# **Forest Ecology and Management**

# Mammal species composition and habitat associations in a commercial forest and mixed-plantation landscape --Manuscript Draft--

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Abstract:	Commercial forest plantations of fast-growing species have been established globally to meet increasing demands for timber, pulpwood, and other wood products. Industrial plantations may contribute to tropical forest conservation by reducing exploitation of primary and secondary natural forests. Whether such plantations can support critical elements of biodiversity, including provision of habitat and movement corridors for species of conservation concern, is an important question in Southeast Asia. Our objectives were to investigate relationships between habitat gradients and community attributes of medium-sized to large mammals in a mixed plantation mosaic in Bengkoka Peninsula, Sabah, East Malaysia. Data on mammals were collected using 59 remote camera stations deployed for a minimum of 21 days (24-hour sampling occasions) in three major land-use types: natural forest, Acacia plantations, and non-Acacia (oil palm, rubber, young Eucalyptus pellita). We used sample-based rarefaction to evaluate variation in species richness with land use and generalized linear models and ordination analyses to evaluate whether variation in mammal detections and species composition were associated with habitat gradients. We recorded >22 mammal species ore 1,572 sampling occasions. Natural forest area was positively associated with mammal species richness and detections of threatened mammals. Overall detections of natural forest and Acacia and increasing proximity to roads. Sample-based rarefaction curves indicated that species richness and diversity, but non-Acacia plantations shared similar values for species richness and diversity, but non-Acacia plantations scored lower in both metrics. Ordination analyses revealed that mammal species composition differed among different types of land use, with smaller generalists using non-Acacia and a variety of other mammals, including threatened species such as sun bears ( Helarctos malayaus ) and western tarsiers ( Tarsius bancanus ), using natural forest, Acacia, or a combination of the
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Editor in Chief Forest Ecology and Management Dan Binkley School of Forestry Northern Arizona University Flagstaff, AZ 86011, USA

Submission of manuscript

Dear Professor Binkley,

We are very pleased to submit our manuscript titled 'Mammal species composition and habitat associations in a commercial forest and mixed-plantation landscape' by Wai Pak Ng et al. for your consideration as a publication in *Forest Ecology and Management*.

Conversion of tropical lowland rainforest to agriculture or industrial tree plantations is a major driver of habitat loss for native species in Southeast Asia. This study was conducted in an industrial forest mosaic in Pitas District, Sabah, in Malaysian Borneo, where most natural forest remained as small isolated fragments. We used remote camera data to investigate relationships among habitat and community attributes of mammals in the study area. A key finding from our study was that mammal species richness was comparable to that reported from surveys in protected areas, but that natural forest remnants in the study area may play an important role in the persistence of those species. Another key finding was that a few species, listed as globally threatened, were associated with Acacia plantations. Thus, Acacia plantations possess attributes for supporting a diversity of mammal species, but this potential may depend largely on the location of the site and the retention of a mosaic of native habitat.

This manuscript is our original unpublished work and has not been submitted to any other journal for review. All the authors listed have approved the manuscript and agreed with its submission to *Forest Ecology and Management*. We would greatly appreciate your consideration of our manuscript for review and look forward to your response.

Sincerely,

S. Ratnayele

Shyamala Ratnayeke Associate professor Department of Biological Sciences Sunway University No.5, Jalan Universiti, Bandar Sunway, 47500 Selangor Darul Ehsan, Malaysia.

- Landscape conditions influence the composition of mammal communities in agroforests.
- Mammal detections and species richness are positively associated with the area of natural forest in the plantation mosaic.
- Mammal detections decrease within and close to the edge of *Acacia mangium* plantations.
- Detections of threatened mammals increase where extents of natural forest and planted *Acacia mangium* are greater, and at sites close to roads.

1	<u>Title</u> : Mammal species composition and habitat associations in a commercial forest and mixed-
2	plantation landscape
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24	Disclaimer: This draft manuscript is distributed solely for purposes of scientific peer review. Its content is
25	deliberative and pre-decisional, so it must not be disclosed or released by reviewers. Because the manuscript has
26	not yet been approved for publication by the U.S. Geological Survey (USGS), it does not represent any official
27	USGS finding or policy.

## 28 ABSTRACT

29 Commercial forest plantations of fast-growing species have been established globally to meet increasing demands for timber, pulpwood, and other wood products. Industrial plantations may 30 31 contribute to tropical forest conservation by reducing exploitation of primary and secondary natural 32 forests. Whether such plantations can support critical elements of biodiversity, including provision of 33 habitat and movement corridors for species of conservation concern, is an important question in 34 Southeast Asia. Our objectives were to investigate relationships between habitat gradients and 35 community attributes of medium-sized to large mammals in a mixed plantation mosaic in Bengkoka 36 Peninsula, Sabah, East Malaysia. Data on mammals were collected using 59 remote camera stations 37 deployed for a minimum of 21 days (24-hour sampling occasions) in three major land-use types: natural forest, Acacia plantations, and non-Acacia (oil palm, rubber, young Eucalyptus pellita). We 38 used sample-based rarefaction to evaluate variation in species richness with land use and generalized 39 40 linear models and ordination analyses to evaluate whether variation in mammal detections and species composition were associated with habitat gradients. We recorded >22 mammal species over 1,572 41 sampling occasions. Natural forest area was positively associated with mammal species richness and 42 43 detections of threatened mammals. Overall detections of mammals increased with decreasing 44 elevation, but decreased within, and close to, Acacia plantations. Detections of threatened mammals increased with greater proportions of natural forest and Acacia and increasing proximity to roads. 45 Sample-based rarefaction curves indicated that species richness of mammals in Acacia and natural 46 47 forest was considerably higher than observed. Both natural forest and Acacia plantations shared 48 similar values for species richness and diversity, but non-Acacia plantations scored lower in both 49 metrics. Ordination analyses revealed that mammal species composition differed among different 50 types of land use, with smaller generalists using non-Acacia and a variety of other mammals, 51 including threatened species such as sun bears (Helarctos malayanus) and western tarsiers (Tarsius 52 bancanus), using natural forest, Acacia, or a combination of the two. Our results suggest that Acacia 53 plantations possess attributes supporting a diversity of mammal species, including those we defined as 54 threatened based on IUCN criteria. This may be a function of the habitat mosaic with natural forest in

- the study area and the mangrove forests on the fringes of the peninsula, which are likely refuges of mammal diversity. Their retention and restoration, therefore, may enhance the conservation potential of industrial *Acacia* plantations. Additionally, controlled road access in conjunction with antipoaching operations and strengthening public awareness are essential to reduce the threat of overexploitation.
- 60 Keywords: fast-growing tree species; mammal species composition; conservation of mammals;
- 61 Southeast Asia; East Malaysia

## 62 1. INTRODUCTION

In the past few decades, large areas of tropical rainforest have been lost to logging, expanding 63 64 infrastructure, and conversion to agriculture (Hansen et al. 2013, Giam 2017). The issue is particularly pressing in Southeast Asia, with forest loss fuelled by population growth, economic development, and 65 66 the global demand for natural resources such as tropical hardwoods, rubber, and palm oil (Laurance, 2007; Sodhi et al., 2009; Wilcove et al., 2013). Between 2000 and 2010, Borneo lost an average of 67 500,000 ha/year of forest, mostly involving lowland rainforest and peat swamps that are important 68 strongholds of tropical biodiversity (Miettinen et al., 2011). Over 40% of natural forests in Sabah 69 have been lost and few areas sustain primary forests that have not experienced intense logging 70 (McMorrow and Talip, 2001). The direct and indirect effects of total forest loss, agri-conversion, and 71 72 timber extraction are expected to impact ecosystem services, human social and economic welfare, and 73 forest-dependent species in multiple ways, particularly with respect to food, suitable living space, poaching pressure, and conflict with humans (Meijaard et al., 2005; Dohrenbusch and Bolte, 2007; 74 Butler, 2019). 75

