



THE UNIVERSITY *of* EDINBURGH

Edinburgh Research Explorer

Free-roaming dog population dynamics in Ranchi, India

Citation for published version:

Evans, MJ, Gibson, A, Fielding, H, Ohal, P, Pandey, P, Kumar, A, Singh, SK, Airikkala-Otter, I, Abela-Ridder, B, Gamble, L, Handel, I, Bronsvoot, BMDC, Mellanby, RJ & Mazeri, S 2022, 'Free-roaming dog population dynamics in Ranchi, India', *Research in Veterinary Science*, vol. 143, pp. 115-123.
<https://doi.org/10.1016/j.rvsc.2021.12.022>

Digital Object Identifier (DOI):

[10.1016/j.rvsc.2021.12.022](https://doi.org/10.1016/j.rvsc.2021.12.022)

Link:

[Link to publication record in Edinburgh Research Explorer](#)

Document Version:

Peer reviewed version

Published In:

Research in Veterinary Science

General rights

Copyright for the publications made accessible via the Edinburgh Research Explorer is retained by the author(s) and / or other copyright owners and it is a condition of accessing these publications that users recognise and abide by the legal requirements associated with these rights.

Take down policy

The University of Edinburgh has made every reasonable effort to ensure that Edinburgh Research Explorer content complies with UK legislation. If you believe that the public display of this file breaches copyright please contact openaccess@ed.ac.uk providing details, and we will remove access to the work immediately and investigate your claim.



1 Free-roaming dog population dynamics in 2 Ranchi, India

3

4 M.J. Evans*¹, A. Gibson^{2,3}, H. Fielding¹, P Ohal⁴, P Pandey⁵, A Kumar⁴, SK Singh⁴, I Airikkala-Otter⁶, B.
5 Abela-Ridder⁷, L. Gamble³, I. Handel¹, B.M.d.C. Bronsvort^{1,2}, R.J. Mellanby^{1,2}, S. Mazeri^{1,2}

6 *Corresponding Author: mike.evans@ed.ac.uk

7 1. The Royal (Dick) School of Veterinary Studies, The University of Edinburgh, Roslin,
8 Midlothian, UK

9 2. The Roslin Institute, The University of Edinburgh, Roslin, Midlothian, UK

10 3. Mission Rabies, Cranborne, Dorset, UK

11 4. Hope & Animal Trust, Ranchi, Jharkhand, India

12 5. Department of Agriculture Animal Husbandry and Cooperative, (Animal Husbandry Division)
13 Govt. of Jharkhand, India

14 6. WVS India, Gramya Bhavan/RDO-building complex, Aruvankadu, 643202 Nilgiris district,
15 Tamil Nadu, India

16 7. Department for the Control of Neglected Tropical Diseases, World Health Organization,
17 Genève, Switzerland

18

19 Abstract

20 Rabies causes approximately 20,000 human deaths in India each year. Nearly all of these occur
21 following dog bites. Large-scale, high-coverage dog rabies vaccination campaigns are the
22 cornerstone of rabies elimination strategies in both human and dog populations, although this is
23 particularly challenging to achieve in India as a large proportion of the dog population are free-
24 roaming and unowned. Further, little is known about free-roaming dog ecology in India which makes
25 defining optimum vaccination strategies difficult. In this study, data collected using a mobile phone
26 application during three annual mass vaccination and neutering (surgical sterilisation of both males
27 and females) campaigns of free-roaming dogs in Ranchi, India (during which a total of 43,847
28 vaccinations, 26,213 neuter surgeries and 28,172 re-sight observations were made) were
29 interrogated, using two novel approaches to estimate the proportion of neutered dogs that were lost
30 from the city (assumed due to mortality or migration) between campaign years. Analysis revealed high
31 losses of neutered dogs each year, ranging from 25.3% (28.2 – 22.8) to 55.8% (57.0-54.6). We also
32 estimated that the total population declined by 12.58% (9.89 – 15.03) over the three-year period. This
33 demonstrates that there is a high turnover of free-roaming dogs and that despite neutering a large
34 number of dogs in an annual sterilisation campaign, the decline in population size was modest over a
35 three-year time period. These findings have significant implications for the planning of rabies
36 vaccination campaigns and population management programmes as well as highlighting the need for
37 further research into the demographics of free-roaming, unowned dogs in India.

38 Key words: Neutering; Dog Demography; Population Dynamics; India; Rabies.

39 Introduction

40 Indian cities are home to large numbers of free-roaming dogs, the majority of which are unowned
41 (Belsare and Gompper, 2013). These dogs can be a common source of human-animal conflict and
42 are responsible for approximately 75% of human dog bite injuries (Srinivasan et al., 2019; Sudarshan
43 et al., 2007). This presents an enormous risk for rabies transmission, as dogs are the principal
44 reservoir of the rabies virus, and it has been estimated that over 95% of human rabies cases in India
45 are caused by dog bites (Fooks et al., 2014; Sudarshan et al., 2007). Human rabies is almost
46 invariably fatal and approximately one third of the 60,000 people who die from rabies annually are
47 in India (Fooks et al., 2014; Sudarshan et al., 2007).

48 Mass dog vaccination campaigns are the cornerstone of rabies control, and have successfully
49 reduced the incidence of human rabies in many regions (World Health Organization, 2018). Whilst
50 achieving high vaccination coverage of free-roaming dogs in localised areas has been demonstrated
51 (Gibson et al., 2015), these campaigns require substantial resources and can be difficult to
52 implement across larger areas (Kakkar et al., 2012). Consequently, vaccination programmes need to
53 be as efficient as possible to minimise inputs and maximise campaign efficiency.

54 Although vaccination coverage of over 40% should be sufficient to limit the spread of rabies in the
55 dog population, in practice, much higher levels of coverage are recommended for annual mass
56 rabies vaccination campaigns to allow for population turnover (Bilinski et al., 2016; Coleman and
57 Dye, 1996; Davlin and VonVille, 2012; Hampson et al., 2015, 2009; Kitale et al., 2002; Lembo et al.,
58 2010; World Health Organization, 2018). Clearly, understanding population dynamics in these dog
59 populations is therefore crucial to developing effective vaccination programmes. In an effort to
60 reduce both the population size and turnover of free roaming dogs, many rabies vaccination
61 campaigns have utilised neutering (surgical sterilisation of both males and females) in addition to
62 vaccination. However, the ability of neutering programs to achieve these population management
63 goals is unclear (Reece et al., 2013; Reece and Chawla, 2006; Yoak et al., 2014), and specifically in

64 the context of rabies control, the relative value of this approach has been highly controversial
65 (Cleaveland et al., 2014; Collinson et al., 2020; Knobel et al., 2017; Reece et al., 2008; Reece and
66 Chawla, 2006; Rowan et al., 2014; Yoak et al., 2014). Populations have been well-described in sub-
67 Saharan Africa, where many free-roaming dogs are owned. Yet few empirical studies describe
68 populations over multiple years in India, where a larger proportion of free-roaming dogs are
69 unowned and therefore may be more difficult to access (Reece et al., 2008).

