

# 1 Preventing wildlife roadkill can offset mitigation investments in 2 short-medium term

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33 short-medium term

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35 Abstract

36 Wildlife vehicle collisions (WVC) are a threat to wildlife and humans, killing millions of  
37 animals of numerous species, as well as causing significant damage to vehicles, drivers and  
38 passengers. Road fencing is a highly effective mitigation measure at reducing WVC, however  
39 its large-scale implementation requires a high investment. We questioned how long it would  
40 take for savings from avoided collisions to offset the investments in road fencing mitigation,  
41 focusing on vehicle damage costs. Using the information of a 3-year systematic roadkill  
42 monitoring of 1,158 km in Mato Grosso do Sul, Brazil, we estimated the real number of  
43 casualties accounting for bias in roadkill counting. We obtained information on the material  
44 costs on cars and trucks due to WVC and, considering the road traffic volume characteristics,  
45 estimated the total material costs resulting from collisions with larger animals. Cost-benefit  
46 analyzes allowed estimating the time required to amortize the investment in fencing,  
47 considering its application along the full surveyed roads or only in hotspots of mortality. We  
48 recorded over 10,000 WVC, 40% of which involved animals that can cause significant  
49 material damage to vehicles, namely the endangered lowland tapir (*Tapirus terrestris*, n=267)  
50 and giant anteater (*Myrmecophaga tridactyla*, n=608). The average material cost per accident  
51 was US\$ 885±1,575 (mean±SD). We show that investments are likely to pay off in 16-40  
52 years for the mitigation of the full roads, and in 9-25 years for hotspots of mortality. Thus,  
53 road mitigation is a win-win solution for increasing traffic safety for humans and reduce  
54 road-related negative effects on biodiversity.

55 **Keywords:** Road fencing, road-mortality, endangered species, material damages, carcass  
56 persistence, cost-benefit analysis.

## 57 1 Introduction

58 Roads are the most common human-made features on the globe, spreading across nearly all  
59 of its surface (Ibisch et al. 2016). An additional 25 million km of new roads are expected to  
60 be built by 2050, 90% of which in developing countries (Dulac 2013), particularly in tropical  
61 regions, which have support exceptional biodiversity and vital ecosystem services (Laurance  
62 et al. 2001, 2015, Alamgir et al. 2017). These infrastructures allow human population  
63 development by facilitating the movement of people and goods, as well their accessibility to  
64 different services, e.g. schools and markets (Ali et al. 2015). However, particularly outside  
65 urban areas, roads can also become areas of conflict with biodiversity, notably due to the high  
66 number of wildlife-vehicle collisions (WVC). For example, over two million mammals are  
67 estimated to be road-killed every year solely in Brazil (González-Suárez et al. 2018).

68 Collisions with wild animals, mainly large ones, can also be a serious threat to human  
69 safety, causing significant injuries to drivers and passengers, in addition to considerable  
70 economic impact (Bissonette et al. 2008, Huijser et al. 2009, 2013, Abra et al. 2019). In USA,  
71 it is estimated that 1-2 million WVC occur involving large mammals, of which ca. 5% cause  
72 human injury with costs surpassing US\$ 8bn (Huijser et al. 2008). In California, in particular,  
73 it was estimated a material damage cost of US\$ 76 million due to large wildlife-vehicle  
74 collision, for 2018 alone (Shilling et al. 2019). The annual cost of WVC involving ungulates  
75 in Sweden was estimated at US\$ 406 million (Gren and Jägerbrand 2019), and in the São  
76 Paulo State, Brazil, the total annual cost to society was estimated at US\$ 25 million (Abra et  
77 al. 2019). Yet, there is a great lack of knowledge about the material costs that WVC entail in  
78 most regions, even though this information is particularly relevant for making decisions about  
79 the implementation of mitigation measures on roads.

80 Roadkill data is usually acquired through systematic monitoring of roads. However,  
81 roadkill surveys generally fail to fully record all casualties due to imperfect detection issues,

82 and yet accurate estimation of the total mortality is important for precise estimates of the  
83 material costs associated with WVC. Imperfect detection may be due to one or more  
84 detection biases, including: *i*) researchers failing to find carcasses along the road or verges  
85 while surveying the road; *ii*) traffic volume, scavengers or management staff removing  
86 carcasses before searches are conducted; and *iii*) carcasses ending up outside the searched  
87 area (Santos et al. 2011, 2016, Teixeira et al. 2013). To account for such biases, researchers  
88 typically conduct field trials to estimate the effects of the first two components (Barrientos et  
89 al. 2018). For the third component, while generally less considered in mortality estimates,  
90 one can perform extra surveys outside the road corridor to count the number of carcasses  
91 therein or search for signs of injured animals.

92         Once a detailed knowledge of roadkill patterns is obtained, different mitigation  
93 measures can be considered to reduce WVC. Fencing is one of most common mitigation  
94 measures, and one with higher effectiveness at reducing road mortality, particularly when  
95 connecting to existing road passages (Seiler et al. 2016, Rytwinski et al. 2016, Spanowicz et  
96 al. 2020). Other measures, such as raising the road on pillars or placing the road underground  
97 are potentially more effective than fencing but are also cost prohibitive and unrealistic for  
98 most regions. Conversely, less expensive measures than fencing, such as wildlife warning  
99 signs and reflectors, are apparently ineffective (Rytwinski et al. 2016, Brieger et al. 2017,  
100 Benten et al. 2018). Hence, while also requiring regular maintenance, wildlife fencing seems  
101 to be an important cost-effective strategy for road mortality mitigation of most species (Seiler  
102 et al. 2016, Rytwinski et al. 2016, Spanowicz et al. 2020).

103         Due to financial constraints, it is rarely realistic to fence an entire road network  
104 simultaneously, and thus mitigating particular road sections may be more cost-effective than  
105 fencing all roads (Ascensão et al. 2013, Spanowicz et al. 2020). One common approach is to  
106 focus on road sections with significant aggregation of collisions (Spanowicz et al. 2020).

107 Given that collisions with large body mass species represent a higher threat for humans, with  
108 corresponding higher material costs, fencing may be more beneficial in sections where these  
109 species tend to be more road-killed, as where roads cross landscape connectivity corridors  
110 (Grilo et al. 2011, Santos et al. 2017), in opposition to fencing where higher overall roadkill  
111 occurs.

112 Knowledge of the patterns of mortality, namely how it varies along time, its spatial  
113 aggregation, and their costs allow for better management of existing roads as well as better  
114 planning for future road networks. This information is even more necessary in developing  
115 regions where road networks are expected to have greater expansion and impact in near  
116 future (Meijer et al. 2018, Ascensão et al. 2018, Ascensão 2020). In this study, our main goal  
117 was to estimate the material costs due to WVC in a region of fast development as is the state  
118 of Mato Grosso do Sul, Brazil. The reduction of roadkill is essential therein due to the large  
119 number of WVC that has been evidenced in several studies, but also due to the threat to  
120 human safety that collisions with species of large body mass represent, including the lowland  
121 tapir (*Tapirus terrestris*), giant anteater (*Myrmecophaga trydactyla*) or capybara  
122 (*Hydrochoerus hydrochaeris*) (Ascensão et al. 2017, 2019).

123 We used the information from a 3-year systematic roadkill monitoring program over  
124 of 1,158 km, for which we estimated the real number of casualties accounting for bias in  
125 roadkill counting. We obtained information on the material costs on vehicles (cars and trucks)  
126 due to WVC from car mechanics and online surveys and estimated the total material costs  
127 resulting from collisions with larger animals considering the traffic volume characteristics  
128 (proportion of cars and trucks). We then performed a cost-benefit analysis comparing the  
129 costs of material damage with the necessary investment to implement fences (e.g. Huijser et  
130 al. 2009), either along the full road corridor or only in sections with significant roadkill  
131 aggregation (i.e. hotspots of mortality). With this information we estimated how long it

132 would take to obtain a return on the investment in fencing that prevent collisions, considering  
133 the avoided costs due to WVCs.

134

## 135 2 Methods

### 136 2.1 Study area

137 The study was conducted in the state of Mato Grosso do Sul (MS), located in center-west  
138 region of Brazil, throughout six different transects on four roads (Fig.1), namely the federal  
139 roads BR-262 (R1A, R1B and R4) and BR-267 (R3B), and the state roads MS-040 (R2) and  
140 MS-338 (R3A), totaling 1,158 km (Fig. 1, Table 1). All roads have two-lanes and are paved.

141

142

143 [FIG. 1]

144

145 The land use bordering these roads was dominated by grassland/pasture and agriculture,  
146 followed by remnant native vegetation and riparian areas. The westernmost transect (R4) runs  
147 through part of the Pantanal biome (Brazilian wetland, see Fig. 1) and has higher cover of  
148 native vegetation in its surroundings when compared to the other transects that cross the  
149 Cerrado biome (Brazilian savannah). Urban areas had relatively low representation in the  
150 study area and were not surveyed in road transects. Traffic volume was similar across  
151 transects in the two federal roads (BR) surveyed, ca. 3,600 vehicles per day, of which 33-  
152 48% were trucks (DNIT 2020; Table 1). In roads R2 and R3A, there were no official traffic  
153 counts, so we recreated the methodology used by governmental authorities (DNIT 2020),  
154 namely vehicle counting throughout a full week (24 h per day) (Table 1). The climate  
155 throughout MS is wet from October to March and dry from April to September (Koppen's As

156 or Aw), with mild year-round temperatures (range 21-32°C). Average annual rainfall ranges  
157 between 1000-1500 mm.