Sustainable management of tropical forest resources is crucial for maintaining essential ecosystem 76 77 services and reducing the loss of biodiversity (Sodhi et al., 2010; Struebig et al., 2015). Toward this 78 end, Malaysia has established commercial forest plantations of fast-growing exotic trees such as acacias and eucalypts to meet the growing demand for timber, pulpwood, and other wood products 79 (Gaveau et al., 2016). Commercial forest plantations typically consist of extensive areas of 80 81 monocultures with reduced biodiversity, but may contribute to tropical forest conservation by 82 reducing further exploitation of primary and secondary natural forests. Additionally, commercial forest plantations could potentially continue to provide important ecosystem services by serving as 83 84 watersheds, reducing soil erosion, and sequestering atmospheric carbon (Dohrenbusch and Bolte, 2007; Krisnawati et al., 2011; Braakhekke et al., 2019; Nath et al., 2019). An important question is 85 86 whether such plantations can support critical elements of biodiversity, including habitat and movement corridors for species of conservation concern. This propensity may be realized only if 87

substantial patches of natural forest are retained (Edwards et al., 2012), but further research isurgently needed.

90 The capacity of selectively logged forests or monoculture forest plantations to support vertebrate 91 species, including large to medium-sized mammals, is a pressing conservation issue (Norris et al., 92 2008; Brodie et al., 2015). Mammals are particularly vulnerable to habitat loss and overexploitation 93 and have consequently received much conservation attention (Wilcove et al., 2013). A quarter of all 94 mammal species are threatened with extinction (The International Union for Conservation of Nature 95 [IUCN], 2019), with current extinction rates well above background rates (Barnosky et al., 2011). 96 Mammals in the Indomalayan region are particularly at risk (Sodhi et al. 2009; Hoffman et al., 2011). 97 In Southeast Asia, threats from habitat loss and poaching are decimating mammal populations (Sodhi 98 et al., 2010), with some studies predicting that 21–48% of mammals in this region may be extinct by 2100 (Brook et al., 2003). These threats are compounded by ecological traits such as large area 99 100 requirements, special resource requirements, migratory habits, and low population densities (Western 101 et al., 2009). Several species of mammal play keystone roles in ecosystems by dispersing seeds, 102 maintaining the composition of plant communities through grazing (Young et al., 2013), or 103 maintaining biodiversity through the cascading effects of predation (Terborgh et al., 2001). Large 104 charismatic mammals are important conservation flagships and conservation umbrellas through their sensitivity to human disturbance, co-occurrence with other species of conservation concern and large 105 106 area requirements (Noss, 1990; Caro, 2003; Ratnayeke and van Manen, 2012; Brodie et al., 2015). 107 Moreover, variation in the type and intensity of habitat alteration can influence mammalian 108 assemblages, which thus have the potential to serve as useful indicators of habitat disturbance 109 (Cheyne et al., 2016). Borneo is among the 18 regions of the world supporting megadiversity, including 288 species of 110 terrestrial mammal (Budiharta and Meijaard, 2017). Approximately 40% of Borneo's mammal species 111 are classified under various level of conservation risk (IUCN, 2019). Between 1973 and 2010, 112

Borneo's forest cover (558,060 km<sup>2</sup>) declined by 30%, with 10% (75,480 km<sup>2</sup>) of forests replaced by

industrial oil palm and commercial timber plantations; the highest forest loss was in the Malaysian

115 state of Sabah (Gaveau et al., 2014). Wildlife inventories report the persistence of large Bornean 116 mammals in degraded forest or in portions of timber and oil palm plantations adjoining natural forests. These typically include bearded pig, Sus barbatus, sambar deer, Rusa unicolor, Bornean 117 yellow muntjac, Muntiacus atherodes, sun bears, Helarctos malayanus, (McShea et al., 2009; 118 119 Guharajan et al. 2018), and the Critically Endangered Bornean orangutan (Pongo pygmaeus; Meijaard 120 et al., 2010). A major goal of sustainable forestry is to develop integrated land-use systems that preserve valuable elements of biodiversity and ecosystem processes (Bruenig, 1996). Industrial forests 121 need not necessarily be at odds with wildlife conservation if they can be managed in a manner that 122 enhances and maintains wildlife populations and may serve as temporary refuges and important 123 wildlife corridors between fragments of more suitable habitat. Research aimed at identifying factors 124 associated with the distribution and diversity of mammals within industrial forest mosaics will 125 126 contribute to this purpose. The goal of our study was to determine the associations between species assemblages of mammals and habitat characteristics of a commercial forest mosaic in Sabah, East 127 128 Malaysia.



Figure 1: Study area showing land use in Bengkoka Peninsula, District of Pitas, Sabah, Malaysia. Ex-SAFODA (former
Sabah Forestry Development Authority) areas were a mix of *Acacia mangium*, hill rice, burned or fallow land, and oil
palm and rubber plantations.

## 133 2.0 METHODOLOGY

## **134** 2.1 *Study area*

The study area was located in Bengkoka Peninsula (6º 49' 55" N and 117º 09' 32" E; Figure 1), which 135 is situated at the northern tip of Sabah, on the island of Borneo, Malaysia. Lowland dipterocarp forest 136 137 and coastal mangrove once covered the area. In 1983, a 60-year concession was granted to the Sabah 138 Forestry Development Authority (SAFODA) to log and plant an area of approximately 25,000 ha in the peninsula with Acacia mangium (Kwiheng Wood and Environmental Consultants [KWEC] 2009). 139 Since the gazetting, an intensive program of planting, maintenance, and harvest was established. More 140 than half the area consisted of Acacia mangium (Table 1) managed by two plantation companies, 141 Acacia Forest Industries Sendirian Berhad (AFISB) and Gerak Saga Sendirian Berhad (GSSB). 142 143 Plantation compartments were established from a combination of Acacia plantation and natural regeneration after wildfires (Acacia wildings). Weeding, fertilizing, and thinning were the most 144 145 common forms of silvicultural management in the first two years after saplings were planted. 146 Harvesting for paper pulp was carried out on stands that were 7–8 years old. Older stands of 10–12 147 years were harvested for timber. Since 2014, Eucalyptus pellita has been used to gradually replace Acacia mangium in harvested 148 149 compartments. Patches of privately-owned oil palm and rubber plantation were also found in the study 150 area and together with new stands of *Eucalyptus pellita*, were classified under the land-use type non-

151 Acacia (Table 1). Ex-SAFODA land areas were given back to local communities (Figure 1). We

sampled these areas as well.

About 18% of the study area consisted of native vegetation that was retained for the conservation of wildlife and water resources. This included mangroves, wetlands, and selectively logged secondary forest, water catchments, river buffers, and a few small patches of fallow land (AFISB, 2016). These were classified as natural forest (Table 1). Areas of coastal mangrove that were under the jurisdiction of the Sabah Forestry Department were excluded from our study.

