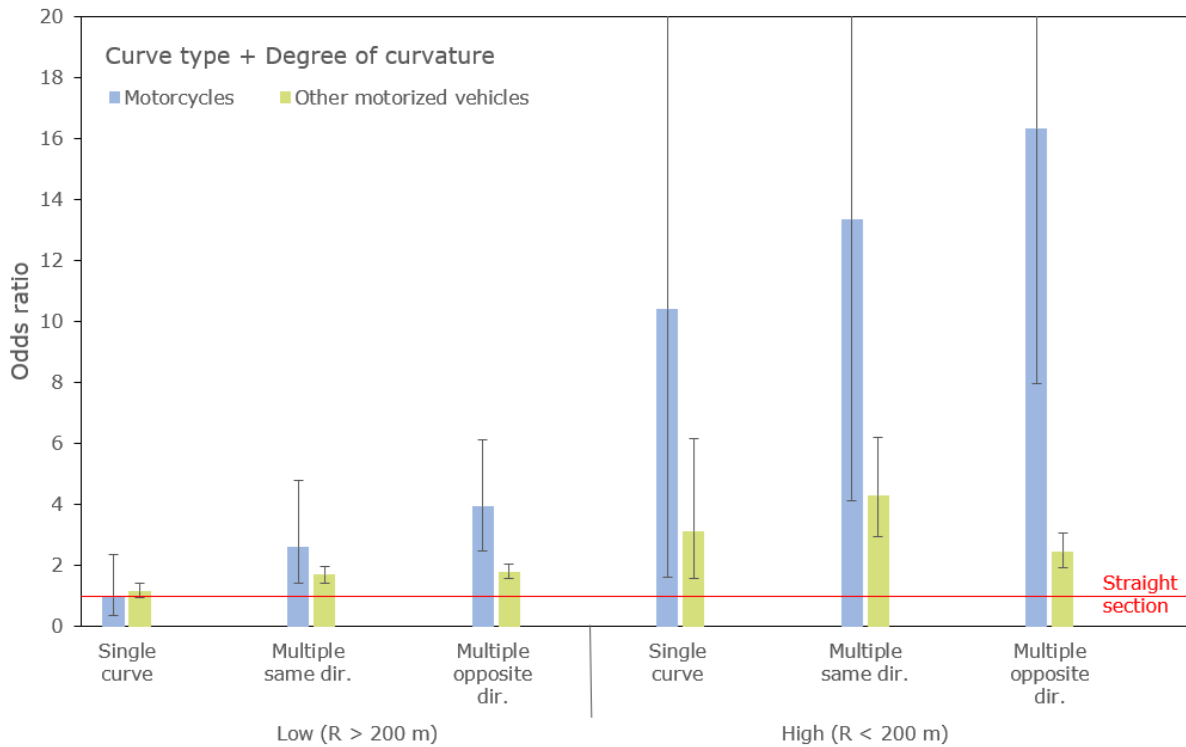


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Figure 5: Odds ratio for lane widths. Motorcycles and other motorized vehicles (includes data from [32]).

363

364 Pokorny, et al. [32] did consider horizontal curvature in their study, but not the requirements
 365 for adjacent curves. Therefore, a statistical analysis of the motorcycle accidents, excluding
 366 the adjacent curve requirements, was conducted for comparison reasons. Straight sections
 367 were used as the baseline in both studies. The results presented in Figure 6 show that the odds
 368 ratio for motorcycles is considerably higher than for motorized vehicles, especially when the
 369 curvature is high ($R < 200$ m). Both studies show high levels of statistical significance for the
 370 odds ratio on horizontal curvature. However, the 95% confidence intervals are considerably
 371 larger for motorcycles than for motorized vehicles.



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Figure 6: Odds ratio for horizontal curvature. Motorcycles and other motorized vehicles (includes data from [32]).

375

376 Discussion

377 The analysis considered the impact of lane width, shoulder width, and various aspects of
378 horizontal curvature on two-lane rural roads on the odds risk of single-motorcycle accidents.