158

159 [TABLE 1]

160

## 161 **2.2 Roadkill systematic surveys**

162 Roadkill surveys were carried out by car (40-60 km/h), searching for road-killed animals on  
163 both lanes and shoulders. The choice to carry out research by car and at this speed was due to  
164 the aim to cover a large territory and to record wildlife carcasses with body mass >1 kg.

165 Monitoring lasted three years on a fortnightly basis (average interval of 14.5 days) (Table 1).

166 The monitoring on R1B was interrupted after one year of survey for safety reasons, given the  
167 lack of safe places to park the car when an animal was detected. A total of 420 survey events  
168 were performed, totaling 84,673 km of survey effort. Each observation was classified to  
169 species level (when possible) and its location recorded with hand-held GPS before carcasses  
170 were removed from the road to avoid recounting or road accidents.

171

## 172 **2.3 Carcass persistence time**

173 In parallel with road surveys, we carried out experiments to assess the effect of carcass  
174 removal, in order to more accurately estimate the real number of WVC. Experiments were  
175 performed both in wet and dry seasons, on 337 km of three of the surveyed transects, one  
176 with low traffic volume (R2) and two with higher traffic volume (R3B and R4). These  
177 sections were surveyed on a daily basis for 15-30 days (mean 25.9 days) (Table 2). All  
178 animals found on the first day were discarded and in the following days all road-killed  
179 carcasses were left intact, where detected, recording the species identification (or lower



180 taxonomic level), its approximate weight and their condition (detectable or not). In total, 423  
181 carcasses with body mass >1kg were followed, 268 with less than 5 kg (hereafter <5 kg), 124  
182 between 5-30 kg (hereafter <30 kg) and 31 with more than 30 kg (hereafter >30 kg); 207 in  
183 wet season and 216 in dry season (Table 2).

184

185

[TABLE 2]

## 186 **2.4 Material costs of collisions**

187 We obtained wildlife–vehicle collisions data from Mato Grosso do Sul State containing  
188 information about the accident, including the species involved, vehicle type (car, truck,  
189 other), and damage to the vehicle. Photos of the accident taken by the road company staff  
190 allowed to confirm the species involved in WVC. An estimate of the cost to repair each  
191 vehicle was then requested to three different vehicle repair shops in Campo Grande and then  
192 averaged. In complement, we created an online questionnaire with the Google forms platform  
193 (Supplementary material S1) and disseminated in social networks. There, we asked about the  
194 date, place and period of the day (day, night, sunset, sunrise) of the collision events; the type  
195 of vehicle (car, truck, other); name or description of the species involved in collisions; and  
196 the cost of the material damage, if any. A section for adding observations was also included  
197 in which citizens could provide details about the accident (e.g. whether the vehicle has been  
198 irreparably damaged).

199

## 200 **2.5 Data analysis**

### 201 **2.5.1 Species potentially causing vehicle damage**

202 All species detected in collisions (systematic surveys) were first characterized according to  
203 their likelihood of causing material damage to vehicles when involved in collisions. Based on

204 information from material damage (interviews and questionnaires, see Results), we classified  
205 as potentially causing damage those species with body mass >1kg, excluding all reptiles such  
206 as caimans, and short stature mammals as armadillos. Flying birds were also not considered  
207 as fencing (the mitigation method considered here) is unlikely to reduce collisions with these  
208 species. Overall, we considered mammals with >1kg and the non-flying bird greater rhea  
209 (*Rhea americana*). Those species likely to cause material damage were further classified in  
210 three body mass classes (kg): <5, <30 and >30 (see Table S2.1 in Supplementary material S2  
211 for full classification).

212

### 213 **2.5.2 Estimating total number of roadkill**

214 We estimated the real number of roadkills that occurred during the survey period, for each  
215 road transect, using the GenEst framework and corresponding R package (Simonis et al.  
216 2018, Dalthorp et al. 2020). This software integrates data collected during carcass searches  
217 together with estimates of carcass persistence, search area and searcher efficiency, to  
218 accurately estimate the real number of collisions and to provide a measure of precision  
219 associated with the estimate. GenEst was designed to address the general problem of  
220 estimating the size of a population when not all animals are present on all survey occasions  
221 and the probability of detection is less than one (Simonis et al. 2018). Following Dalthorp  
222 (2018), GenEst is an elaboration of a binomial probability model  $X \sim \text{binomial}(M, g)$ , where  
223  $X$  is the observed number of carcasses and  $g$  is the detection probability. If  $g$  is known, then  
224  $M' = X/g$  is an unbiased estimator for  $M$  and the sampling variance of  $X$  is the only source of  
225 uncertainty about  $M$ . Splitting the total mortality into groups, e.g.  $A$  and  $B$ , then  $M' = M'_A +$   
226  $M'_B = X_A / g_A + X_B / g_B$  is unbiased for  $M$  (Dalthorp et al. 2018). GenEst makes extensive use  
227 of this simple idea of splitting the carcass observation data into distinct subgroups, estimating  
228 mortality in each subgroup, and combining subgroups into larger groups by summing. Further

229 details are extensively documented in GenEst supporting documents (Dalthorp et al. 2018,  
230 Simonis et al. 2018). We used GenEst to model carcass persistence time and, together with  
231 estimates on searcher efficiency and the area searched along the road, to estimate the total  
232 mortality for the different body mass groups per road transect.

233 Carcass persistence was modelled using the data from our experiments, to estimate  
234 the amount of time a carcass would persist for, given the conditions under which it arrived.  
235 For each body mass class, four classes of parametric models of carcass persistence were  
236 tested: exponential, Weibull, logistic, and lognormal. In each model we further tested the  
237 effect of traffic volume (high/low) and season (wet/dry) on the persistence probability, by  
238 comparing models including all combinations of these two predictors together with the null  
239 model, according to the Akaike Information Criterion (AIC). Models were selected based on  
240 AIC values, considering that  $\Delta AIC < 2$  indicate similar models (Burnham and Anderson  
241 2004).

242 As for searcher efficiency (SE), estimating this component requires a different set of  
243 experiments, where the carcasses are disposed by other people in known locations, and  
244 roadkill surveyors have to detect them. The detection error rate provides an estimate of the  
245 detectability (Santos et al. 2016). Due to logistic constrains we did not carry out these  
246 experiments. However, researchers were highly experienced in roadkill surveys in our study  
247 area (Ascensão et al. 2017), and based on this experience we estimated that we could detect at  
248 least 85% of carcasses with  $>1\text{kg}$  on the road. Given the uncertainty of the real value, we  
249 used different values of SE for estimating total mortality: 0.85, 0.90, and 0.95. For carcasses  
250 with lower body masses, we expected a much lower detection probability (Boves and  
251 Belthoff 2012, Teixeira et al. 2013, Santos et al. 2016, Barrientos et al. 2018) and therefore  
252 were not considered in mortality estimations.

253           Regarding the search area (SA) along the road corridor, it is known that many  
254 carcasses are projected off the road during the collision, and that injured animals may still be  
255 able to move away from road lanes and shoulders. It follows that a proportion of the  
256 carcasses can never be detected. From our experience in the study area, whose investigation  
257 includes occasional surveys on the verges, we know that some larger animals die away from  
258 the road, while smaller species are projected far from the road lanes. Again, to tackle the  
259 uncertainty on this parameter, we also used different values of SA for estimating total  
260 mortality: 0.80, 0.85, 0.90, and 0.95, i.e. between 5-20% of all carcasses never fall into a  
261 detectable area, the road pavement and verges.

262           Using GenEst, we estimated the total mortality for the six different transects, per body  
263 mass classes, and using the different combinations of SE and SA (12 models) considering *i*)  
264 the dataset of records >1kg and *ii*) only those species likely to cause material damage to  
265 vehicles. For each model, the accuracy of estimates was measured through 2000 replicates.