70 There are relatively few empirical studies assessing the ecology of free-roaming dogs in India, and
71 those that do exist often study relatively small populations of dogs (Pal et al., 1998; Pal, 2001; Reece
72 et al., 2008). Greater understanding of dog demography and the dynamics of population turnover, in
73 a variety of locations across India and worldwide, is vital for informing vaccination strategies and
74 assessing the relative value of neutering free-roaming dogs.

75 This study utilises data captured using the Mission Rabies Smartphone application (MRApp), which
76 has allowed large volumes of geo-referenced data to be gathered (and output in a readily usable
77 format for analysis) during three annual vaccination and neutering campaigns in Ranchi city
78 (Jharkhand, India) that involved the delivery of 43,847 vaccinations, 26,213 neuter surgeries and
79 28,172 re-sight observations. Through the analysis of this dataset, we describe the demographics of
80 free-roaming dogs in Ranchi over a period of three years by addressing three key research questions.
81 Firstly, how large is the free-roaming dog population and did this change over the course of the three
82 years; secondly, what proportion of dogs are neutered prior to and after the end of each campaign
83 year; and thirdly, therefore what proportion of the neutered dogs were lost from the population (by
84 mortality plus migration) between each campaign. As we seek to explain the observed results, we
85 also utilise the data to assess for sex bias in the neutering campaigns and for temporal variation in
86 the proportion of dogs estimated to be under 12 weeks of age.

87 Material and methods

88 Study area

89 Ranchi (23°22'N, 85°20'E) is the capital city of the North East Indian state of Jharkhand, with an
90 urban human population of 1.07 million people (*Census of India, 2011*). The city is divided into 55
91 administrative wards (Fig.1).

92 Vaccination and Neutering Campaigns

93 A local non-government organisation, HOPE & Animal Trust, has been operating an annual rabies
94 vaccination and neutering campaign for free-roaming dogs in the city since 2008 in collaboration
95 with the local municipal authority. In the years 2015, 2016 and 2017, these services were expanded
96 in collaboration with Mission Rabies. In each of these three campaign years, each ward within Ranchi
97 was covered sequentially, using a vaccinate-assess-move technique described in Gibson et al. (2015).
98 This technique was divided into two phases for each ward: Phase 1, in which dogs were captured
99 and then either vaccinated or vaccinated and neutered; and Phase 2, in which a re-sight survey to
100 assess vaccination coverage was completed. These phases were repeated as necessary until the
101 estimated vaccination coverage was greater than 70%, before moving on to the next ward.

102 Phase 1: capture, vaccinate, neuter, mark and release

103 Every street within a ward was walked by a team consisting of one veterinarian, two veterinary
104 assistants and 4 dog-catchers. These walks were conducted between dawn and 11am or between
105 3pm and dusk in order to avoid the drop in dog activity that has been described in unowned Indian
106 dogs around midday (Kumar Swain and Pati, 2019), whilst avoiding night time due to decreased dog
107 visibility. Capture was attempted for all free-roaming dogs sighted on this walk, using either manual
108 restraint for dogs that voluntarily approached the team, or using a butterfly net for dogs that could
109 not be manually restrained. In cases where a dog struggled within the net, restraint was assisted
110 using a Y-pole and a towel placed over the dog's head. No dog bites were received by handlers

111 during any capturing events. Records were not made for occurrences when dogs were sighted but
112 capture was not possible. Captured dogs that were already neutered (assessed by the presence of an
113 ear notch) were vaccinated intramuscularly or subcutaneously (Nobivac® Rabies, MSD Animal
114 Health), marked on the head with non-toxic paint and released. Entire animals (lacking an ear notch
115 or with visible testicles) estimated to be over 16 weeks of age (estimated by visual appearance) were
116 transported to the HOPE & Animal trust veterinary clinic where they were surgically neutered, the
117 tip of one ear was surgically removed (to enable permanent identification of neuter status),
118 vaccinated and marked as above, and then released back into the area where they were captured.
119 Dogs of all ages were vaccinated in line with recommendations for canine mass vaccination
120 campaigns (World Health Organization, 2018). At the time of capture, an individual data record was
121 made for each dog, utilising the Mission Rabies App (Gibson et al., 2018). This record included the
122 following data, which was used for the subsequent analysis in this study: Global Positioning System
123 (GPS) location, time and date, sex, neuter status, age (<12 weeks or >12 weeks, estimated by visual
124 appearance). Vaccination and neutering were also offered to the owners of any confined dogs
125 encountered, although these animals were excluded from our analysis.

126 Phase 2: re-sight survey

127 Once all neutered dogs had been returned to the population (within 2 – 5 days), dog sight surveys
128 were conducted by motorbike, using GPS and internet mapping to follow a pre-determined route in
129 order to cover each street within a ward. Surveys were conducted at the same time of day as in
130 Phase 1 and the same data was collected, additionally recording vaccination status (assessed by the
131 presence of the marker paint). If the percentage of dogs with marker paint sighted in this survey was
132 below 70%, both Phase 1 and Phase 2 were repeated, in order to ensure that this vaccination target
133 was achieved without local geographical heterogeneity, which could compromise rabies elimination
134 efforts (Ferguson et al., 2015). When wards required repetition of Phases 1 and 2, only data
135 captured during the final survey were used for data analysis (in order to prevent counting dogs as
136 'unmarked' that would then go on to be marked in the repetition of Phase 1). Further details on this

137 'vaccinate-assess-move' technique, including maps of capture and survey routes, may be found in
138 Gibson et al. (2015).

139 Data Processing

140 Data were exported from the Mission rabies App as CSV files. Data processing, presentation and
141 analysis were performed using R (version 3.6.0) in R Studio (version 1.2.1335) (R Core Team, 2017)
142 using the following packages: binom (Dorai-Raj, 2014), cowplot (Wilke, 2018), ggmap (Kahle and
143 Wickham, 2013), maps (Becker et al., 2018a), mapdata (Becker et al., 2018b), maptools (Bivand and
144 Lewin-Koh, 2019), rgdal (Bivand et al., 2019), rsample (Kuhn and Wickham, 2017), and tidyverse
145 (Wickham, 2017).