- 158 There were 63 villages, 10 primary schools, and 2 secondary schools in the peninsula. Livelihoods of
- 159 local indigenous people were derived primarily from hill paddy farming, working in the commercial
- timber plantations, hunting, and fishing (AFISB, 2016).
- 161 Table 1: Percentage of three different land-use types within Acacia Forest Industries and Gerak Saga162 areas, Bengkoka Peninsula, Sabah, Malaysia, 2016–2017.

	<b>AFI</b> area	GS area	<b>Total Land</b>	
Land-use type	(ha)	(ha)	(ha)	%
Natural forest <sup>a</sup>	3,741	693	4,434	17.5
Acacia plantation	7,415	5,758	13,173	52.0
Non-Acacia plantation <sup>b</sup>	7,711	0	7,711	30.5
Total	18,867	6,451	25,318	100.0

<sup>a</sup> Mangrove, wetlands, logged-over forest, water catchment, river buffers, or fallow land.

<sup>b</sup> Planted with *Hevea brasiliensis*, *Elaeis guineensis*, or *Eucalyptus pellita*.

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## 166 2.2 *Remote camera survey*

167	We deployed remote cameras (Moultrie M990i Gen2, Pradco Outdoor Brands, Alabama) during the
168	inter-monsoon season between 10 April and 7 December 2017. We used ArcMap 10.3.1 (Esri,
169	Redlands, California, USA) to randomly select camera sites across the three different land-use types:
170	natural forest, Acacia plantation, and non-Acacia plantation, to capture a gradient of habitat
171	conditions. We maintained a minimum spacing of 1 km among camera sites (Wemmer et al. (2004),
172	to enhance independence between them. Cameras were positioned at 40-50 cm above ground (Giman
173	et al., 2007) and 10 g of scent lure (shrimp paste, locally sourced) was hung ~1 m above ground level
174	and 2.5 m in front of the camera to improve detection. The lure had been shown previously to be
175	effective at attracting a wide range of mammals during trials in Bengkoka Peninsula and at Tabin
176	Wildlife Reserve, Sabah. We set cameras to collect data for 21 consecutive sampling occasions of 24
177	hours, programmed with a 1-min delay between photographs with each event accompanied by a 10-
178	sec video. We checked cameras weekly to replace memory cards, batteries, and bait. We developed
179	this sampling design to enhance detection of mammal species occurring within a 500-m radius of the
180	camera (Holinda et al. 2020).

181 2.3 Environmental variables for model fitting

182 We obtained data for 10 natural and anthropogenic environmental covariates from GIS databases maintained by AFISB and GSSB. For each camera site, we measured the distance (m) to the nearest 183 edge of specific land-use types using ArcMap 10.3.1 Spatial Analyst Tools (Esri, Redlands, 184 California, USA). For area (ha) measurements, we calculated a 500-m buffer around each camera site, 185 186 which we considered sufficient to reflect habitat covariates potentially selected by mammals detected by the camera. Covariates measured at each sampling site included: 1) elevation, 2) distance to nearest 187 188 human settlement, 3) distance to nearest road, 4) distance to nearest river, 5) area of natural forest 189 (i.e., river buffer, forest reserve, mangrove or associated mangrove, secondary/regenerated forest), 6) 190 area of Acacia plantation, and 7) area of non-Acacia plantation (Hevea brasiliensis, Elaeis guineensis, 191 *Eucalyptus pellita*). We included 3 binary covariates: distances <1000 m or >1000 m from the edge of 192 natural forest, Acacia plantation, and non-Acacia plantation. We created raster layers for all these 193 covariates with a spatial resolution of 130 m.

## 194 2.4 Data analysis

195 We deployed 24 camera sites in natural forest, 24 in Acacia plantations, and 11 in non-Acacia 196 plantations. Cameras were operated for a total of 1,572 sampling occasions of 24 hours, with 621, 197 647, and 304 occasions, respectively, in Acacia, natural forest, and non-Acacia. We used the remote 198 camera images and videos to identify mammals to species level based on Phillipps and Phillipps 199 (2016), IUCN (2019), and confirmation by experts. When image clarity image or small body size 200 hindered identification at the species level, we grouped images within a common genus, family, or order. These included rodents, civets, muntjac, mouse deer, and otters. Images of tree shrews (Order 201 202 Scandentia), were usually indistinguishable from squirrels (Order Rodentia, Family Sciuridae) and 203 were grouped together. Species grouped together were counted as a single species when measuring species richness. 204

We calculated camera detection rates (*D*) as the number of independent photographs of a species detected (*C*) per 100 sampling occasions using the formula:  $D = C \times 100 / \sum N$ , where  $\sum N$  was the total number of sampling occasions accumulated over the study (Bernard et al., 2014). Because multiple photos of a species within the same day may not represent independent detections (Royle et al., 2009), we considered the detection of a species at a camera site within a 24-hour period as anindependent detection.

211 Observed values of species richness are influenced by sampling effort (i.e., number of sampling 212 occasions and number of camera stations). Biodiversity samples are usually incomplete, and some 213 species, although present are not detected (Chao et al., 2014). Because area and sampling intensity 214 differed among land-use types, we compared sampling effort (sample completeness) by constructing 215 sample-based rarefaction and extrapolation (R/E) curves (Chao and Jost, 2012) to estimate the 'true' 216 or effective number of species (i.e., estimated species richness; Colwell et al., 2012). We standardized 217 data for camera sites to 21 sampling occasions and tabulated presence and absence for each species recorded. We used these data to estimate Shannon and Simpson diversity indices, which account for 218 the evenness or skewness of species observations. Curves were based on incidence data, with 95% 219 confidence intervals based on 5,000 bootstrap replicates, and generated using the iNEXT package 220 221 (Hsieh et al., 2016) in the R environment 3.5.3 (R Core Team 2019).

222 We used Poisson regression to investigate relationships between mammal count data (species 223 richness, total mammal detections, total threatened mammal detections) as response variables and the 224 10 environmental covariates as predictor variables. Poisson regression is particularly suited for count 225 data that tend to have skewed frequency distributions (Jones et al., 2002). We defined threatened 226 mammals as those listed by the IUCN as Critically Endangered, Endangered, or Vulnerable (IUCN, 227 2019). We standardized covariates to a mean of 0 and a standard deviation of 1 (Ramette, 2007). 228 We used an information-theoretic approach to assess model fit among a set of *a priori* models. 229 Generation of the model set was preceded by investigating individual covariates visually and selecting 230 those that showed a potential relationship with the response variable (Anderson, 2007; Grueber et al., 231 2011). We then generated Poisson models to examine the association between the response variable 232 and plausible combinations of predictor variables (Warton et al., 2016). Because the total number of

sample sites was 59, we limited the number of covariates in any single model to four or fewer.

234 Poisson regression relies on the assumption that the variance and mean of the response variables are 235 similar. We used a regression-based t-test (Cameron and Trivedi, 1990) of this assumption in package AER (Kleiber and Zeileis, 2008). Where overdispersion was evident, we used negative binomial 236 models in lieu of Poisson models. We used Akaike's Information Criterion corrected for small sample 237 238 sizes (AIC<sub>c</sub>; Akaike, 1974) to rank and select the most plausible models (Burnham and Anderson, 2002). If no single best model was evident, we calculated a weighted average of parameter estimates 239 240 of models within 2 AIC<sub>c</sub> units of the highest-ranked model (Grueber et al., 2011) using package MuMln (Barton, 2019). We used package faraway (Faraway, 2016) to check for multicollinearity 241 242 among variables using the Variance Inflation Factor (VIF).