266

### 267 **2.5.3 Determining spatial aggregations of collisions**

268 The records pertaining to species likely to cause material damage were aggregated by body  
269 mass class (<5, <30 and >30 kg) and by road sections of five km length. This segment length  
270 was chosen to minimize the chance of spatial variation of hotspot location with time (Santos  
271 et al. 2017), while also being a reasonable distance to apply mitigation measures such as  
272 fencing (Seiler et al. 2016). For each transect and body mass class, we assumed that the  
273 observed number of roadkill per road section would follow a random Poisson  
274 distribution with a mean ( $\lambda$ ) equal to the total number of roadkill divided by the total number  
275 of road sections (Malo et al. 2004, Santos et al. 2017). The probability of any road segment  
276 having  $x$  number of collisions was therefore:

277

$$p(x) = \lambda^x / x! e^{-\lambda}$$

278 A mean value ( $\lambda$ ) for each body mass class and road transect was calculated. We  
279 considered a road section to be an aggregation of collisions, i.e. hotspot of mortality,  
280 when  $p(x) > 0.95$ . We preferred using this conservative value of  $p$  to reduce the likelihood of  
281 highlighting spurious aggregations, resulting from multiple comparisons (Borda-de-Água et  
282 al. 2019). We further assumed that the carcass persistence, searcher efficiency and search  
283 area were equal within and outside the road sections classified as hotspots, and therefore the  
284 proportion of animals not recorded in roadkill surveys was constant across each road transect.  
285 For example, if a transect had 100 records and a total mortality estimated in 120 records (i.e.  
286 20% increase), a given road section of that transect having a significant aggregation of  
287 records, e.g.  $n=40$ , was assumed to have had a total mortality of 48 records (increase in 20%).  
288

#### 289 **2.5.4 Cost-benefit analyses of road fencing**

290 To estimate the material cost of collisions, we used the estimated total collisions with species  
291 potentially causing vehicle damage (see 2.5.1). For each body mass class, we calculated the  
292 mean of reported cost in interviews and online questionnaire, per vehicle type (car or truck).  
293 We assumed that the probability of an animal being hit by a car or truck was proportional to  
294 the traffic volume of each type of vehicle. Hence, the cost calculation considered the mean  
295 traffic volume in each road transect, per vehicle type. For example, the estimated cost of  
296 WVC in the R4 transect (with 33% of traffic of trucks and 66% of cars) was calculated as  
297 follows:

$$298$$
$$299 \quad 0.33 * \text{cost with trucks } (N_{<5} + N_{<30} + N_{>30}) + 0.66 * \text{cost with cars } (N_{<5} + N_{<30} + N_{>30}),$$
$$300$$

301 where  $N$  are the number of individuals from total mortality estimates, of each body mass  
302 class.

303           The material costs were estimated separately for each full transect (considering all  
304 WVC along the road) and for the sections where aggregations of collisions were detected  
305 (WVC in hotspots). We then performed simple cost-benefit analyses for each road transect,  
306 by estimating the return period in years, i.e. the time needed to pay off the investment made  
307 in mitigation measures (fencing) if it avoided 100% of collisions with those larger species.  
308 We also assumed a similar roadkill rate along time (i.e. without significant changes in the  
309 number of collisions along time). The return period was calculated as the ratio between the  
310 initial investment per km and the estimated cost per km and per year. We used as investment  
311 value US\$ 34,056 per km of fencing (on both roadsides), obtained from the average budgets  
312 of three companies that apply fences on MS roads (see Supplementary material S3).

313

## 314 3 Results

### 315 3.1 Roadkill systematic surveys

316 We recorded 10,942 carcasses of road-killed animals of which 9,431 had a body mass >1 kg,  
317 including 4,208 larger animals likely to cause material damage with monetary cost to vehicles  
318 (see Table S2.1). The roadkill rate was generally higher in the transect R4 for species  
319 pertaining to body mass classes <5 and >30; and had similar values across transects for the  
320 intermediate class <30 (Fig. 2). A considerable proportion of animals pertaining to weight  
321 classes <30 and >30, mainly reptile species such as snakes and caimans, as well short stature  
322 mammals such as six-banded armadillo (*Euphractus sexcinctus*) and nine-banded armadillo  
323 (*Dasybus novemcinctus*), were also found in transect R4 (Fig. 2). The number of WVC seems  
324 to be increasing with time in some transects, namely R2, R3A and R3B (Fig. 2).

325

326

[FIG. 2]

327

### 328 **3.2 Total mortality estimates**

329 Carcass persistence models for the three body mass classes had a higher fit using Weibull  
330 distribution (Fig. S4.1 in Supplementary material S4). Overall, carcasses with >1kg were  
331 detectable for  $4.3 \pm 3.7$  days, being the probability of a carcass persisting 15 days < 60%,  
332 with higher values for large body mass species (Fig. S4.1). Models of carcass persistence  
333 including the effects of season and traffic were similar ( $AIC < 1$ ) to those not including these  
334 variables, and therefore we choose the simpler models (without those variables) to estimate  
335 total mortality. Using the carcass persistence models and the different combinations of search  
336 efficiency and search area, we estimated that total mortality of animals >1kg ranged between  
337 (median and 90% CI) 11,983 (11,424 – 12,661) and 15,108 (14,192 – 16,214), of which  
338 between 5,581 (5,245 – 5,965) and 7,072 (6,533–7,705) were with animals likely to cause  
339 material damage with monetary cost to vehicles (Fig. 3). Overall, there was an  
340 underestimation of mortality in roadkill surveys of ca. 22-38%. Hereafter, we will use two  
341 scenarios combining the extreme values of search efficiency (SE) and search area (SA), i.e.  
342 the one having higher mortality estimates (SE: 0.85, SA: 0.80) and the lower mortality  
343 estimates (SE: 0.95, SA: 0.95).

344

345 [FIG. 3]

346

### 347 **3.3 Spatial aggregations of collisions**

348 We identified 43 road sections (ca. 19% of total road length) having a significantly higher  
349 aggregation of collisions. We recorded in these hotspots 1,481 collisions with animals likely  
350 to cause material damage with monetary cost to vehicles, i.e. ca. 34% of the mortality with

351 these species. The majority of these hotspots (n=18; 90 km) were in the transect R4 (Fig. 4).  
352 Using the two scenarios of SE and SA combinations, we estimated that a total of 1,376 –  
353 1,744 (median values of each scenario) collisions were likely to have occurred in the hotspot  
354 sections, which we used in vehicle costs estimates. Noteworthy, hotspots covered a lower  
355 proportion of other smaller but highly road-killed species, including yacare caiman (*Caiman*  
356 *yacare*; 9% of its mortality), black-and-white tegu (*Salvator merianae*; 18%), or six-banded  
357 armadillo (29%) (see Table S2.1).

358

359 [FIG. 4]

360

### 361 **3.4 Material costs in vehicles**

362 We obtained information on material costs for 185 animal-vehicle collisions, of which 94%  
363 referred to animals with body mass >1kg. None of these involved collisions with reptiles or  
364 with short stature mammals, supporting our choice to focus on the greater rhea and larger  
365 mammals as potentially causing material damages (Table S2.1). The average material cost  
366 with animals >1 kg was US\$ 885±1,575 (mean±SD). The mean cost per vehicle type (car and  
367 truck) and body mass ranged between US\$ 65-2,133. Nine responses (5%) referred the total  
368 loss of the vehicle, with costs averaging US\$ 6,505±1,626 (Fig. 5). The cost of hitting a >30  
369 kg animal was considerably higher for trucks.

370

371 [FIG. 5]

372

373 The total costs resulting from the estimated mortality throughout the study period was  
374 estimated to range between US\$ 4,455,730 and 5,645,009, with a cost value per road  
375 kilometer and per year averaging between US\$ 1,171 and US\$ 1,492 across the road



376 transects, respectively for the lower and higher mortality scenarios. The hotspots of WVC  
377 represented 19% of the roads but aggregated ca. 36% of the potential costs with vehicle  
378 damage, i.e. US\$ 1,593,485 – 2,018,779.

379

### 380 **3.5 Cost-benefit analyses of road fencing**

381 Considering an initial investment of US\$ 39,436,848 to fence the whole surveyed transects  
382 (1,158 km; US\$ 34,056 per km of fencing), we calculated the return period of investment  
383 considering the estimated mortality from lower and higher mortality scenarios. Accordingly,  
384 the return period would range between 16 and 40 years across the transects, if fencing the full  
385 length of transects (Table 4). On the other hand, the investment required to mitigate the  
386 hotspot sections would be significantly lower, US\$ 7,322,040, and would have a return  
387 period ranging between 9 and 25 years. Transects with higher number of WVC with larger  
388 animals would have a shorter return period, namely the transect R4 (Table 3).

389

390 [TABLE 3]

## 391 **4 Discussion**

392 We performed over three years of roadkill monitoring in which we recorded >10,000 WVC  
393 along the 1,158 km. About 40% of collisions involved large animals that cause significant  
394 material damage to vehicles, some of which represent a real threat to human lives. Moreover,  
395 some of these larger species are of conservation concern and had considerable roadkill rates,  
396 such as the lowland tapir (267 records) and giant anteater (608 records), probably threatening  
397 their population persistence in the long term in this region (Medici et al. 2012, Desbiez et al.  
398 2020). Furthermore, according to our estimates, the total mortality of species weighting >1 kg  
399 was 22-38% higher than the one recorded and therefore these numbers are likely to be highly

400 conservative. Additionally, the number of WVC seems to be increasing, at least on some  
401 surveyed roads, probably reflecting the increasing traffic volumes in Mato Grosso do Sul  
402 (DNIT 2020). Overall, such high roadkill rates may have serious negative effects on wildlife  
403 population viability (Ceia-Hasse et al. 2018, González-Suárez et al. 2018, Desbiez et al.  
404 2020), as well on human safety (Shilling et al. 2019, Abra et al. 2019, Gren and Jägerbrand  
405 2019), and therefore the implementation of mitigation measures at least in key areas of the  
406 highway is highly necessary.