146 Estimating Population Size

147 Using data from Phase 1 and 2 in a capture-mark-resight framework, the population size (N) at the
148 start of each campaign year was estimated using the Chapman estimator (Chapman, 1951):

$$149 \hat{N} = \frac{(n_1 + 1)(m_2 + 1)}{m_1}$$

150 Where:

- 151 • n_1 was the number of dogs marked as vaccinated in Phase 1
- 152 • n_2 was the total number of dogs recorded as seen in the final survey of Phase 2
- 153 • m_2 was the number of marked dogs recorded in the final survey of Phase 2

154 Estimating Neuter Coverage

155 The neuter coverage prior to each campaign year was estimated using Phase 1 data, whereas post-
156 campaign neuter coverage was estimated using data captured in the final Phase 2 surveys. 95%
157 confidence intervals were constructed for each of these point estimates using the Binomial Exact
158 method.

159 [Estimating the Neutered Population Size](#)

160 We used the number of dogs neutered during the campaigns to estimate changes in the number of
161 neutered dogs between the end of one campaign and the start of the next. We estimated the
162 neutered population via two methods in order to assess possible differences between catching and
163 sight survey methods (Phase 1 and Phase 2).

164 Method 1 used neuter coverage estimates from Phase 1 surveys and extrapolated these forwards to
165 estimate post-campaign numbers (adding the number of dogs neutered during the campaign), thus
166 estimating the lowest number of neutered dogs likely to be present. Method 2 used neuter coverage
167 from phase 2 surveys and extrapolated these backwards to estimate pre-campaign numbers
168 (subtracting the number of dogs neutered during the campaign).

169

Estimated number of neutered dogs	Method 1	Method 2
Pre-campaign	$N \times \text{Phase 1 neuter coverage}$	$(N \times \text{Phase 2 neuter coverage})$ - number of dogs neutered in campaign
Post-campaign	$(N \times \text{Phase 1 neuter coverage}) +$ number of dogs neutered in campaign	$N \times \text{Phase 2 neuter coverage}$

170

171 [Estimating Losses of Neutered Dogs between Campaign Years](#)

172 The percentage changes in the number of neutered dogs between the end of one campaign year and
173 the start of the next campaign year were calculated for each method respectively. These estimates

174 assume that there were no other sources of neutered dogs (i.e. no inward migration, no other
175 neutering clinics, and no release of previously confined neutered dogs).

176 Bootstrap Confidence Intervals

177 Both Phase 1 and Phase 2 datasets were replicated 1000 times by resampling with replacement.
178 Each of the calculations described above was repeated for each dataset replicate. The median value
179 from these replicates was utilised as the point estimate for the population sizes and percentage
180 changes. The 2.5th and 97.5th percentiles of the replicates were utilised for the corresponding 95%
181 confidence intervals.

182 Ethical Review

183 Ethical approval for this research was granted by University of Edinburgh’s Veterinary Ethical Review
184 Committee (ref: 64/15). All field components of the study were undertaken as part of rabies control
185 and dog population management programmes through a Memorandum of Understanding between
186 Hope & Animal Trust and the Ranchi Municipal Corporation and were in accordance with the Animal
187 Welfare Board of India regulations on animal birth control.

188 Results

189 Population Estimates

190 Population estimates ranged from 42,038 in 2015 to 36,789 in 2017. There was a progressive decline
191 in the total dog population through the three campaign years, with the total population size in 2017
192 12.58% (CI: 9.89-15.03) lower than in 2015 (Table 2).

193 *Table 2 Estimated total population of unowned dog population in each campaign year and percentage change in unowned*
194 *dog population relative to 2015*

Campaign Year	Estimated Population of Unowned Dogs (95% CI)	Percentage change relative to 2015 (95% CI)
------------------	--	--

2015	42,038 (41,129 – 42,997)	
2016	40,693 (40,058 – 41,450)	-3.22 (-0.16 – -5.92)
2017	36,789 (36,121 – 37,380)	-12.58 (-9.89 – -15.03)

195

196 **Neutering Percentage**

197 Across the three campaign years a total of 26,213 dogs were surgically neutered. As a result, after
 198 each campaign more than 70% of the dogs observed in the Phase 2 surveys were neutered (Table 1),
 199 with neutering percentages of over 60% observed in the vast majority of individual wards (Figure 3).
 200 However, there were large decreases in neuter coverage between the end of one campaign and
 201 start of the next (Table 1). These large decreases in neuter coverage were also observed at a ward
 202 level (Figure 2).

203 *Table 1 For each campaign year: the percentage of dogs captured during Phase 1 that were already neutered; the number*
 204 *of dogs on which surgical neutering was performed; and the percentage of dogs observed in Phase 2 that were neutered.*

Campaign Year	Percentage of Dogs Neutered Pre-Campaign - Phase 1 (95% CI)	Total Number of Dogs Neutered (Female/Male)	Percentage of Dogs Neutered Post-Campaign – Phase 2 (95% CI)
2015	42.0 (41.4 – 42.7)	7522 (3832/3690)	72.9 (72.0 – 73.8)
2016	39.7 (39.1 – 40.2)	9790 (4882/4908)	70.1 (69.2 – 71.0)
2017	31.2 (30.6 – 31.7)	8901 (4394/4507)	82.1 (81.3 – 83.0)

205

206 **Neutered Dog Losses**

207 Between the end of the 2015 campaign and the start of the 2016 campaign, both methods
 208 estimated substantial decreases in the number of neutered dogs (9,094 (CI: 8,453 – 9,729) dogs by
 209 method 1; 11,929 (CI: 10,859 – 12,954) dogs by method 2; Figure 3), amounting to a 36.0% (CI: 37.9-
 210 33.9) and 38.9% (CI: 41.4 – 36.1) reduction in neutered dogs by methods 1 and 2 respectively (Table
 211 4). This trend was replicated between the end of the 2016 campaign and the start of the 2017
 212 campaign (14,471 (CI: 14030 – 14973) dogs by method 1; 7,243 (CI: 6,410 – 8,157) dogs by method
 213 2; Figure 3), though there was a greater difference between the two methods. Between 2016 and
 214 2017, Method 2 estimated a 25.3% reduction in neutered dogs (CI: 22.8 – 28.2); whereas Method 1
 215 estimated a reduction in neutered dogs of 55.8% (CI: 54.6 – 57.0) during this period (Table 3).

216 *Table 3 Percentage change (95% CI) in the number of neutered unowned dogs between campaigns, estimated by both*
 217 *methods.*

	Percentage decrease (95% CI) in the number of neutered dogs between campaigns	
	Method 1	Method 2
2015-2016	36.0 (33.9 – 37.9)	38.9 (36.1 – 41.4)
2016-2017	55.8 (54.6 – 57.0)	25.3 (22.8 – 28.2)

218 **Sex Bias and Age Structure**

219 Similar proportions of male and female dogs underwent neutering surgery in each campaign year
 220 (Table 1) and the post-campaign neuter coverage after each of the three campaign years (estimated
 221 from the Phase 2 re-sight surveys) were similar for both male and female dogs (Figure 4). This
 222 indicates that there was no sex bias in the overall high neutering coverage achieved in all years. In
 223 contrast, the pre-campaign neuter coverage was higher for male dogs than female dogs. There was a

224 clear seasonal pattern to the population age structure, with the proportion of dogs under 12 weeks
225 old peaking between November and March in all three years (Figure 5).