We generated prediction maps for species richness and mammal detections by applying the regression 243 equations to each 130-m pixel. We limited spatial inference to pixels contained within the study area, 244 that is, areas for which land use data were available. We used Spatial Analyst tools in ArcGIS (ESRI, 245 246 Redlands, CA, USA; v.10.6) to calculate predictions separately for each of the models with  $\Delta AIC_c \leq$ 2.0. For the binary covariates we created a map layer with pixel values of 1 for areas within 1000 m of 247 Acacia and values of 0 for >1000 and multiplied the layer with the respective coefficient. We then 248 multiplied each layer with their respective  $AIC_c$  weights and summed these layers to create a final 249 250 map depicting the model-averaged predictions for species richness and number of mammal detections. We used canonical correspondence analysis (CCA) to display and evaluate the influence of 251 environmental gradients on variation in mammal species composition. This analysis is based on a 252 253 unimodal model and represents mammal species responses to environmental variation in an ordination 254 diagram in a reduced spatial dimension (biplot), where sites without species detections are excluded 255 (Ter Braak, 1986). We limited environmental variables to six covariates showing the strongest 256 association with species richness and species detections in regression analyses: 1) elevation, 2) 257 distance to the nearest road, 3) distance to the nearest settlement, and area of 4) natural forest, 5) 258 Acacia, and 6) non-Acacia. Canonical correspondence analysis is sensitive to rare species, so we used 259 a Chord transformation to reduce the effects of zero-inflated records in the dataset (Ramette, 2007; 260 Borcard et al., 2011). We scaled all covariates as described previously. We conducted a permutational

- 261 multivariate analysis of variance (PERMANOVA) test of the final model to evaluate the overall
- 262 influence of environmental covariates on species composition. Analyses were performed using
- 263 Package vegan (Oksanen, 2018) in the R environment 3.5.3 (R Core Team 2019).

## 264 **3.0 RESULTS**

- 265 3.1 Mammal diversity and land-use types
- 266 Cameras captured 931 total images of native mammal species (Table 2). Individuals that could not be
- identified to species were grouped within genus or family (i.e., otter [n = 4 records], civet [n = 124],
- 268 mousedeer [n = 133], muntjac [n = 10], rat [n = 52]), which resulted in a minimum of 22 species or

species groups for analysis (Table 2). Including species documented outside of the sampling period, a

- total of 34 species or species groups occurred in the study area.
- 271 Photographic capture rates were greatest for squirrels/tree shrews, mouse deer, civets, and bearded
- 272 pigs. Two species were listed as Near Threatened, six species as Vulnerable, one was Endangered
- 273 (proboscis monkey [Nasalis larvatus]), and one was Critically Endangered (Sunda pangolin [Manis
- *javanica*]) (IUCN 2019). Four species were endemic to Borneo: the proboscis monkey, Malay badger
- 275 (Mydaus javanensis), Bornean porcupine (Hystrix crassispinis), and western tarsier (Tarsius
- 276 *bancanus*).

#### 277 Table 2: Mammal species detected at 59 remote camera sites in three different land-use types at

270	Dengkoka i ennisula, Saban, Malaysia, 2010–2017.
270	Bangkoka Paningula Sabah Malaysia 2016 2017

	sampling occasions								
Scientific name	Common name	Natural forest	Acacia	Non-	Total	No. sites	<b>IUCN</b> <sup>a</sup>	Diet <sup>b</sup>	Body mass (kg)
Manis	Sunda	0.2	0.2	0.0	0.1	2	CR	Ι	2.5-7.0
javanica	pangolin								
Nasalis	Proboscis	0.2	0.0	0.0	0.1	1	EN	Н	12.0-24.0
larvatus	monkey								
Sus barbatus	Bearded	5.1	7.6	2.0	5.5	30	VU	0	45.0-200.0
	pig								
	Otter spp.	0.3	0.2	0.3	0.3	3	VU	С	2.5-11.0
Macaca	Pig-tailed	4.5	3.5	0.7	3.4	19	VU	0	4.0–9.0
nemestrina	macaque								
Rusa unicolor	Sambar	1.1	0.8	0.3	0.8	11	VU	Н	200.0
	deer								
Helarctos	Sun bear	0.6 (	0.5	0.3	0.5	7	VU	0	20.0-65.0
malayanus									
Tarsius	Western	0.6	2.1	0.0	1.1	6	VU	С	0.2
bancanus	tarsier								
Ratufa affinis	Pale giant	0.2	0.2	0.0	0.1	2	NT	Н	1.2
	squirrel								
Trachypithecus	Silvered	0.2	0.0	0.0	0.1	1	NT	Н	4.0–6.5
cristatus	langur								
Hystrix	Bornean	0.0	0.2	0.3	0.1	2	LC	0	2
crassispinis	porcupine								
	Civet spp.	3.4	12.9	7.2	7.9	38	LC	0	2.3–4.7

Prionailurus	Leopard			4.4				a	
bengalensis	cat	0.3	1.1	1.6	0.9	11	LC	С	2.5
Macaca	Long-tailed	7.6	2.6	2.6	4.0	27	LO	0	20.70
fascicularis	macaque	7.6	2.6	3.6	4.8	27	LC	0	3.0-7.0
Trichys	Long-tailed	0.2	0.0	0.0	0.1	1	LC	0	2
fasciculata	porcupine	0.2	0.0	0.0	0.1	1	LC	0	2
Mydaus	Malay	0.5	0.2	1.6	0.6	C	IC	0	2.5
javanensis	badger	0.5	0.2	1.0	0.0	0	LC	0	2.5
Echinosorex	Moonrot	0.2	0.2	0.7	0.2	2	IC	0	1
gymnura	Moonrat	0.2	0.2	0.7	0.5	3	LC	0	1
	Mousedeer	15.8	2.0	13	85	24	IC	ц	2343
	spp.	15.8	2.9	4.5	0.5	24	LC	11	2.5-4.5
	Muntjac	0.2	1.2	0.2	0.6	0	IC	П	20.0.28.0
	spp.	0.2	1.5	0.3	0.0	9	LC	п	20.0–28.0
	Squirrel/	28 6	11.2	17.0	10.7	47	IC		0102
	treeshrew	28.0	11.5	17.8	19.7	47	LC	-	0.1–0.2
	Yellow-								
Martes	throated	0.6	1.0	0.0	0.6	9	LC	0	1.4
μανιζαια	marten								
	Rat spp.	5.7	1.0	3.0	3.3	18	-	-	-
	Sum	75.7	49.4	44.1	59.2				

<sup>a</sup> IUCN status (IUCN 2019): CR = Critically Endangered; EN = Endangered; VU = Vulnerable; NT = Near

**280** Threatened; LC = Least Concerned.

<sup>b</sup> Diet guild: I = insectivore; H = herbivore; O = omnivore; C = carnivore.