407         Fencing has been acknowledged as one of the most effective measure to reduce WVC,  
408 particularly when combined with faunal passages (Jaeger and Fahrig 2004, Seiler et al. 2016,  
409 Rytwinski et al. 2016, Spanowicz et al. 2020). There is evidence that several medium and  
410 large mammals that inhabit the region use existing passages, including tapir, capybara and  
411 giant anteaters (Abra et al. 2020). Hence, channel these species into passages through fences  
412 would likely result in greater road mitigation effectiveness. However, the large-scale  
413 implementation of fencing can be hindered due to the high initial investment required. Yet,  
414 our study shows that when compared to the cost of material damage of vehicles, such  
415 investments are likely to pay off in the medium term. According to our data, the initial  
416 investment necessary to fence the whole surveyed transects would have a full return in an  
417 average of 27 years. This period is shorter than most concession contracts, ca. 20-30 years.  
418 Also, to put these investments in perspective, the World Bank estimates that new bituminous  
419 two-lane highway costs ca. one million dollar per km (World Bank 2006), therefore  
420 suggesting that fencing investment represents about 1% of the presumed construction cost.

421         If surrounding the entire road network simultaneously is unviable due to the high  
422 budget required, focusing on road sections concentrating higher number of WVC involving  
423 larger species - at least in a first phase - would provide a much higher cost-benefit relation.  
424 We identified 43 sections that concentrated ca. 34% of WVC with larger animals. Fencing

425 these sections would require 19% of the initial investment with a full return in much shorter  
426 periods. This is particularly evident in transect R4 which add most hotspots with larger  
427 animals, and for which about 9-11 years would suffice to compensate the initial investment.

428 It should be noted that focusing on hotspots of mortality, while greatly reducing the  
429 investment required in mitigation, potentially fails to reduce significantly the mortality of  
430 other species. Particularly in transect R4, we recorded a high number of reptiles as caiman  
431 and short stature mammals as armadillos that would not be protected by exclusionary fencing,  
432 if it was applied only in hotspots. Likewise, fencing is not effective in reducing collisions for  
433 most birds. Yet, these species can be heavily impacted by roadkill (Loss et al. 2014,  
434 González-Suárez et al. 2018), and may also represent a danger for traffic. For example,  
435 although not considered in our estimates, our dataset contains records of accidents with  
436 smaller birds, such as the red-legged seriema (*Cariama cristata*), causing material damages  
437 averaging US\$ 520 (n=7). Therefore, road fencing in the sections with the highest mortality  
438 should be considered an important step, but not an isolated one in the road mitigation process.

439 The average material cost per accident (US\$ 885±1,575) was considerably lower than  
440 the one reported for other regions in Brazil such as in the São Paulo state US\$ 5,000 (Abra et  
441 al. 2019), or in other studies from developed countries, namely US\$ 7,000 in Spain (Sáenz-  
442 de-Santa-María and Tellería 2015) and US\$ 11,900 (with large animals) in California  
443 (Shilling et al. 2019). Such disparity of values probably stems from differences in the cost of  
444 living across countries and regions of Brazil. Accordingly, the investment required to install  
445 fences that we have obtained is considerably lower than the one reported by Seiler (2016) for  
446 fences targeting ungulates in Europe, budgeted at US\$ 44,000 – 65,000 per km road. Hence,  
447 for regions or countries with higher material costs, the return periods are probably similar to  
448 the ones estimated here.

449           The material damage in cars was in average higher when compared to trucks. This  
450 was expected given the higher shaft height of trucks, that allows them to run over animals  
451 without major damages. The exception was for trucks colliding with larger mammals (>30  
452 kg), which had considerable higher costs, over US\$ 2,000, relatively to cars. When a truck  
453 hits a lowland tapir, it collides against a 150-250 kg body mass animal, with a shoulder height  
454 of 77 to 108 cm (Padilla and Dowler 1994). That is, it hits a large and heavy object,  
455 potentially damaging different parts of the vehicle. Conversely, car passengers can be  
456 seriously injured or killed when colliding with these animals. For example, between April  
457 2013 and March 2020, 77 people were injured and 28 died in collisions with tapirs on  
458 different roads of Mato Grosso do Sul (Patricia Medici *pers. comm.*). Moreover, in tropical  
459 countries, roads have mostly two lanes, often without wide shoulders, and therefore the entry  
460 of animals on the road may not be perceived by drivers, especially at night. Therefore,  
461 preventing animals from accessing roads by diverting them to under or over passages is  
462 imperative in regions where these large animals roam, both for their conservation and human  
463 safety.

464           It should be emphasized that our estimates only considered the material damages in  
465 vehicles and are therefore highly conservative figures. We did not include values on human  
466 lives and injuries, due to the difficulty in assigning them monetary value. Yet, when  
467 available, these values would significantly lower the return period of investments (Wijnen  
468 and Stipdonk 2016). For example, Sáenz-de-Santa-María and Tellería (2015) mentions  
469 compensations of US\$ 1,655,750 for fatally injured people; US\$ 259,000 seriously injured  
470 people; and US\$ 7,210 for minor injuries; and in São Paulo state, the average cost for a crash  
471 with human injuries or fatalities is US\$ 29,813 (Abra et al. 2019). In addition, there are other  
472 costs associated with WVC not counted here, namely those associated with traffic police and  
473 medical assistance, road repair, traffic congestion and resulting delays, removal of carcasses,

474 searches for injured or dead animals and the value of animals lost. As an example, jaguar  
475 (*Panthera onca*) ecotourism in Pantanal represents a gross annual income of US\$ 6,827,392  
476 (Tortato et al. 2017), and therefore roadkill of these animals has a serious impact on both  
477 biodiversity and local economy. Also, collisions often imply delays in traffic, with  
478 consequent costs, which can be even more problematic in Brazil, a country where most  
479 transportation of goods often relies on trucks. On the other hand, to guarantee its  
480 effectiveness, fences must be carefully planned and properly installed. For example, for  
481 species capable of climbing it is required to use smaller mesh size or gravity walls, which are  
482 known to provide an effective and long-lasting barrier impeding smaller animals to access the  
483 road (Kenneth Dodd et al. 2004, Baxter-Gilbert et al. 2015) (see Supplementary material S3).  
484 Furthermore, fences require regular inspection, maintenance and repair, which will raise the  
485 associated costs.

486 Overall, accounting for all the different costs related with WVC, from material  
487 damage to insurance payments and general road maintenance, would provide a more precise  
488 evaluation of the economic savings of road fencing. However, using the costs associated only  
489 to material damages in this simple cost-benefit analyses already provided valuable  
490 information to help decision makers to evaluate the feasibility and need of implementing road  
491 mitigation structures. Both the number of injured people and roadkill rates may worsen in the  
492 future, with the increasing development of road networks and traffic volume worldwide  
493 (Meijer et al. 2018). This is particularly true in countries of great diversity where new  
494 development corridors are being planned, cutting into areas hitherto pristine (Laurance et al.  
495 2015, Alamgir et al. 2017, Ascensão et al. 2018).

496 In conclusion, this study shows that investments in road mitigation using properly  
497 installed fencing and connected to safe crossing passages, are likely to be paid off in medium

498 term. Investing in mitigation measures provides a win-win solution for increasing traffic  
499 safety for humans and reduce road-related negative effects on biodiversity.