226 Discussion

227 This study demonstrates that through neutering large numbers of free-roaming dogs across the city
228 it was possible to consistently achieve neutering coverages of at least 70% year after year. In
229 addition, repeating this high neutering coverage over three consecutive years was associated with a
230 12.58% (9.89 – 15.03) reduction in the estimated population of free-roaming dogs within the city
231 over the three-year study period. This population decrease was less than that observed in studies
232 with comparable neuter coverage: a 28% population decline was observed in Jaipur by Reece and
233 Chawla (2006) over a five-year period; and a 27.7 – 52.2% decline was observed in some areas in
234 Jodhpur by Totton et al. (2010), over a two-year period. However, Totten et al (2010) also describe
235 two areas with comparable neuter coverage that showed no significant population decline,
236 illustrating the complexity of population dynamics and localised variation in the impacts of neutering
237 campaigns. The substantial decrease in the number of neutered dogs at the start of each campaign
238 season in this study population suggests high mortality or outward migration of neutered dogs and
239 indicates that without continued efforts, the effect of neuter and vaccination campaigns will rapidly
240 decline.

241 Substantial reductions in the number of neutered dogs between campaign years were estimated
242 using both methodologies (Fig. 3, Table 3). Whilst the two methods give similar estimates for dog
243 losses between 2015 and 2016, the losses between 2016 and 2017 estimated are noticeably greater
244 when estimated by Method 1 than by Method 2. Widyastuti et al. (2015) demonstrated that dogs in
245 Indonesia learned to avoid capture in subsequent campaigns, and this effect may explain the
246 disparity between Method 1 and Method 2 here. Specifically, dogs captured and neutered in 2015
247 and 2016 may have learned from that experience and been more averse to future capture in
248 subsequent years. Therefore the pre-campaign estimates of neutered dog percentages (Phase 1)

249 may be an under-estimate compared to the capture-independent post-campaign surveys (Phase 2).
250 Given that Method 1 utilises the pre-campaign estimates, whereas Method 2 utilises the post-
251 campaign estimates, we propose that Method 1 is more vulnerable to capture bias, and that this
252 may explain the apparent increased turnover seen in 2016 when assessed by Method 1.

253 Furthermore, the size of this capture bias may vary between the sexes, given the lower proportion of
254 female dogs captured in Phase 1 that were neutered (Fig.4) compared to male dogs captured in
255 Phase 1. Alternatively, this could indicate that mortality is higher in neutered females compared to
256 neutered males; however, this seems unlikely considering the proportions of male and female dogs
257 that were neutered during the campaigns were very similar (Table 1), and the estimated proportions
258 of male and female dogs that were neutered were more similar in the Phase 2 sight surveys than in
259 the Phase 1 capture surveys (Figure 4). This reiterates the value of population estimators that do not
260 rely on capturing in future demographic studies, as has been identified in other studies (Belo et al.,
261 2015; Meunier et al., 2019; Tiwari et al., 2019) and also re-emphasises the potential value of oral-
262 baited rabies vaccine administration for reaching capture-averse free-roaming dogs (Gibson et al.,
263 2019).

264 Mean losses of neutered dogs between years in our study are around 39%. Given that there are no
265 natural barriers to dog migration at the perimeter of Ranchi city, and there are peri-urban areas
266 surrounding the city, the high losses identified in this study are likely be a combination of both
267 mortality and outward migration. Pal (2001) reported 24% mortality in dogs over 1 year of age,
268 whilst Reece et al. (2008) estimated 30% annual mortality for female neutered dogs over 1 year of
269 age. The annual losses in this study are slightly higher than these previous estimates of mortality in
270 Indian free-roaming dogs, but are comparable given that our estimates also include dogs between 4
271 and 12 months of age, a demographic shown to have a much higher mortality rate in free-roaming
272 dogs in West Bengal (Pal, 2001).

273 Establishing the rate at which dogs are lost from the population is crucial to the implementation of
274 successful rabies vaccination campaigns, facilitating calculation of the optimal interval between
275 vaccination campaigns and the level of vaccination required to maintain coverage above the critical
276 40% threshold (Hampson et al., 2009). Research based in owned, free-roaming dogs in sub-Saharan
277 Africa and Indonesia estimate that vaccination coverage of 60-70% is sufficient when annual crude
278 mortality (including all ages of dog) is 56.8% (Conan et al. (2015). Vaccination coverage of this
279 magnitude has been achieved in Ranchi, as was previously reported by Gibson et al. (2015).
280 However, given our estimated losses only include neutered dogs (and only dogs estimated to be
281 over 16 weeks old were sent to be neutered), crude mortality in the general population (including
282 entire dogs and very young puppies) is likely to be higher, which might result in vaccination coverage
283 falling below the 40% critical threshold before the next annual campaign is conducted. It is therefore
284 vital that further research is conducted into the longevity of free-roaming, unowned dogs in India,
285 e.g. longitudinal studies tracking individual dogs with high granularity, as has been performed for
286 free-roaming, owned dogs in Tanzania (Czupryna et al., 2016), and in South Africa and Indonesia
287 (Morters et al., 2014). In addition, given the potential role of dog migration, there is also a need for
288 further research tracking individual free-roaming dogs in India to examine their geographical ranges,
289 as has been performed in Chile (Pérez et al., 2018) and Australia (Dürr and Ward, 2015; Hudson et
290 al., 2017; Meek, 1999).

291 The rate of population decline was significantly lower than the rate at which neutered dogs were
292 lost, indicating significant replenishment of entire dogs in the city. Despite high levels of neuter
293 coverage achieved within the city, after each campaign around 15 – 25% of female dogs (estimated
294 over 12 weeks of age) were entire. Considering the high individual fecundity of female dogs reported
295 by Reece et al. (2008), with each female producing an average of 8 pups per year, this is likely to be
296 the major source of population replenishment. In addition, new dogs may have been added via
297 inward migration or the release of confined, owned dogs or their puppies. During the ~11 months
298 between annual campaigns in each ward, substantial numbers of puppies that were not yet born or

309 too young for surgery in the previous campaign have time to reproduce at least once, contributing to
300 the entire population. Considering this, if resources allow, planning neutering interventions at
301 shorter intervals whilst entire dog numbers are still low, may capitalise on previous efforts.