282

All land-use types had high to moderately high sampling coverage (86–93%), with non-*Acacia* receiving the lowest sampling coverage because of the relatively small sampling area (Figure 2). Estimated species richness based on extrapolation was similar for *Acacia* and natural forest, but about 35% lower in non-*Acacia* plantations. However, confidence intervals overlapped broadly among all 287 three types of land-use and, except for non-Acacia plantations, curves did not reach an asymptote 288 (Figure 2). Thus, estimates of the effective number of species (Table 3; Chao et al., 2014) were considerably higher than those based on extrapolation where sampling intensity was increased to 289 290 approximately twice the largest reference sample size (i.e., n = 24 or the largest number of camera sites 291 in a habitat type; Figure 2). Simulations indicated that sampling intensity would have to increase nearly 292 17-fold (i.e., ~400 camera sites) to reach the estimated number of 51 species in natural forest. Both natural forest and Acacia plantations shared similar values for Shannon diversity and Simpson diversity 293 (Table 3), but non-Acacia plantations scored lower in all measures of diversity. The modest differences 294 between observed and estimated indices for all land-use types suggest that a few abundant species 295 characterized the mammal community and remaining species were rare. 296

Table 3: Effective diversity measures (asymptotic estimates) for three different types of land use in
Bengkoka Peninsula, Sabah, Malaysia, 2016–2017.

	Natural forest		Acc	acia	Non-Acacia		
	Observed	Estimated	Observed	Estimated	Observed	Estimated	
Species richness	20.0	50.7	19.0	39.1	13.0	18.7	
Shannon diversity	12.3	14.4	12.0	14.0	10.3	13.2	
Simpson diversity	9.8	10.2	9.1	9.5	8.4	9.9	

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(B) Sample-size-based Rarefaction and Extrapolation



303

Figure 2: (A) Sample completeness for rarefied samples (solid line) and extrapolated samples (dashed
line) and (B) sample-based rarefaction and extrapolation curves of species richness for three major landuse types as a function of sample size, Bengkoka Peninsula, Sabah, Malaysia, 2016–2017. Reference
samples are represented by solid icons. Shaded areas represent confidence intervals (95%) based on

5,000 bootstrap replicates. Sampling effort for all land-use types exceeded 85%. Curves were
extrapolated to approximately twice the largest reference sample size of 24 obtained for the *Acacia*land-use type.

311

## 312 3.2 Mammal species richness and detections and environmental gradients

Poisson models of species richness were not over- or under-dispersed. Also, variance-inflation values 313 were <10 for all covariates indicating little evidence of strong collinearity. The highest-ranking 314 315 Poisson regression models included area of natural forest and elevation as covariates (Table 4). Model-averaged parameter estimates indicated that the area of natural forest within a 500-m buffer 316 317 (78.5 ha) of a sample site was the best (although weak) predictor of mammal species richness (Table 5, Figure 3A) with a mean species richness of 4.43 (sd = 0.034) across the entire study area. Based on 318 319 our sampling sites, which had a mean area of natural forest of 18.1 ha and mean elevation of 35 m. 320 increasing natural forest by 25% would change predicted species richness from 4.62 (the mean species 321 richness at sampling sites) to 4.74, whereas a 25% decline in natural forest would result in a species 322 richness of 4.51. Thus, our models predict that increases/decreases in area of natural forest may have 323 only a modest (2.4% increase) positive effect on species richness.

324 Poisson models of total mammal detections and threatened mammal detections were over-dispersed,

so we used the negative binomial distribution. Covariates predicting variation in total mammal

detections appeared in four models with  $\Delta AIC_c \leq 2$  (Table 4, Supplementary Figure 1). Mammal

327 detections were greater at distances >1000 m from the nearest edge of *Acacia* plantations and with

decreasing elevation (Table 5, Figure 3B). On average, 17.9 mammal detections occurred across all

329 camera sites, dropping to 14.3 detections at sites inside *Acacia* plantations or within 1000m from their

periphery, and increasing to 22.4 at sites >1000m from the periphery of *Acacia*.

331 Two negative binomial models captured 69% of the total AIC<sub>c</sub> weight of habitat models for threatened

species, averaging 3.4 detections of threatened species per site (Table 4, Supplementary Figure 2).

333 Detections of threatened mammals increased where the area of natural forest and *Acacia* plantations

334 were greater, and in close proximity to roads (Table 5). Based on our sampling sites, which had a

- mean area of *Acacia* of 25.4 ha, increasing the area of *Acacia* or natural forest by 25% would increase
- threatened species detections to 4.15 and 4.1 respectively.

Table 4: Generalized linear regression results of the top 10 *a priori* models to assess habitat variables
associated with mammal species richness (Poisson models), all mammal detections (negative binomial
models), and threatened mammal detections (negative binomial models) at Bengkoka Peninsula, Sabah,
Malaysia, 2016–2017. A detection was one or more mammal species documented at a remote camera
site during a sampling occasion of 24 hr.

Dependent	Model <sup>a</sup>	AICcb	ΔAICc <sup>c</sup>	$\mathbf{ML}^{d}$	<i>wi<sup>e</sup></i>	$\mathbf{D}\mathbf{f}^{\mathrm{f}}$
variable						
Mammal	nat.for	230.5	0.00	1.00	0.19	2
species	null model	231.9	1.40	0.50	0.10	1
richness	elevation + nat.for	232.3	1.85	0.40	0.08	3
	d.road + nat.for	232.7	2.21	0.33	0.06	3
	nat.for	233.2	2.71	0.26	0.05	2
	elevation	233.4	2.95	0.23	0.04	2
	non-Acacia	233.5	3.01	0.22	0.04	2
	d.road	233.7	3.17	0.21	0.04	2
	Acacia	233.7	3.20	0.20	0.04	2
	elevation + d.nat.for	234.5	4.04	0.13	0.03	3
Total	elevation + d.Acacia	414.7	0.00	1.00	0.15	4
mammal	elevation	415.1	0.45	0.80	0.12	3
detections	elevation + Acacia	415.8	1.09	0.58	0.09	4
	elevation + nat.for	416.2	1.56	0.46	0.07	4
	elevation + d.nat.for	416.7	2.02	0.36	0.06	4
	elevation + d.road + d.Acacia	416.7	2.06	0.36	0.06	5
	elevation + d.road	417.0	2.30	0.32	0.05	4
	elevation + d.road + nat.for	417.5	2.87	0.24	0.04	5
	Acacia	417.7	3.05	0.22	0.03	3
	d.Acacia	417.8	3.16	0.21	0.03	3

Threatened	d.road + nat.for + Acacia	252.3	0.00	1.00	0.44	5
mammal	d.road + nat.for + Acacia+ non-Acacia	253.5	1.15	0.56	0.25	6
detections	d.road + nat.for + Acacia + d.nonAcacia	254.7	2.43	0.30	0.13	6
	nat.for +Acacia	257.3	4.99	0.08	0.04	4
	d.road + nat.for + non-Acacia	258.0	5.71	0.06	0.03	5
	d.road + non-Acacia	258.2	5.89	0.05	0.02	4
	nat.for + Acacia + non-Acacia	259.0	6.70	0.04	0.02	5
	nat.for + Acacia + d.non-Acacia	259.5	7.18	0.03	0.01	5
	d.settle + nat.for + Acacia	259.7	7.40	0.03	0.01	5
	non-Acacia	260.1	7.78	0.02	0.01	3

<sup>343 &</sup>lt;sup>a</sup>Habitat variables were area (ha) of natural forest, *Acacia* plantation or non-*Acacia* plantation within a 500-m

- 345 road (d.road), and distance to nearest edge of natural forest, Acacia or non-Acacia (d.nat.for, d.Acacia, d.non-
- 346 Acacia).
- 347  $^{b}$  AIC<sub>c</sub> = Akaike's information criterion adjusted for small *n*.
- 348  $^{c}\Delta AIC_{c}$  = difference in AICc compared with the lowest AIC<sub>c</sub> model.
- 349 <sup>d</sup> ML = model likelihood.
- 350  $^{e}w_i = AIC_c$  model weight.
- **351**  $^{f}$  df = number of parameters.
- 352

<sup>344</sup> buffer (i.e., nat.for, Acacia, non-Acacia), elevation, distance to nearest settlement (d.settle), distance to nearest

**Table 5:** Standardized parameter estimates of model-averaged regression models showing the relative

355 influence of different habitat covariates on mammal species richness (Poisson models), all mammal

- detections (negative binomial models), and threatened mammal detections (negative binomial models)
- at Bengkoka Peninsula, Sabah, Malaysia, 2016–2017.