500

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509

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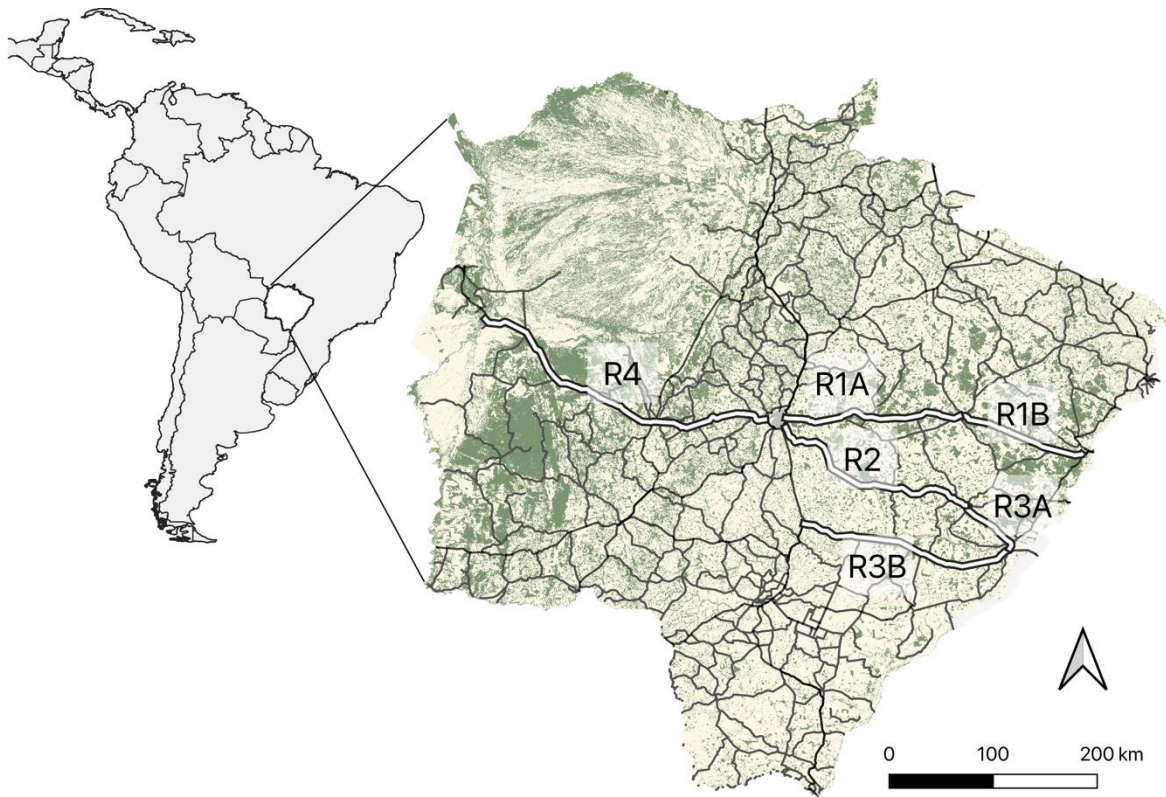
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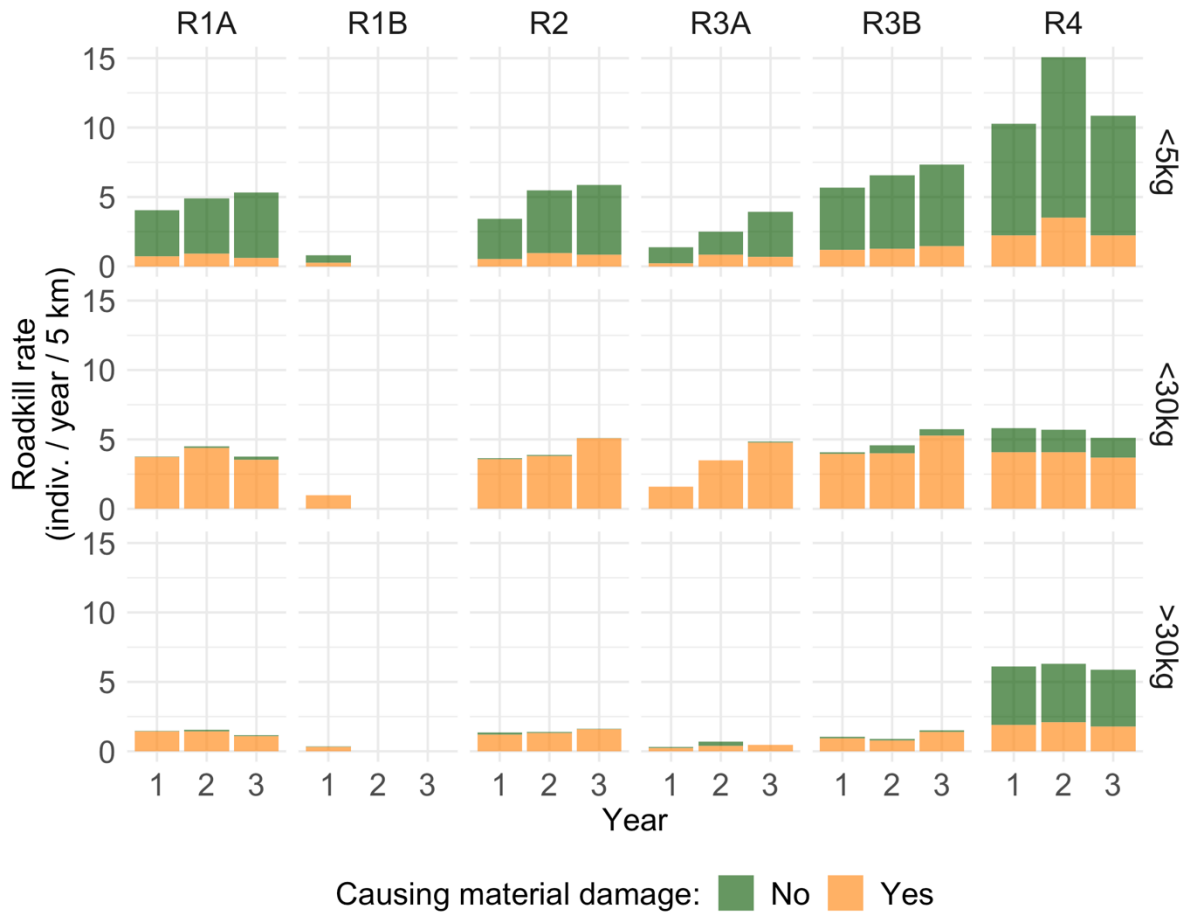
657 Figures

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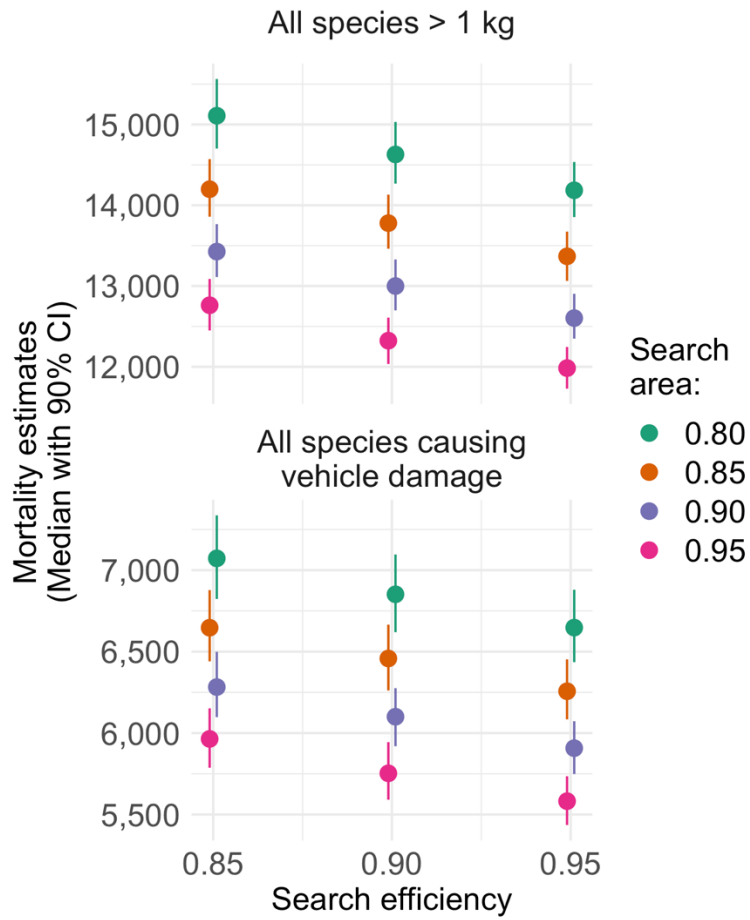
659

660 Figure 1 – Location of the surveyed roads in Mato Grosso do Sul, Brazil. Surveyed  
661 transects are shown in white. The study was conducted on federal roads - R1A, R1B  
662 and R4 in BR262, and R3B in BR267; and on state roads – R2 (MS040) and R3A  
663 (MS338); totaling 1,158 km. Main road network is depicted as black lines. Main land  
664 use classes are forest (darker areas) and open areas, including agriculture and pastures  
665 (lighter areas). Land use was reclassified from MapBiomass (Azevedo Sr et al. 2018).  
666 The city Campo Grande is in the middle of the State. The Pantanal is the upper left  
667 region of the map.