302 Furthermore, we observed seasonal patterns in the population age structure (Figure 5), that
303 correspond to seasonal reproduction reported previously in free-roaming Indian dogs (Chawla and
304 Reece, 2002; Fielding et al., 2021; Pal, 2003, 2001; Reece et al., 2008; Totton et al., 2010). Age
305 estimation was performed by visual assessment, as has been reported in previous canine
306 demographic studies in India (Pal 2001, 2003; Totton et al., 2010). This method cannot give precise
307 age estimates; however estimation was performed by a small team of consistent observers,
308 therefore we do not believe this impacts the validity of this observed temporal variation. Given
309 these seasonal peaks in the proportion of puppies observed, targeting campaigns after these peaks
310 from February to April when puppies are old enough for surgery but have not yet reproduced might
311 also increase the impact of interventions resulting in reduced population turnover and fewer dogs. A
312 more stable population could reduce both the required vaccination coverage and the absolute
313 number of dogs to vaccinate. This could save on resources, although the relative benefit would need
314 to be weighed against the relative costs of neutering versus vaccinating. As part of this assessment,
315 further research investigating whether juvenile mortality also shows seasonal variation would be
316 extremely valuable. This re-emphasises need for further detailed dog demographic studies and
317 modelling targeted at assessing optimum rabies vaccination strategies in India, comparable to those
318 performed for free-roaming, owned dogs in sub-Saharan Africa (Chidumayo, 2018; Conan et al.,
319 2015; Czupryna et al., 2016; Gsell et al., 2012; Hampson et al., 2009; Kitale et al., 2002).

320 Conclusions

321 Over the course of three years, 26,213 free-roaming unowned dogs were surgically neutered, with
322 post-campaign surveys indicating that more than 70% of free-roaming dogs were neutered by the
323 end of each campaign year. Over the three campaign years studied here, the total dog population

324 was estimated to decrease by 12.58%; however, our analysis also demonstrated that high numbers
325 of neutered, vaccinated dogs were lost between campaign years. In addition, the results reveal
326 potential biases in capture-based techniques and demonstrate seasonal reproductive patterns.
327 These findings highlight knowledge gaps regarding the demographics of free-roaming dogs in India
328 and the need for further research in order to optimise both dog population management strategies,
329 and mass rabies vaccination campaigns.

330 Acknowledgements

331 We would like thank the tireless efforts of the Mission Rabies Ranchi vaccination and survey teams
332 working in the field and to Ranchi Municipal Corporation for their support in the project as a whole.

333 Funding Sources

334 The Mission Rabies Ranchi vaccination and rabies surveillance campaign was funded by a grant from
335 Dogs Trust with additional resources provided by Ranchi Municipal Corporation. MSD Animal Health
336 donated all Nobivac® Rabies vaccines used on the project. HOPE and Animal Trust received
337 additional funding from Mayhew International for the sterilization and vaccination of dogs and
338 Worldwide Veterinary Service for veterinary training.

339 Conflicts of Interest

340 None to declare.

341 References

- 342 Becker, R.A., Brownrigg, R., Minka, T.P., Wilks, A.R., Deckmyn, A., 2018a. maps: Draw Geographical
343 Maps.
- 344 Becker, R.A., Brownrigg, R., Wilks, A.R., 2018b. mapdata: Extra Map Databases.
- 345 Belo, V.S., Werneck, G.L., da Silva, E.S., Barbosa, D.S., Struchiner, C.J., 2015. Population Estimation

346 Methods for Free-Ranging Dogs: A Systematic Review. PLoS One 10, e0144830.
347 <https://doi.org/10.1371/journal.pone.0144830>

348 Belsare, A. V., Gompper, M.E., 2013. Assessing demographic and epidemiologic parameters of rural
349 dog populations in India during mass vaccination campaigns. *Prev. Vet. Med.* 111, 139–146.
350 <https://doi.org/10.1016/j.prevetmed.2013.04.003>

351 Bilinski, A.M., Fitzpatrick, M.C., Rupprecht, C.E., Paltiel, A.D., Galvani, A.P., 2016. Optimal frequency
352 of rabies vaccination campaigns in Sub-Saharan Africa. *Proc. R. Soc. B Biol. Sci.* 283.
353 <https://doi.org/10.1098/rspb.2016.1211>

354 Bivand, R., Keitt, T., Rowlingson, B., 2019. rgdal: Bindings for the “Geospatial” Data Abstraction
355 Library.

356 Bivand, R., Lewin-Koh, N., 2019. maptools: Tools for Handling Spatial Objects.

357 Census of India, 2011. . New Delhi.

358 Chapman, G.D., 1951. Some properties of hyper-geometric distribution with application to zoological
359 census. *Univ. Calif. Publ. Stat.* 1, 131–160.

360 Chawla, S.K., Reece, J.F., 2002. Timing of oestrus and reproductive behaviour in Indian street dogs.
361 *Vet. Rec.* 150, 450–451. <https://doi.org/10.1136/vr.150.14.450>

362 Chidumayo, N.N., 2018. System dynamics modelling approach to explore the effect of dog
363 demography on rabies vaccination coverage in Africa. PLoS One 13, e0205884.
364 <https://doi.org/10.1371/journal.pone.0205884>

365 Cleaveland, S., Hampson, K., Lembo, T., Townsend, S., Lankester, F., 2014. Role of dog sterilisation
366 and vaccination in rabies control programmes. *Vet. Rec.* <https://doi.org/10.1136/vr.g6352>

367 Coleman, P.G., Dye, C., 1996. Immunization coverage required to prevent outbreaks of dog rabies.
368 *Vaccine* 14, 185–6.

369 Collinson, A., Bennett, M., Brennan, M.L., Dean, R.S., Stavisky, J., 2020. Evaluating the role of surgical
370 sterilisation in canine rabies control: A systematic review of impact and outcomes. *PLoS Negl.*
371 *Trop. Dis.* 14, 1–22. <https://doi.org/10.1371/journal.pntd.0008497>

372 Conan, A., Akerele, O., Simpson, G., Reininghaus, B., van Rooyen, J., Knobel, D., 2015. Population
373 Dynamics of Owned, Free-Roaming Dogs: Implications for Rabies Control. *PLoS Negl. Trop. Dis.*
374 9, e0004177. <https://doi.org/10.1371/journal.pntd.0004177>

375 Czupryna, A.M., Brown, J.S., Bigambo, M.A., Whelan, C.J., Mehta, S.D., Santymire, R.M., Lankester,
376 F.J., Faust, L.J., 2016. Ecology and Demography of Free-Roaming Domestic Dogs in Rural
377 Villages near Serengeti National Park in Tanzania. *PLoS One* 11, e0167092.
378 <https://doi.org/10.1371/journal.pone.0167092>