Dependent	<b>Parameter</b> <sup>a</sup>	Parameter	Standard	<b>CI 7.5%</b> <sup>c</sup>	<b>CI 92.5%</b> <sup>c</sup>
variable		estimate <sup>b</sup>	error		
Mammal	intercept	1.558	0.061	1.469	1.647
species	nat.for	0.110	0.058	0.026	0.194
richness	elevation	-0.039	0.063	-0.131	0.054
Total	intercept	2.832	0.185	2.564	3.100
mammal	elevation	-0.230	0.092	-0.364	-0.096
detections	d.Acacia	-0.346	0.212	-0.656	-0.037
	Acacia	-0.123	0.094	-0.261	0.014
	nat.for	0.093	0.085	-0.031	0.217
Threatened	intercept	0.952	0.130	0.762	1.141
mammal	d.road	-0.426	0.145	-0.638	-0.214
detections	Acacia	0.698	0.301	0.260	1.135
	nat.for	0.775	0.277	0.372	1.178
	non-Acacia	0.417	0.375	-0.130	0.965

<sup>&</sup>lt;sup>a</sup>Habitat covariates that appeared in top models included area (ha) of natural forest, *Acacia* plantation or non-*Acacia* plantation within a 500-m buffer (i.e., nat.for, Acacia, non-Acacia), elevation, distance to nearest road

360 (d.road), and distance to nearest edge of *Acacia* plantation (d.Acacia).

<sup>b</sup>Model coefficients based on standardized covariates values to allow comparison of relative importance.

362 <sup>c</sup>We used 85% confidence intervals following Arnold (2010).



Figure 3. Predictions of species richness based on averaged parameter estimates of regression models,
Bengkoka Peninsula, Sabah, Malaysia, 2016–2017. Predictions have been applied only to parts of the
study area for which land use data were available.

Environmental covariates contributed significantly to patterns of species distributions, with eigenvalues of 0.2185 and 0.1158 explaining 45% and 24% of the variance of the data for the first 2 canonical axes, respectively. The two axes together explained 69% of the variation in species-environment relationships (Table 6). The overall solution of axes in the CCA ordination was statistically significant (Monte Carlo permutation test with 999 permutations under the reduced model, df = 6,  $\chi^2 = 0.483$ , *F* = 1.473, *P* = 0.006).

Table 6: Summary of canonical correspondence analysis (CCA) results and biplot scores for
constraining variables of the first two CCA axes of environmental covariates and mammal species
compositions, at Bengkoka Peninsula, Sabah, Malaysia, 2016–2017.

379

	Canonical axes	
	1	2
Eigenvalue	0.2185	0.1158
% of variance explained	45.26	23.99
Cumulative percentage of variance explained	45.26	69.25
Environmental variable		
Elevation	0.6779	0.3892
Distance to settlement	0.0944	0.0014
Distance to road	0.0883	-0.3682
Natural forest area	0.1809	-0.8600
Acacia plantation area	0.7603	0.3287
Non-Acacia plantation area	-0.7770	0.3991

380

381 A permutation test of the first ordination axis was significant (df = 1,  $\chi^2 = 0.218$ , F = 3.999, P = 0.004).

382 The top three parameters for axis 1, in order of decreasing influence, were the area of Acacia and non-

*Acacia* plantations, and elevation; the area of natural forest explained most of the variation for the
second axis, followed by elevation (Table 6).

Permutation tests revealed three significant environmental factors: elevation (df = 1,  $\chi^2$  = 0.128, F = 385 2.335, P = 0.006), the area of Acacia (df = 1,  $\chi^2 = 0.117$ , F = 2.14, P = 0.007), and the area of natural 386 forest (df = 1,  $\chi^2$  = 0.097, F = 1.770, P = 0.048). Biplot relationships showed that elevation, and areas 387 388 of natural forest, non-Acacia, and Acacia were the most important parameters shaping the overall 389 mammalian community (Figure 4). Four species (Bornean badger, giant squirrel, otters, and leopard cat) 390 and many small mammals (squirrels and tree shrews) used non-Acacia plantations. Detections of otters 391 were few (n = 4) and occurred in all three land-use types (Table 2); its position close to non-Acacia in the biplot may be a function of the large percentage of non-Acacia at the site where one of the otters 392 was detected. The muntjac, sun bear, sambar deer, bearded pig, Sunda pangolin, and pig-tailed macaque, 393 were associated with Acacia plantations. Species such as long-tailed macaques used both non-Acacia 394 395 and natural forest, and civets were common in both Acacia and non-Acacia. Western tarsiers and yellow-throated martens used both Acacia and natural forest. 396



Figure 4: Canonical correspondence biplot (species detections and environmental variables) with six
standardized environmental covariates based on mammal species surveys with remote cameras,
Bengkoka Peninsula, Sabah, Malaysia, 2016–2017. Environmental covariates were area (ha) of natural
forest, *Acacia* plantation, or non-*Acacia* plantation within a 500-m buffer radius (i.e., NAT.FOREST,
ACACIA, NON.ACACIA, ELEVATION), distance to nearest settlement (D.SETT), and distance to
nearest road (D.ROAD). The first two canonical axes explained 69% of the total variance in species
data.

### 407 **4.0 DISCUSSION**

Our primary objective was to assess the relationship between habitat gradients and the community 408 409 composition of mammals in a landscape mosaic of commercial plantations and natural forest. Based on the camera data and additional direct observations, we documented at least 34 species of native 410 411 mammals in the study area, including several threatened species such as sun bears, Sunda pangolin, and 412 sambar (Table S1). This finding contrasts with a 2009 report that considered no large mammals of 413 conservation value to be extant in the area (KWEC, 2009). Rarefaction analyses suggest that species 414 richness in natural forest and Acacia cover types was likely much greater than observed. Species 415 richness of mammals was greatest in natural forest. Mammal detections increased with decreasing elevation and at greater distances from the nearest edge of Acacia plantations. Detections of threatened 416 417 mammals increased with the area of natural forest and Acacia, and closer proximity to roads. Mammal diversity in non-Acacia forests was lowest, and included many small, generalist species. Larger 418 419 mammals, including several threatened species, were associated with areas containing larger stands of Acacia and natural forest. It is not surprising that mammal use of natural forest patches would be high, 420 but our results suggest that Acacia plantations also may possess attributes supporting a diversity of 421 mammal species, including those we defined as threatened based on IUCN criteria. 422

423 Lowland forests support almost 90% of Peninsular Malaysia's mammal species with nearly 2/3 of those 424 species confined to forests below 1,000 m (Lim, 2008). Although the elevational range of our study 425 area was narrow (0–100 m), even minor changes in elevation can have dramatic effects on forest type and management. Indeed, natural forest and coastal mangrove remnants were at low elevations, and 426 427 both were used intensively by mammals. Human access likely played a role as well. Although not all 428 forest compartments were gated, human access to natural forest and Acacia stands was more restricted compared with non-Acacia areas, the majority of which were small holdings under private ownership. 429 Human activities in Acacia plantations were limited mostly to forest management practices. Once 430 seedlings reached 2–3 years, maintenance of the plantation was minimal. Also, apart from two major 431 432 access roads, most plantation roads were subject to low levels of vehicular traffic.