668

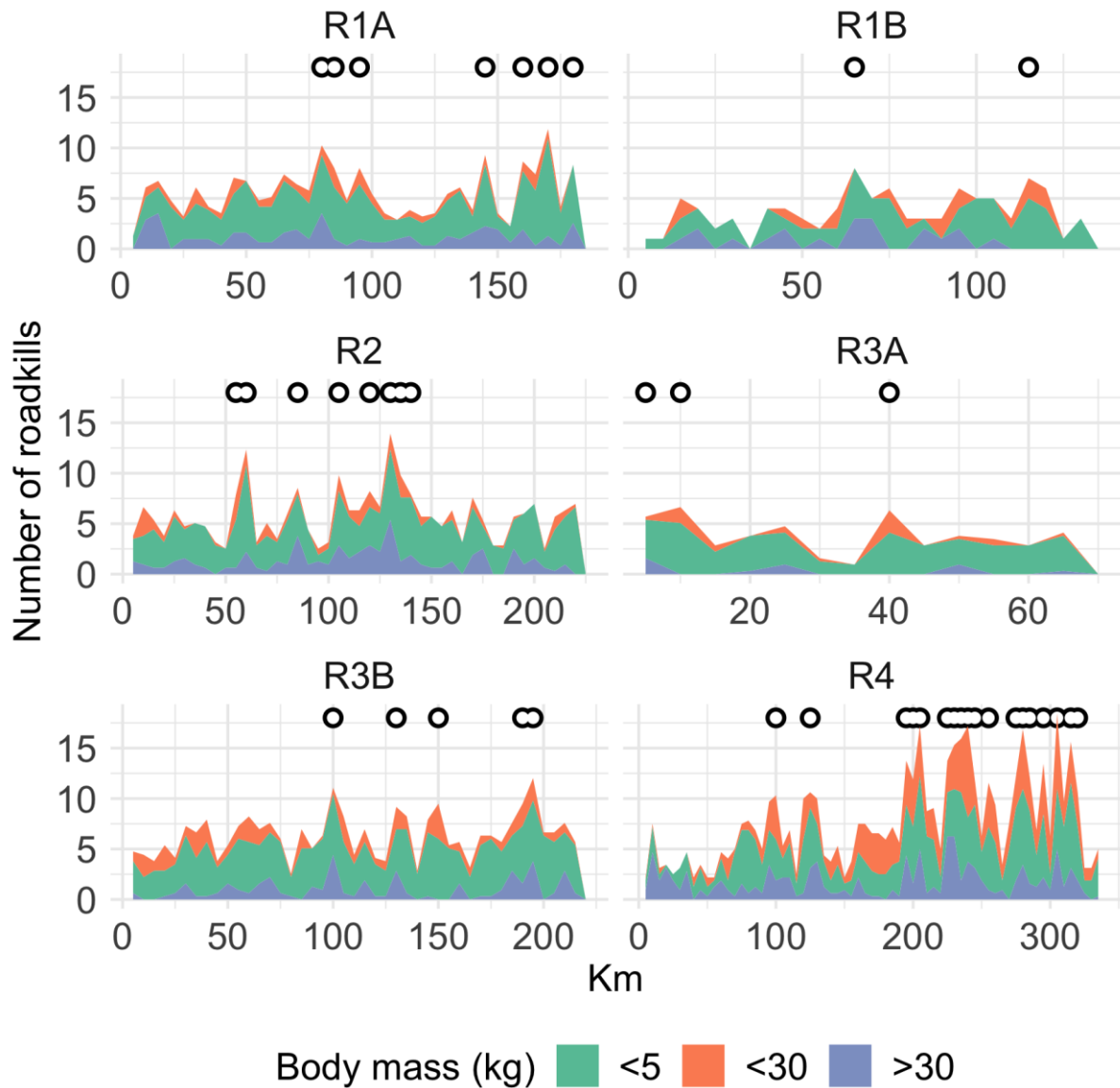
669 Figure 2 – Roadkill rate (individuals per year and per 5 km) recorded along the 3-year  
 670 study period for the six road transects, per body mass class. Values are aggregated  
 671 according to the likelihood of a species causing or not material damage in vehicles.



672

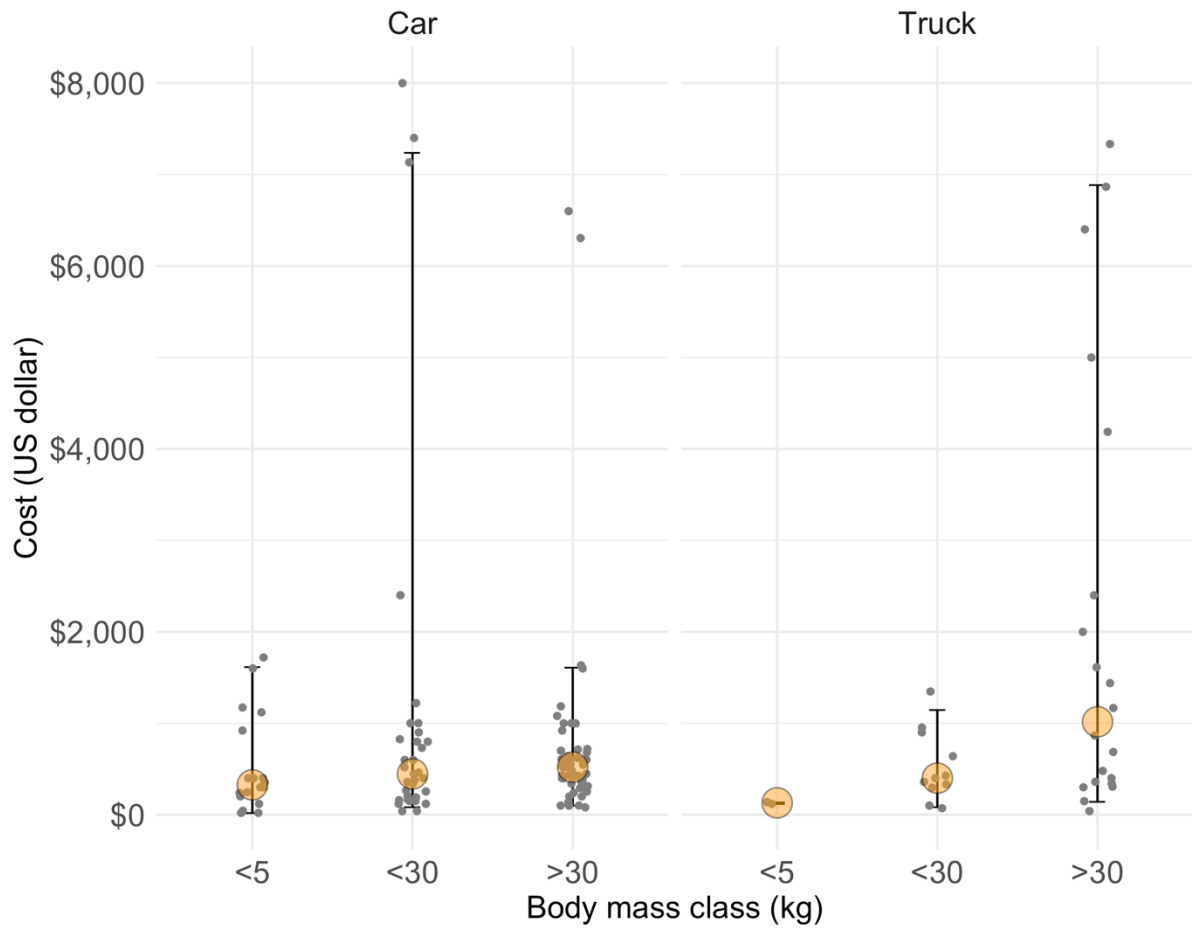
673 Figure 3 – Mortality estimates (median and 90% CI) for all species weighting >1 kg  
 674 (top), and for the subset of species likely to cause damages in vehicles in collisions  
 675 (bottom), according to different levels of Search efficiency (x-axis) and Search area  
 676 (colors). Points are slightly scattered to allow a better reading, due to overlapping CI.

677



678

679 Figure 4 – Spatial patterns of roadkill (individuals per 5 km road section, per year),  
 680 involving species likely to cause material damage with monetary cost to vehicles, per  
 681 body mass class and road transect. Dots on top of each panel indicate hotspots of  
 682 mortality with probabilities of 0.95. Transects are oriented west-east (see Fig.1).



683

684 Figure 5 – Material costs from collisions with animals, by type of vehicle (truck and  
 685 car) and animal body mass class (<5, <30, >30 kg). Big circles represent the median  
 686 values of data collected (represented by the smaller dots, jittered to enable reading).  
 687 Bars indicate 5-95% quantile range.

688 **Tables**

689

690 Table 1 – Summary information of transects surveyed searching for roadkill, indicating  
 691 the length of transects in km, first date of survey, number of surveys, daily traffic  
 692 volume, and the proportion (%) of cars and trucks in traffic volume. Traffic volume  
 693 was obtained from official counts (DNIT 2020), except for MS040 and MS338 which  
 694 was assessed by the team using the same methodology of DNIT (2020). For R3A we  
 695 assumed the same traffic characteristics as R2 (contiguous and similar roads). BR262  
 696 and BR267 are federal roads, and MS040 and MS338 are state roads.

<b>Transect ID</b>	<b>Road name</b>	<b>Length (km)</b>	<b>First systematic survey</b>	<b>Number of Surveys</b>	<b>Daily Traffic Volume (median)</b>	<b>Trucks (%)</b>	<b>Cars (%)</b>
R1A	BR262	182	06/02/2017	78	3,633	39	59
R1B	BR262	129	07/02/2017	25	3,773	48	52
R2	MS040	224	07/02/2017	79	653*	37*	60*
R3A	MS338	66	07/02/2017	79	653*	37*	60*
R3B	BR267	218	27/02/2017	79	3,973	46	49
R4	BR262	339	29/03/2017	80	3,098	33	77

697



698 Table 2 – Survey effort for carcass persistence experiments: length of transects,  
 699 number of daily surveys per season, and number of carcasses surveyed per body mass  
 700 class and season. Body mass classes: between 1-5 kg (<5), between 5-30 kg (<30) and  
 701 more than 30 kg (>30).