379 Davlin, S.L., VonVille, H.M., 2012. Canine rabies vaccination and domestic dog population
380 characteristics in the developing world: A systematic review. *Vaccine* 30, 3492–3502.
381 <https://doi.org/10.1016/j.vaccine.2012.03.069>

382 Dorai-Raj, S., 2014. binom: Binomial Confidence Intervals For Several Parameterizations.

383 Dürr, S., Ward, M.P., 2015. Development of a Novel Rabies Simulation Model for Application in a
384 Non-endemic Environment. *PLoS Negl. Trop. Dis.* 9, e0003876.
385 <https://doi.org/10.1371/journal.pntd.0003876>

386 Ferguson, E., Hampson, S., Cleaveland, S., Consunji, R., Deray, R., Friar, J., Haydon, D.T., Jiminez, J.,
387 Pancipane, M., Townsend, S.E., 2015 Heterogeneity in the spread and control of infectious
388 disease: consequences for the elimination of canine rabies. *Sci. Rep.* 5, 18232.
389 <https://doi.org/10.1038/srep18232>

390 Fielding, H.R., Gibson, A.D., Gamble, L., Fernandes, K.A., Airikkala-Otter, I., Handel, I.G., Bronsvoort,
391 B.M. d. C., Mellanby, R.J., Mazeri, S., 2021. Timing of reproduction and association with
392 environmental factors in female free-roaming dogs in southern India. *Prev. Vet. Med.* 187,

393 105249. <https://doi.org/10.1016/j.prevetmed.2020.105249>

394 Fooks, A.R., Banyard, A.C., Horton, D.L., Johnson, N., McElhinney, L.M., Jackson, A.C., 2014. Current
395 status of rabies and prospects for elimination. *Lancet (London, England)* 384, 1389–99.
396 [https://doi.org/10.1016/S0140-6736\(13\)62707-5](https://doi.org/10.1016/S0140-6736(13)62707-5)

397 Gibson, A.D., Yale, G., Vos, A.; Corfmat, J., Airikkala-Otter, I., King, A., Wallace, R.M., Gamble, L.,
398 Handel, I.G., Mellanby, R.J., Bronsvoort, B.M. de C., Mazeri, S. 2019. Oral bait handout as a
399 method to access roaming dogs for rabies vaccination in Goa, India: A proof of principle study.
400 *Vaccine X* 1, 100015.

401 Gibson, A.D., Mazeri, S., Lohr, F., Mayer, D., Burdon Bailey, J.L., Wallace, R.M., Handel, I.G., Shervell,
402 K., Bronsvoort, B.M. deC., Mellanby, R.J., Gamble, L., 2018. One million dog vaccinations
403 recorded on mHealth innovation used to direct teams in numerous rabies control campaigns.
404 *PLoS One* 13, e0200942. <https://doi.org/10.1371/journal.pone.0200942>

405 Gibson, A.D., Ohal, P., Shervell, K., Handel, I.G., Bronsvoort, B.M., Mellanby, R.J., Gamble, L., 2015.
406 Vaccinate-assess-move method of mass canine rabies vaccination utilising mobile technology
407 data collection in Ranchi, India. *BMC Infect. Dis.* 15, 1–10. [https://doi.org/10.1186/s12879-015-](https://doi.org/10.1186/s12879-015-1320-2)
408 [1320-2](https://doi.org/10.1186/s12879-015-1320-2)

409 Gsell, A.S., Knobel, D.L., Kazwala, R.R., Vounatsou, P., Zinsstag, J., Zinsstag, J., 2012. Domestic dog
410 demographic structure and dynamics relevant to rabies control planning in urban areas in
411 Africa: the case of Iringa, Tanzania. *BMC Vet. Res.* 8, 236. [https://doi.org/10.1186/1746-6148-](https://doi.org/10.1186/1746-6148-8-236)
412 [8-236](https://doi.org/10.1186/1746-6148-8-236)

413 Hampson, K., Coudeville, L., Lembo, T., Sambo, M., Kieffer, A., Attlan, M., Barrat, J., Blanton, J.D.,
414 Briggs, D.J., Cleaveland, S., Costa, P., Freuling, C.M., Hiby, E., Knopf, L., Leanes, F., Meslin, F.-X.,
415 Metlin, A., Miranda, M.E., Müller, T., Nel, L.H., Recuenco, S., Rupprecht, C.E., Schumacher, C.,
416 Taylor, L., Vigilato, M.A.N., Zinsstag, J., Dushoff, J., Prevention, on behalf of the G.A. for R.C.P.

417 for R., 2015. Estimating the Global Burden of Endemic Canine Rabies. *PLoS Negl. Trop. Dis.* 9,
418 e0003709. <https://doi.org/10.1371/journal.pntd.0003709>

419 Hampson, K., Dushoff, J., Cleaveland, S., Haydon, D.T., Kaare, M., Packer, C., Dobson, A., 2009.
420 Transmission Dynamics and Prospects for the Elimination of Canine Rabies. *PLoS Biol.* 7,
421 e1000053. <https://doi.org/10.1371/journal.pbio.1000053>

422 Hudson, E.G., Brookes, V.J., Dürr, S., Ward, M.P., 2017. Domestic dog roaming patterns in remote
423 northern Australian indigenous communities and implications for disease modelling. *Prev. Vet.
424 Med.* 146, 52–60. <https://doi.org/10.1016/j.prevetmed.2017.07.010>

425 Kahle, D., Wickham, H., 2013. ggmap: Spatial Visualization with ggplot2. *R J.* 5, 144–161.

426 Kakkar, M., Venkataramanan, V., Krishnan, S., Chauhan, R.S., Abbas, S.S., 2012. Moving from Rabies
427 Research to Rabies Control: Lessons from India. *PLoS Negl. Trop. Dis.* 6, e1748.
428 <https://doi.org/10.1371/journal.pntd.0001748>

429 Kitala, P.M., McDermott, J.J., Coleman, P.G., Dye, C., 2002. Comparison of vaccination strategies for
430 the control of dog rabies in Machakos District, Kenya. *Epidemiol. Infect.* 129, 215–22.

431 Knobel, D.L., Arega, S., Reininghaus, B., Simpson, G.J.G., Gessner, B.D., Stryhn, H., Conan, A., 2017.
432 Rabies vaccine is associated with decreased all-cause mortality in dogs. *Vaccine* 35, 3844–3849.
433 <https://doi.org/10.1016/j.vaccine.2017.05.095>

434 Kuhn, M., Wickham, H., 2017. rsample: General Resampling Infrastructure.

435 Kumar Swain, R., Pati, A.K., 2019. Circadian rhythm in behavioral activities and diurnal abundance of
436 stray street dogs in the city of Sambalpur, Odisha, India. *Chronobiol. Int.* 36, 1658–1670.
437 <https://doi.org/10.1080/07420528.2019.1668802>

438 Lembo, T., Hampson, K., Kaare, M.T., Ernest, E., Knobel, D., Kazwala, R.R., Haydon, D.T., Cleaveland,
439 S., 2010. The Feasibility of Canine Rabies Elimination in Africa: Dispelling Doubts with Data.