433 Non-Acacia cover types, including young stands of Eucalyptus pellita, were more intensively managed with daily activities such as rubber-tapping, hand-pollination, weeding, fertilizing, and harvesting. Most 434 of these were small holdings close to homesteads, domestic animals, and human settlements, and had 435 no gates or security check points. Furthermore, landowners exercised little control over hunting in 436 437 contrast to land managed by the Acacia plantation companies, which enforced a no-hunting policy. Therefore, our findings likely reflect the combined effects of human disturbance and exploitation on 438 439 vulnerable species. Larger mammals are vulnerable to bushmeat hunting or for trade in wildlife parts 440 (Carter et al., 2017), whereas small mammals such as western tarsiers are removed from the wild for 441 the local and international pet trade (Shekelle and Yustian, 2008). The fact that overall mammal 442 detections and larger-bodied mammals were associated with stands of Acacia and natural forest, and 443 threatened mammal detections were associated with Acacia stands may owe mostly to lower levels of 444 human disturbance in these cover types.

445 Numerous studies have shown the detrimental effects of roads on biodiversity because of increased access to hunters or poachers (Haines et al., 2012), higher rates wildlife-vehicle collisions, and 446 facilitation of habitat loss and fragmentation through human encroachment (Fahrig and Rytwinski, 2009; 447 Van Langevelde, 2009). Our finding that threatened mammal detections were greater near roads was 448 449 therefore unanticipated. However, the road network in the study area consisted mostly of unpaved roads, 450 and apart from two frequently used routes that connected the north-south and east-west regions of the 451 peninsula, vehicular traffic was low. Also, some species habitually use old logging roads and unpaved 452 roads (Slater, 1994; Weckel et al., 2006; Bitetti et al., 2014; Kolowski and Forrester, 2017), possibly 453 because the open habitat facilitates travel, provides resources along road edges, or reduces predation 454 risk.

We did not account for false absences, thus species richness and detection rates among different types of land-use likely are underestimates. Species accumulation curves in *Acacia* and natural forest did not reach asymptotes, suggesting that increased sampling intensity would reveal greater species richness than we observed. Cameras were deployed for 21 sampling occasions at each site, a sampling period that we considered sufficient to capture the occurrence of most mammal species within a 500-m radius 460 of the camera. However, species differ in how they move around within their home range and one 461 camera per sampling location may be insufficient to capture the range of species that use the area, 462 particularly species that are primarily arboreal or fossorial. Increasing the number of cameras per 463 sampling location (multiple camera arrays) and varying camera positions may be more effective to 464 increase detection rates than extending the length of the sampling period, particularly for species with 465 low detection probabilities (O'Connor et al., 2017).

466 We attempted to improve detection rates by using a scent lure. This might have introduced some bias 467 by possibly attracting some species more than others (Kays and Slauson, 2008). Nevertheless, the use 468 of scent lures may enhance detections of rare carnivores and maximize the probability that an animal close to the camera will be photographed (Holinda et al. 2020). We found that a variety of mammals, 469 470 including omnivores and herbivores, investigated the lure. Furthermore, because the quantity of lure was small, it is unlikely that individuals were attracted to the site beyond the estimated sampling radius 471 472 of ~500 m. Detections of some species may have been biased low, also, because of where cameras were placed. We consistently placed cameras about 40 cm from ground level, which may have reduced 473 detectability of primates and species like palm civets that are highly arboreal. For example, we obtained 474 no camera records of the following arboreal species, even though they were occasionally seen or heard: 475 476 red langurs (Presbytis rubicunda), the Bornean gibbon (Hylobates muelleri), slow loris (Nycticebus 477 borneanus), and short-tailed mongoose (Herpestes brachyurus; Table S2).

478 A curious feature of our results was that camera detections of threatened species such as sambar, sun 479 bear, and pig-tailed macaques were greater in natural forest, but ordination and regression analyses, 480 which accounted for the total area of different vegetation types within a 500-m radius around sample 481 sites, associated these species with Acacia forests. The likely explanation is that most natural forest in 482 the study area consisted of narrow strips (20-50 m) along streams and drainages, and cameras placed at these locations had a buffer composed mostly of Acacia. With the exception of bearded pigs, western 483 484 tarsiers, muntjac, civets, and a few other species, detections of all other species were greater in natural 485 forest, indicating that this habitat, including its mosaic nature, may be crucial for maintaining mammal diversity in plantation forests. Acacia mangium is an aggressive invader and without intervention, its 486

regeneration from seeds may ultimately erode and overcome small remnants of natural forest (Koutika
and Richardson 2019). Our results predict that such an outcome may cause reductions in species
richness, including the failure to support some threatened species.

490 As industrial plantations expand, finding ways to mitigate the loss of biodiversity is critical. Mang and 491 Brodie (2015) reported that species richness of multiple taxa in Acacia plantations was about 47% that 492 of intact forests. A notable feature of the Bengkoka study area was its relative isolation from large intact 493 forests, yet species richness (n = 22) was comparable to those reported from studies conducted in much 494 larger plantation landscapes with large proportions of secondary forest and greater sampling intensity 495 (n = 20 species; >5000 sampling occasions; McShea et al., 2009), plantations adjacent to national parks496 (n = 21; Yaap et al., 2016) and surveys in natural forest in Borneo (n = 24-27, Bernard et al., 2013, 2014; Control (n = 24-27)497 n = 15, Mohd-Azlan and Lading, 2006). Samejima et al. (2012) reported 33 species in intact forests, Deramakot, Sabah, but with  $\sim 10 \times$  the sampling occasions of our study. However, none of the surveys 498 499 in natural forests used scent lures, whereas those conducted in plantations did. Although detections were 500 few, several threatened species persist in the Bengkoka study area, including the Critically Endangered 501 Sunda pangolin, Endangered proboscis monkey, Vulnerable western tarsier and Near-Threatened 502 silvered langur. Apart from this study, the western tarsier was reported only in Samejima et al.'s (2012) study. Remarkably, Bengkoka peninsula is about 1/20<sup>th</sup> the size of the 4900 km<sup>2</sup> area of Sarawak's 503 Planted Forests Project. The latter retains ~39% of its area in secondary forest (McShea et al., 2009) in 504 stark contrast with <18% in Bengoka. Patches of mangrove forests occurred along the Bengkoka 505 coastline, including fringes of the study area, which may have influenced the persistence of the 506 507 proboscis monkey, silvered langur, western tarsier, and many other species that are rare in inland forests. 508 Although we did not include distance to the coastline as a covariate in our analyses, prediction maps 509 for species richness and overall mammal detections indicated higher values for areas close to the coastal 510 mangrove habitat.