379

380 For lane width, this study shows a trend where increased lane widths are associated with
381 increased odds ratio. The results were statistically significant for only the second narrowest
382 width category (1.76-2.0 m), which represented only 5.81% of the total length of the studied
383 road network. The only other relevant motorcycle study found that the width did not
384 significantly impact accident frequency, with the caveat that there was little variation in lane
385 width in the sample, which may have impacted the results [23]. Considering motorized
386 vehicles in general where research is more prevalent, the results of case-control studies vary.
387 While for example Gitelman, et al. [27] identified a similar trend as found in this study, Gross
388 and Jovanis [29] and Gross and Donnell [28] reported the opposite. Looking beyond case-
389 control methodologies, existing research has also provided varying results. Some studies
390 identified wider lanes as safer due to providing more space for avoiding potential collisions
391 [e.g. 41-42], while others noted that width has a negative safety effect, where narrower roads
392 might be result in safer driving behaviour, namely lower speeds [e.g. 43]. Thus, the results in
393 the current study might be explained by the motorcyclists taking extra precautions (i.e.
394 reduced speed and increased concentration) when driving on roads with narrow traffic lanes.

395

396 Regarding shoulder width, the trend found in this study (increased shoulder width leads to
397 decreased odds for an accident) is similar to other case-control studies [23, 28, 30], although
398 only the first of these studies specifically focused on motorcycles. Again, the results from this
399 study are not statistically significant. The identified trend is interpreted as wider shoulders
400 being beneficial for motorcycle safety because they provide more recovery space and better
401 sight distance in curves.

402

403 Regarding horizontal alignment, the results are more conclusive, showing that the odds ratio
404 is highest on multiple curved segments going in opposite directions (reverse curves).
405 Furthermore, if the segment additionally has high curvature and the requirements for adjacent
406 curves are not fulfilled the odds ratio increases even further. The odds ratios are lower on
407 segments with low curvature, yet still higher than for straight segments. The results for high
408 curvature are similar to the findings of several studies which are specifically focused on
409 motorcycles [23-25]. However this is inconsistent with the study by Elvik [22] who found
410 that several sharp curves reduces the risk, although Elvik's study is not specific to
411 motorcycles. While the presence of a reverse curve showed increased odds of an accident,
412 these results differ from other studies focused on motorcycles [24, 25] where the presence of
413 a reverse curve is associated with decreased odds for an accident, although using this same
414 data set Xin [44] later found that reverse curves result in more severe injuries. One reason for
415 the discrepancy compared to this study may be the difference in geography associated with
416 the two samples, where Norway has more challenging terrain. The results of this current
417 study related to horizontal alignment are likely explained by the increased complexity by
418 riding a motorcycle in a curve compared to a straight section. Several adjacent curves can
419 make speed adjustment difficult, especially if the radius of the curves vary in size. If the
420 curvature is high, the sight distance around the curve might also be reduced. Another
421 explanation, as stated in the previous research, could also be that such road segments attract
422 risk-seeking riders.

423

424 While the results indicate trends such as that increased traffic lane widths lead to increased
 425 odds for a single motorcycle accident, and an opposite effect for increased shoulder widths,
 426 these results are not largely statistically significant. The results on horizontal alignment show
 427 higher statistical significance for most of the categories, compared to the results on lane and
 428 shoulder width. These results indicate that the horizontal alignment has greater influence on
 429 single motorcycle accidents than lane and shoulder width, or that lane and shoulder width
 430 does not influence single motorcycle accidents at all. The results from the study by Pokorny,
 431 et al. [32] involving motorized vehicles also show less significance for shoulder width
 432 compared to traffic lane width and horizontal alignment. This strengthens the indication that
 433 shoulder width has less influence on accidents compared to the other design parameters
 434 studied. However, the lack of statistical significance and large confidence intervals could also
 435 be affected by a low sample size (i.e. low number of accidents). Possible ways to increase the
 436 sample size would be to either extend the study period or include more accident types.
 437 Including more accident types would lead to a broad definition of cases, which could lead to
 438 unclear results, and thus is not suggested [33]. Increasing the study period could lead to
 439 temporal variations within the data, which would not be favourable either. However, a greater
 440 sample size may not solve these issues in their entirety, as the sample size in the study by
 441 Pokorny, et al. [32] was ten times greater than in the current study and yet several of the
 442 results were insignificant. Additionally, the comparison between the two studies show that
 443 horizontal curvature is more influential on accident risk for motorcycles than for other
 444 motorized vehicles.

445

446 Increasing the knowledge on risk factors related to motorcycle accidents can help reduce the
 447 number of accidents. Based on this study, the importance of horizontal curve design is
 448 emphasized for motorcycle safety. When considering motorcycle safety for future road
 449 facilities, larger curve radii is preferred along with single curves. It is also important that the
 450 requirements for adjacent curves are fulfilled.

451 Data Availability

452 The data included in this study are available upon request by contact with the corresponding
 453 author.

454 Conflicts of Interest

455 The authors declare that there is no conflict of interest.

456

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