440 PLoS Negl. Trop. Dis. 4, e626. <https://doi.org/10.1371/journal.pntd.0000626>

441 Meek, P.D., 1999. The movement, roaming behaviour and home range of free-roaming domestic
442 dogs, *Canis lupus familiaris*, in coastal New South Wales. *Wildl. Res.* 26, 847.
443 <https://doi.org/10.1071/WR97101>

444 Meunier, N. V., Gibson, A.D., Corformat, J., Mazeri, S., Handel, I.G., Gamble, L., Bronsvort, B.M.C.,
445 Mellanby, R.J., 2019. A comparison of population estimation techniques for individually
446 unidentifiable free-roaming dogs. *BMC Vet. Res.* 15, 190. [https://doi.org/10.1186/s12917-019-](https://doi.org/10.1186/s12917-019-1938-1)
447 [1938-1](https://doi.org/10.1186/s12917-019-1938-1)

448 Morters, M.K., McKinley, T.J., Restif, O., Conlan, A.J.K., Cleaveland, S., Hampson, K., Whay, H.R.,
449 Damriyasa, I.M., Wood, J.L.N., 2014. The demography of free-roaming dog populations and
450 applications to disease and population control. *J. Appl. Ecol.* 51, 1096–1106.
451 <https://doi.org/10.1111/1365-2664.12279>

452 Pal, S.K., 2003. Reproductive behaviour of free-ranging rural dogs in West Bengal, India. *Acta Theriol.*
453 (Warsz). 48, 271–281. <https://doi.org/10.1007/BF03194167>

454 Pal, S.K., 2001. Population ecology of free-ranging urban dogs in West Bengal, India. *Acta Theriol.*
455 (Warsz). 46, 69–78. <https://doi.org/10.1007/BF03192418>

456 Pal, S.K., Ghosh, B., Roy, S., 1998. Dispersal behaviour of free-ranging dogs (*Canis familiaris*) in
457 relation to age, sex, season and dispersal distance. *Appl. Anim. Behav. Sci.* 61, 123–132.
458 [https://doi.org/10.1016/S0168-1591\(98\)00185-3](https://doi.org/10.1016/S0168-1591(98)00185-3)

459 Pérez, G.E., Conte, A., Garde, E.J., Messori, S., Vanderstichel, R., Serpell, J., 2018. Movement and
460 home range of owned free-roaming male dogs in Puerto Natales, Chile. *Appl. Anim. Behav. Sci.*
461 205, 74–82. <https://doi.org/10.1016/j.applanim.2018.05.022>

462 R Core Team, 2017. R: A Language and Environment for Statistical Computing.

463 Reece, J.F., Chawla, S.K., 2006. Control of rabies in Jaipur, India, by the sterilisation and vaccination
464 of neighbourhood dogs. *Vet. Rec.* 159, 379–383. <https://doi.org/10.1136/vr.159.12.379>

465 Reece, J.F., Chawla, S.K., Hiby, E.F., Hiby, L.R., 2008. Fecundity and longevity of roaming dogs in
466 Jaipur, India. *BMC Vet. Res.* 4, 6. <https://doi.org/10.1186/1746-6148-4-6>

467 Rowan, A.N., Lindenmayer, J.M., Reece, J.F., 2014. Role of dog sterilisation and vaccination in rabies
468 control programmes. *Vet. Rec.* 175, 409–409. <https://doi.org/10.1136/vr.g6351>

469 Srinivasan, K., Kurz, T., Kuttuva, P., Pearson, C., 2019. Reorienting rabies research and practice:
470 Lessons from India. *Palgrave Commun.* 5, 1–11. <https://doi.org/10.1057/s41599-019-0358-y>

471 Sudarshan, M.K., Madhusudana, S.N., Mahendra, B.J., Rao, N.S.N., Ashwath Narayana, D.H., Abdul
472 Rahman, S., Meslin, F.X., Lobo, D., Ravikumar, K., Gangaboraiah, 2007. Assessing the burden of
473 human rabies in India: results of a national multi-center epidemiological survey. *Int. J. Infect.*
474 *Dis.* 11, 29–35. <https://doi.org/10.1016/j.ijid.2005.10.007>

475 Tiwari, H.K., Robertson, I.D., O’Dea, M., Gogoi-Tiwari, J., Panvalkar, P., Bajwa, R.S., Vanak, A.T., 2019.
476 Validation of application superduplicates (AS) enumeration tool for free-roaming dogs (FRD) in
477 urban settings of Panchkula Municipal corporation in North India. *Front. Vet. Sci.* 6, 173.
478 <https://doi.org/10.3389/fvets.2019.00173>

479 Totton, S.C., Wandeler, A.I., Zinsstag, J., Bauch, C.T., Ribble, C.S., Rosatte, R.C., McEwen, S.A., 2010.
480 Stray dog population demographics in Jodhpur, India following a population control/rabies
481 vaccination program. *Prev. Vet. Med.* 97, 51–57.
482 <https://doi.org/10.1016/j.prevetmed.2010.07.009>

483 Wickham, H., 2017. tidyverse: Easily Install and Load the “Tidyverse.”

484 Widyastuti, M.D., Bardosh, K.L., Sunandar Basri, C., Basuno, E., Jatikusumah, A., Arief, R.A., Putra,
485 A.A., Rukmantara, A., Estoepangestie, A.T., Willyanto, I, 2015. On dogs, people, and a rabies
486 epidemic: Results from a sociocultural study in Bali, Indonesia. *Infect. Dis. Poverty* 4, 30.