<b>Transect ID</b>	<b>Length (km)</b>	<b>Surveys Wet / Dry</b>	<b>Body mass Class (kg)</b>	<b>Carcasses Wet / Dry</b>	<b>Total carcasses</b>
R2	139	29 / 15	<5	66 / 13	79
			<30	24 / 20	44
			>30	8 / 3	11
R3B	96	0 / 15	<5	- / 5	5
			<30	- / 9	9
			>30	- / 1	1
R4	107	21 / 30	<5	72 / 112	184
			<30	26 / 45	71
			>30	11 / 8	19
<b>Total</b>				<b>207 / 216</b>	<b>423</b>

702

703

704 Table 3 – Estimated total costs associated with animal-vehicle collisions with large  
705 animals (>1kg), and per km and year (includes costs from collisions of animals with  
706 cars and trucks). All costs in US\$. Return period is the expected time in years for the  
707 accumulated costs from material damage to match up the initial investment. Estimates  
708 are given for the full transect length in top table and for the hotspots of mortality in  
709 bottom table. Range values result from the different scenarios using Search Efficiency  
710 and Search Area of 0.95 (lower costs, higher period values) and Search Efficiency of  
711 0.85 and Search Area of 0.80 (higher costs, smaller period values).

<b>Transect ID</b>	<b>Total cost (range)</b>	<b>Cost per km per year (range)</b>	<b>Return period</b>
<i>Fencing the full transects</i>			
R1A	664,222 - 857,192	1,170 - 1,510	29 - 23
R1B	122,275 - 158,151	948 - 1,226	36 - 28
R2	876,854 - 1,117,907	1,239 - 1,579	27 - 22
R3A	178,492 - 232,135	856 - 1,113	40 - 31
R3B	765,291 - 950,688	1,111 - 1,380	31 - 25
R4	1,848,596 - 2,328,935	1,704 - 2,147	20 - 16
<i>Fencing the hotspot sections</i>			
R1A	211,375 - 272,806	1,936 - 2,498	18 - 14
R1B	19,350 - 25,037S	1,935 - 2,504	18 - 14
R2	267,980 - 341,693	2,120 - 2,703	16 - 13
R3A	63,612 - 82,632	1,342 - 1,743	25 - 20
R3B	150,295 - 186,859	1,902 - 2,365	18 - 14
R4	880,873 - 1,109,752	3,059 - 3,853	11 - 9

712

713 **Supplementary material**

714

715 **S1 - Google form**

716

717 The form can be found in the following URL:

718 <https://docs.google.com/forms/d/1fZ57Y8IJCARRKKzm7uOqDPAJN69VkQFF5cJmuxz41x>

719 [k/edit](#)

**Custos de colisões com animais silvestres**

Este questionário é liderado pelo ICAS - Instituto de Conservação de Animais Silvestres ([www.icasconservation.org.br](http://www.icasconservation.org.br)). É muito breve, mas a sua informação é muito importante. Queremos recolher informações sobre custos materiais nos veículos resultantes de colisões com animais silvestres. O objetivo é fazer uma avaliação custo-benefício de medidas mitigadoras de colisões (por exemplo, instalação de cercas).

Se tiver informação para mais do que um acidente, por favor responda a um questionário por acidente. Muito obrigado!

**\*Required**

**Onde ocorreu o acidente?**  
Qual a estrada e localização aproximada? Por exemplo, cidade mais próxima ou Município.

Your answer \_\_\_\_\_

**Em que data (aproximadamente)**  
Pode colocar o ano, se não souber mais detalhe

Your answer \_\_\_\_\_

720

721 Fig. S1.1 – Snapshot of the first questions in Portuguese of the Google form asking  
722 about the date, place and period of the day (day, night, sunset, sunrise) of the collision  
723 events; the type of vehicle (car, truck, other); name or description of the species  
724 involved in collisions; and the cost of the material damage, if any.

725

726

727 **S2 – Roadkill summary information**

728 Table S2.1 – Summary of roadkill recorded by number (N), body mass class, and the  
 729 likelihood of causing material damage in vehicles when involved in collisions  
 730 (Damage). Taxa are sorted according to BM and alphabetic order. Body mass classes:  
 731 between 1-5 kg (<5), between 5-30 kg (<30) and more than 30 kg (>30).

Class	Species / taxa	N	Body mass	Damage
<b>Amphibians</b>	Amphibians	203	<0.1	no
<b>Reptiles</b>	Reptiles <1kg	68	<1	no
	<i>Boiruna maculata</i>	1	<5	no
	<i>Bothrops moojeni</i>	2	<5	no
	<i>Dracaena paraguayensis</i>	18	<5	no
	<i>Drymarchon corais</i>	1	<5	no
	<i>Iguana iguana</i>	13	<5	no
	<i>Palusophis bifossatus</i>	1	<5	no
	<i>Spilotes pullatus</i>	2	<5	no
	Other reptiles <5kg	204	<5	no
	<i>Boa constrictor</i>	34	<30	no
	<i>Crotalus durissus</i>	13	<30	no
	<i>Eunectes notaeus</i>	72	<30	no
	<i>Hydrodynastes gigas</i>	25	<30	no
	<i>Paleosuchus palpebrosus</i>	1	<30	no
	<i>Salvator merianae</i>	246	<30	no
	Other reptiles <30kg	10	<30	no
	<i>Caiman latirostris</i>	35	>30	no
	<i>Caiman yacare</i>	849	>30	no
	<i>Eunectes murinus</i>	16	>30	no
	Other reptiles >30kg	10	>30	no
<b>Birds</b>	<i>Ammodramus humeralis</i>	1	<0.1	no
	<i>Brotogeris chiriri</i>	6	<0.1	no
	<i>Campylorhamphus trochilirostris</i>	1	<0.1	no
	<i>Columbina talpacoti</i>	1	<0.1	no
	<i>Crotophaga ani</i>	26	<0.1	no
	<i>Eupsittula aurea</i>	47	<0.1	no
	<i>Icterus croconotus</i>	1	<0.1	no
	<i>Myiozetetes similis</i>	1	<0.1	no
	<i>Nyctidromus albicollis</i>	6	<0.1	no
	<i>Nystalus chacuru</i>	1	<0.1	no

Class	Species / taxa	N	Body mass	Damage
	<i>Paroaria capitata</i>	6	<0.1	no
<b>Birds (cont.)</b>	<i>Passer domesticus</i>	2	<0.1	no
	<i>Patagioenas picazuro</i>	1	<0.1	no
	<i>Pitangus sulphuratus</i>	17	<0.1	no
	<i>Polytmus guainumbi</i>	1	<0.1	no
	<i>Sicalis flaveola</i>	1	<0.1	no
	<i>Taraba major</i>	1	<0.1	no
	<i>Thamnophilus doliatus</i>	4	<0.1	no
	<i>Trogon curucui</i>	1	<0.1	no
	<i>Turdus rufiventris</i>	1	<0.1	no
	<i>Tyrannus melancholicus</i>	2	<0.1	no
	<i>Xolmis velatus</i>	2	<0.1	no
	Other birds <0.1kg	158	<0.1	no
	<i>Alipiopsitta xanthops</i>	2	<1	no
	<i>Amazona aestiva</i>	15	<1	no
	<i>Amazona amazonica</i>	1	<1	no
	<i>Aramides cajanea</i>	7	<1	no
	<i>Aratinga nenday</i>	2	<1	no
	<i>Athene cunicularia</i>	59	<1	no
	<i>Campephilus melanoleucos</i>	1	<1	no
	<i>Colaptes campestris</i>	12	<1	no
	<i>Columba livia</i>	1	<1	no
	<i>Crotophaga ani</i>	26	<1	no
	<i>Crotophaga major</i>	2	<1	no
	<i>Crypturellus parvirostris</i>	1	<1	no
	<i>Cyanocorax chrysops</i>	4	<1	no
	<i>Cyanocorax cyanomelas</i>	1	<1	no
	<i>Dendrocygna viduata</i>	1	<1	no
	<i>Falco sparverius</i>	7	<1	no
	<i>Guira guira</i>	49	<1	no
	<i>Heterospizias meridionalis</i>	3	<1	no
	<i>Jacana jacana</i>	1	<1	no
	<i>Megaceryle torquata</i>	2	<1	no
	<i>Megascops choliba</i>	5	<1	no
	<i>Melanerpes candidus</i>	3	<1	no
	<i>Myiopsitta monachus</i>	1	<1	no
	<i>Nothura maculosa</i>	4	<1	no

<b>Class</b>	<b>Species / taxa</b>	<b>N</b>	<b>Body mass</b>	<b>Damage</b>
	<i>Nyctibius griseus</i>	2	<1	no
<b>Birds (cont.)</b>	<i>Ortalis canicollis</i>	15	<1	no
	<i>Piaya cayana</i>	12	<1	no
	<i>Primolius auricollis</i>	1	<1	no
	<i>Psittacara leucophthalmus</i>	2	<1	no
	<i>Pteroglossus castanotis</i>	5	<1	no
	<i>Ramphastos toco</i>	32	<1	no
	<i>Rhynchotus rufescens</i>	24	<1	no
	<i>Rupornis magnirostris</i>	10	<1	no
	<i>Tigrisoma lineatum</i>	1	<1	no
	<i>Tyto alba</i>	12	<1	no
	<i>Zenaida auriculata</i>	1	<1	no
	Other birds <1kg	583	<1	no
	<i>Aburria cumanensis</i>	1	<5	no
	<i>Ara ararauna</i>	4	<5	no
	<i>Ara chloropterus</i>	1	<5	no
	<i>Aramus guarauna</i>	6	<5	no
	<i>Cairina moschata</i>	1	<5	no
	<i>Caracara plancus</i>	303	<5	no
	<i>Cariama cristata</i>	273	<5	no
	<i>Cathartes aura</i>	2	<5	no
	<i>Cathartes burrovianus</i>	2	<5	no
	<i>Coragyps atratus</i>	63	<5	no
	<i>Crax fasciolata</i>	2	<5	no
	<i>Geranoaetus albicaudatus</i>	2	<5	no
	Other birds <5kg	42	<5	no
	<i>Rhea americana</i>	20	<30	yes
<b>Mammals</b>	Mammals <1kg	42	<1	no
	<i>Alouatta caraya</i>	6	<5	yes
	<i>Cabassous unicinctus</i>	67	<5	no
	<i>Chironectes minimus</i>	2	<5	yes
	<i>Dasyprocta azarae</i>	44	<5	yes
	<i>Dasyprocta novemcinctus</i>	723	<5	no
	<i>Dasyprocta septemcinctus</i>	1	<5	no
	<i>Didelphis albiventris</i>	37	<5	yes
	<i>Eira barbara</i>	29	<5	yes
	<i>Euphractus sexcinctus</i>	1831	<5	no