About 40 years ago, substantial areas of Bengkoka peninsula were converted to industrial plantations,
but we have no data on faunal communities at the time. At the time of our study, the landscape was
dominated by *Acacia mangium*, but contained patches of oil palm, rubber, and rice plantations,

514 fragments of secondary forest, coastal mangroves, and young *Euclayptus pellita* stands. The area still supports valuable elements of mammal diversity including a number of threatened species that so far 515 have persisted and adapted to substantial landscape changes over four decades. Our study demonstrates 516 that natural forest patches are important for almost all native mammals, but the remnants in this 517 518 managed landscape were sparse. Retaining and expanding these areas through restoration will positively improve mammal diversity and persistence. Restoration of fallow areas with native trees such as fig 519 520 (Ficus spp.), oak (Lithocarpus spp.,), Castanopsis spp., and Artocarpus dadah would improve habitat conditions for a range of frugivores, including sun bears. 521

522 Since the 1980s, Acacia mangium has been the species of choice for commercial timber plantations in Malaysian Borneo with the largest area of planted forests in the state of Sarawak (403,017 ha), followed 523 by Sabah (300,521 ha; Lee, 2018). Plantations are much more extensive in Indonesia and Vietnam 524 (McBeth, 2014; Kien et al., 2014). Fungal diseases with no effective means of control now pose the 525 526 most significant challenges to Acacia plantations in Southeast Asia, with large landholdings already 527 converted to *Eucalyptus pellita* in Indonesia and transitions underway in Sabah and Sarawak (Lee 2018), including the Bengkoka Peninsula. Eucalyptus stands may ultimately prove suitable for species that 528 currently use Acacia stands, such as bearded pig, western tarsier, sambar, and sun bear. Data on 529 530 mammalian diversity in Acacia and Eucalyptus plantations in Borneo remain sparse. Longitudinal studies that monitor wildlife responses and population change, rather than presence/absence, will help 531 evaluate the resilience of different species of mammals to changes in managed forest landscapes. The 532 533 configuration of natural forest remnants, also, and their connectivity to source habitats such as national 534 parks and forest reserves, have an important influence on mammal communities in plantation forests 535 (e.g., Cheyne et al., 2016, Yaap et al., 2016). Such information will be crucial to facilitate management 536 objectives for conserving mammal diversity.

The tendency for threatened mammals to be found near roads in the study area merits attention. The current road network consists primarily of unpaved roads with limited or restricted use. Informal interviews with local villagers confirmed that wildlife hunting for sambar deer, bearded pig, and sun bear occurred in the study area and were traded in Bengkoka Peninsula. On plantation lands, enforcing speed limits near roads, patrolling, vehicle checks at entrances, and spot-checking for snares near roads may help mitigate these risks. Such enforcement may be difficult in other parts of the peninsula with public access. The chief challenge of roads facilitating poaching thus remains and is emblematic of one of the greatest threats to wildlife in Southeast Asia (Corlett, 2007; Gray et al., 2018). Public awareness and outreach campaigns will be extremely important to build local support to conserve the mammalian biodiversity that still exists in the area.

547

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771

# **Supplementary Information**

Table S1. Species of mammals detected with remote cameras (2016–2017) and field surveys,

- 773 Bengkoka Peninsula, Sabah, Malaysia, 2016–2018. IUCN status (IUCN 2019): CR = Critically
- Endangered; EN = Endangered; VU = Vulnerable; NT = Near Threatened; LC = Least Concerned.

			IUCN		Body mass
	Family/ Species	Common name	status	Diet	(kg)
	Bovidae				
1	Bubalus bubalis	Feral water buffalo	-	Н	950.0
	Canidae				
2	Canis lupus familiaris	Feral dog	-	0	15.0
	Cercopithecidae				
3	Nasalis larvatus	Proboscis monkey	EN	Н	18.0
4	Macaca nemestrina	Pig-tailed macaque	VU	Н	6.5
5	Macaca fascicularis	Long-tailed macaque	LC	0	5.0
6	Presbytis rubicunda °	Red langur <sup>c</sup>	LC	Н	6.3
7	Trachypithecus cristatus	Silvered langur	NT	Н	5.3
	Tarsiidae				
8	Tarsius bancanus	Western tarsier	VU	С	0.2
	Cervidae				
9	Rusa unicolor	Sambar deer	VU	Н	200.0
10	Muntiacus muntjak	Red muntjac	LC	Н	24.0
	Erinaceidae				
11	Echinosorex gymnura	Moonrat	LC	С	1.0
	Felidae				
12	Pardofelis marmorata <sup>b</sup>	Marbled cat <sup>b</sup>	NT	С	3.8
13	Prionailurus bengalensis	Leopard cat	LC	С	2.5
14	Felis catus	Feral cat	-	С	4.0
	Herpestidae				
15	Herpestes spp. <sup>d</sup>	Mongoose species <sup>d</sup>	NT	С	1.3

	Hylobatidae				
16	Hylobates muelleri <sup>a</sup>	Bornean gibbon <sup>a</sup>	EN	Н	6.0
	Hystricidae				
17	Hystrix crassispinis	Bornean porcupine	LC	0	2.0
18	Trichys fasciculata	Long-tailed porcupine	LC	0	2.0
	Lorisidae				
19	Nycticebus menagensis <sup>d</sup>	Slow loris <sup>d</sup>	VU	0	0.5
	Manidae				
20	Manis javanica	Sunda pangolin	CR	Ι	4.8
	Mephitidae				
21	Mydaus javanensis	Malay badger	LC	0	2.5
	Muridae				
22	-	Rat species	-	-	-
	Mustelidae				
23	Aonyx cinereus	Small-clawed otter	VU	С	3.3
24	Lutrogale perspicillata	Smooth-coated Otter	VU	С	9.0
25	Martes flavigula	Yellow-throated marten	LC	0	1.4
	Nycteridae				
26	-	Bat species	-	-	-
	Sciuridae				
27	Lariscus hosei	Four-striped ground squirrel	LC	Н	0.2
28	Ratufa affinis	Pale giant squirrel	NT	Н	1.2
29	Callosciurus notatus	Plantain squirrel	LC	0	0.2
	Suidae				
30	Sus barbatus	Bearded pig	VU	0	122.5
	Tragulidae				
31	Tragulus spp.	Mousedeer species	LC	Н	3.3
	Tupaiidae				
32	Tupaia glis	Common treeshrew	LC	Ι	0.2
33	Tupaia gracilis	Slender treeshrew	LC	Ι	0.1

# Table S1. (Continued)

			IUCN	Body mass
Fan	nily/ Species	Common name	status Diet	( <b>kg</b> )
34	Tupaia minor	Lesser treeshrew	LC	0 0.1
	Ursidae			
35	Helarctos malayanus	Sun bear	VU	O 42.5
	Viverridae			
	Paradoxurus			
36	hermaphroditus	Common palm civet	LC	0 2.5
37	Viverra tangalunga	Malay civet	LC	0 3.9

<sup>a</sup> call heard

<sup>b</sup> detected by camera trap after the sampling period

<sup>c</sup> sighted

<sup>d</sup> carcass found



**SFigure 1.** Predictions of mammal detections based on averaged parameter estimates of regression
models, Bengkoka Peninsula, Sabah, Malaysia, 2016–2017. Predictions have been applied only to parts
of the study area for which land use data were available.



782 SFigure 2. Predictions of threatened mammal detections based on averaged parameter estimates of
783 regression models, Bengkoka Peninsula, Sabah, Malaysia, 2016–2017. Predictions have been applied
784 only to parts of the study area for which land use data were available.

## **Declaration of interests**

 $\boxtimes$  The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

□The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

Supplementary Material

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