<b>Class</b>	<b>Species / taxa</b>	<b>N</b>	<b>Body mass</b>	<b>Damage</b>
	<i>Herpailurus yagouaroundi</i>	8	<5	yes
<b>Mammals (cont.)</b>	<i>Leopardus braccatus</i>	2	<5	yes
	<i>Leopardus wiedii</i>	1	<5	yes
	<i>Lycalopex vetulus</i>	52	<5	yes
	<i>Nasua nasua</i>	100	<5	yes
	<i>Sapajus cay</i>	4	<5	yes
	<i>Sylvilagus brasiliensis</i>	16	<5	yes
	<i>Tamandua tetradactyla</i>	549	<5	yes
	Other mammals <5kg	251	<5	no
	<i>Cerdocyon thous</i>	1614	<30	yes
	<i>Chrysocyon brachyurus</i>	16	<30	yes
	<i>Cuniculus paca</i>	3	<30	yes
	<i>Leopardus pardalis</i>	14	<30	yes
	<i>Lontra longicaudis</i>	9	<30	yes
	<i>Mazama americana</i>	6	<30	yes
	<i>Mazama gouazoubira</i>	33	<30	yes
	<i>Myrmecophaga tridactyla</i>	608	<30	yes
	<i>Pecari tajacu</i>	5	<30	yes
	<i>Procyon cancrivorus</i>	135	<30	yes
	<i>Speothos venaticus</i>	3	<30	yes
	Other mammals <30kg	95	<30	no
	<i>Blastocerus dichotomus</i>	7	>30	yes
	<i>Hydrochoerus hydrochaeris</i>	578	>30	yes
	<i>Panthera onca</i>	1	>30	yes
	<i>Priodontes maximus</i>	3	>30	yes
	<i>Puma concolor</i>	6	>30	yes
	<i>Sus scrofa</i>	11	>30	yes
	<i>Tapirus terrestris</i>	267	>30	yes
	<i>Tayassu pecari</i>	19	>30	yes

732

733

734 **S3 - Suggested fence characteristics**

735 In this study, the fences are the main measures discussed to be adopted, properly linked to  
736 existing road passages. In the studied transects there are several underpasses, including cattle  
737 boxes, drainage culverts and bridges. In R2 alone, there are 47 underpasses (39 cattle boxes  
738 and 8 bridges). Livestock management between roadsides is performed under the road, in  
739 large concrete structures with dimensions  $\geq 2 \times 2$  meters. Such structures allow the crossing  
740 of wild animals, including large ones such as tapir, giant anteater and deer species.

741 Fences must prevent medium and large wild animals from entering the road. They  
742 should be at least 1.70 meters high and 30 cm buried in the ground, have a concrete wall or  
743 fiber cement screen in the lower part of the fence in contact with the ground and metallic wire  
744 mesh up to 10 x 10 cm and metal or concrete posts (Fig. S3.1). This design is recommended  
745 to bar the entry of animals that try to pass between the fence lines (e.g. *Leopardus* sp.), jump  
746 over the fence (e.g. *Mazama gouazoubira*, *Mazama americana*, *Ozotoceros bezoarticus*), dig  
747 under the fence (e.g. *Dasypus* sp., *Euphractus sexcinctus*, *Priodontes maximus*) or that have  
748 enough strength to trying to push into the fence (e.g. *Hydrochoerus hidrochoerus*, *Tapirus*  
749 *terrestris*). Yet, the recommended design may only discourage climbing animals from  
750 overcoming the fence, but not completely bar their entrance to the highway (e.g. *Nasua*  
751 *nasua*, *Didelphis* sp.).

752 The cost of this fence type averages US\$ 34,056 per km (in both sides), a value that  
753 was obtained from three companies that apply fences on MS roads (values in US\$: 44,280,  
754 31,680 and 26,208).

755



756



757

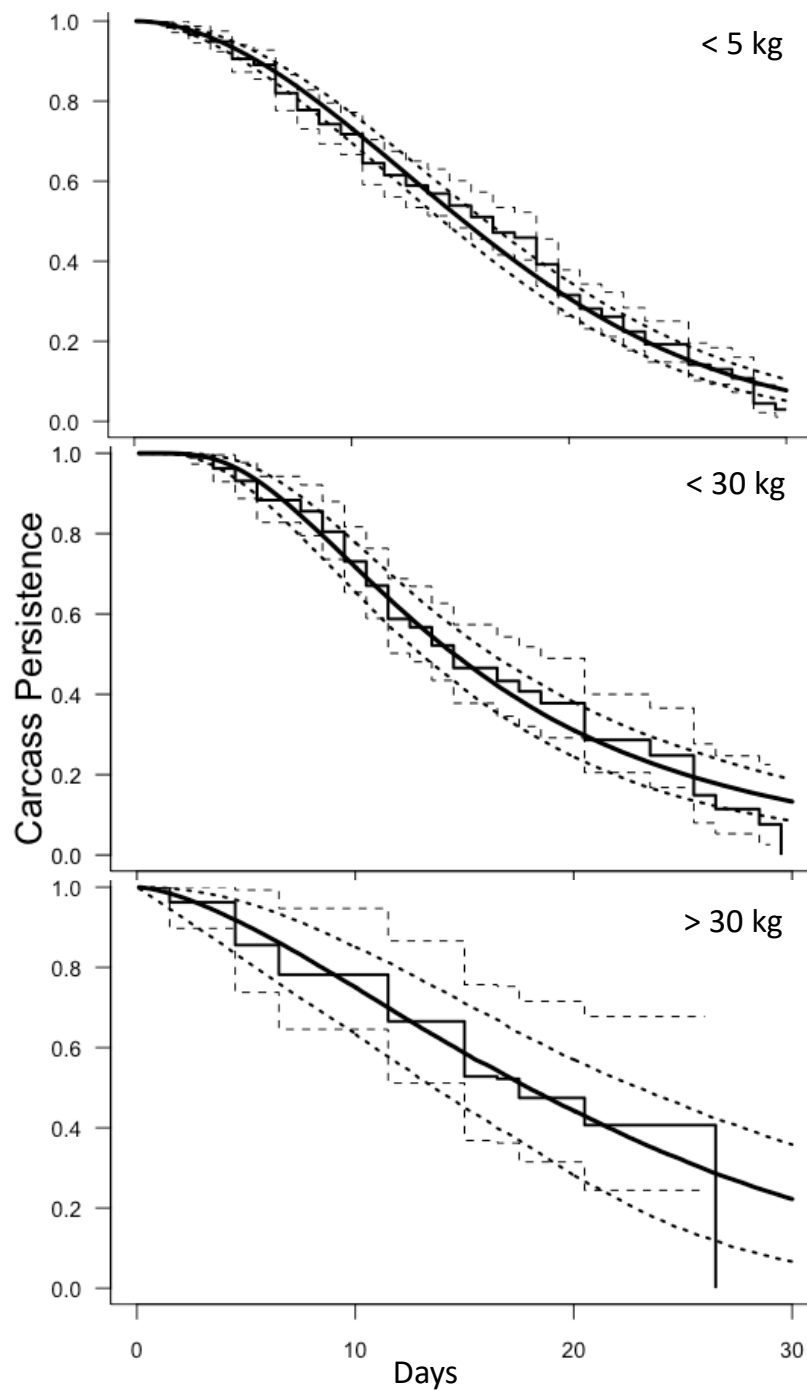


758

759 Figure S3.1 – The design of fence projected as a mitigation to decrease WVC (A), and in  
760 combination with wildlife underpasses, water culverts or cattle boxes (B). Source:  
761 ViaFAUNA Environmental Studies.

762

763 **S4 - Carcass persistence probability models**



764

765 Fig S4.1 - Carcass persistence probability with time (days), per body mass class. Stair-  
766 shape line is the Kaplan Meier estimator, continuous line is the Weibull distribution  
767 fitted to data. Respective confidence intervals are plotted in dotted line. Dotted blue  
768 lines indicate the median persistence probability for the time interval of systematic  
769 surveys.