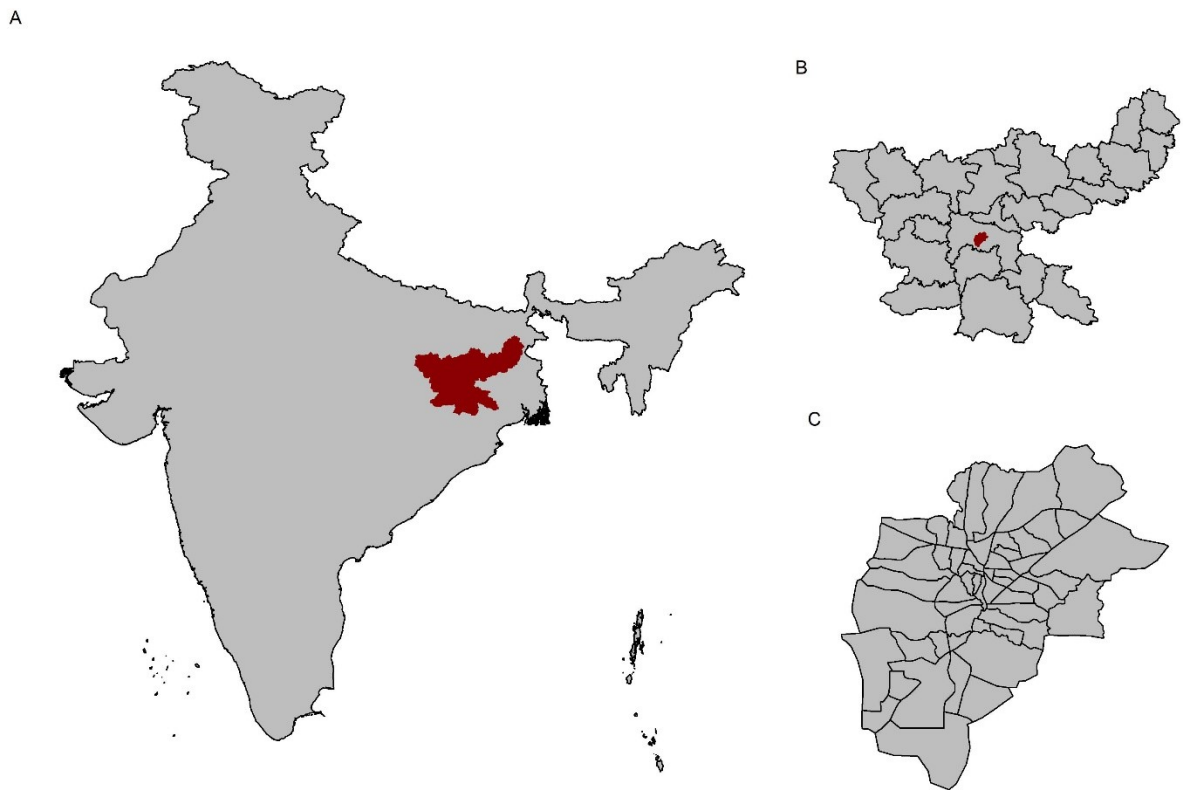
487 Wilke, C.O., 2018. cowplot: Streamlined Plot Theme and Plot Annotations for “ggplot2.”

488 World Health Organization, 2018. WHO Expert Consultation on Rabies Third report.

489 Yoak, A.J., Reece, J.F., Gehrt, S.D., Hamilton, I.M., 2014. Disease control through fertility control:
490 Secondary benefits of animal birth control in Indian street dogs. *Prev. Vet. Med.* 113, 152–156.
491 <https://doi.org/10.1016/j.prevetmed.2013.09.005>

492

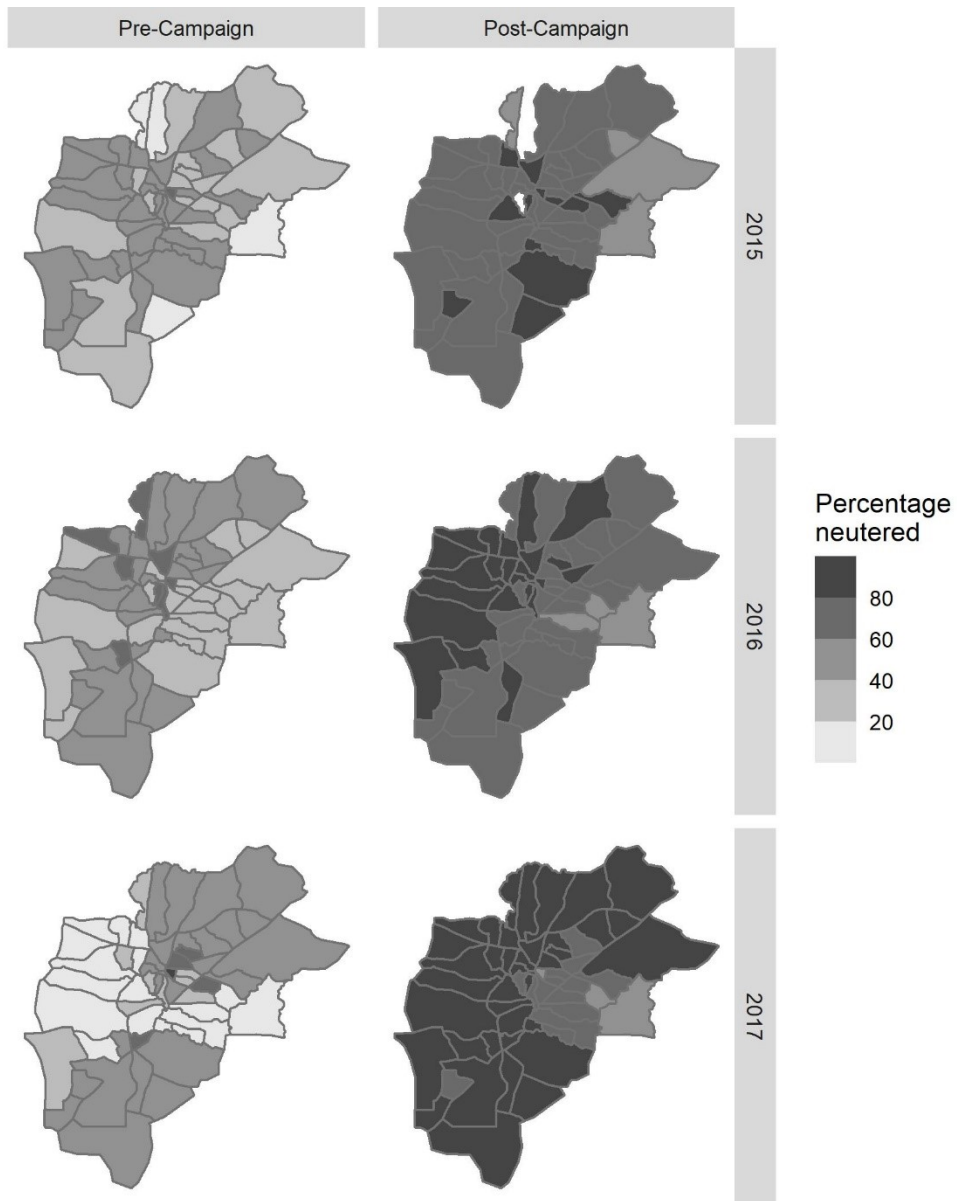
493 Figures and Legends
494



495

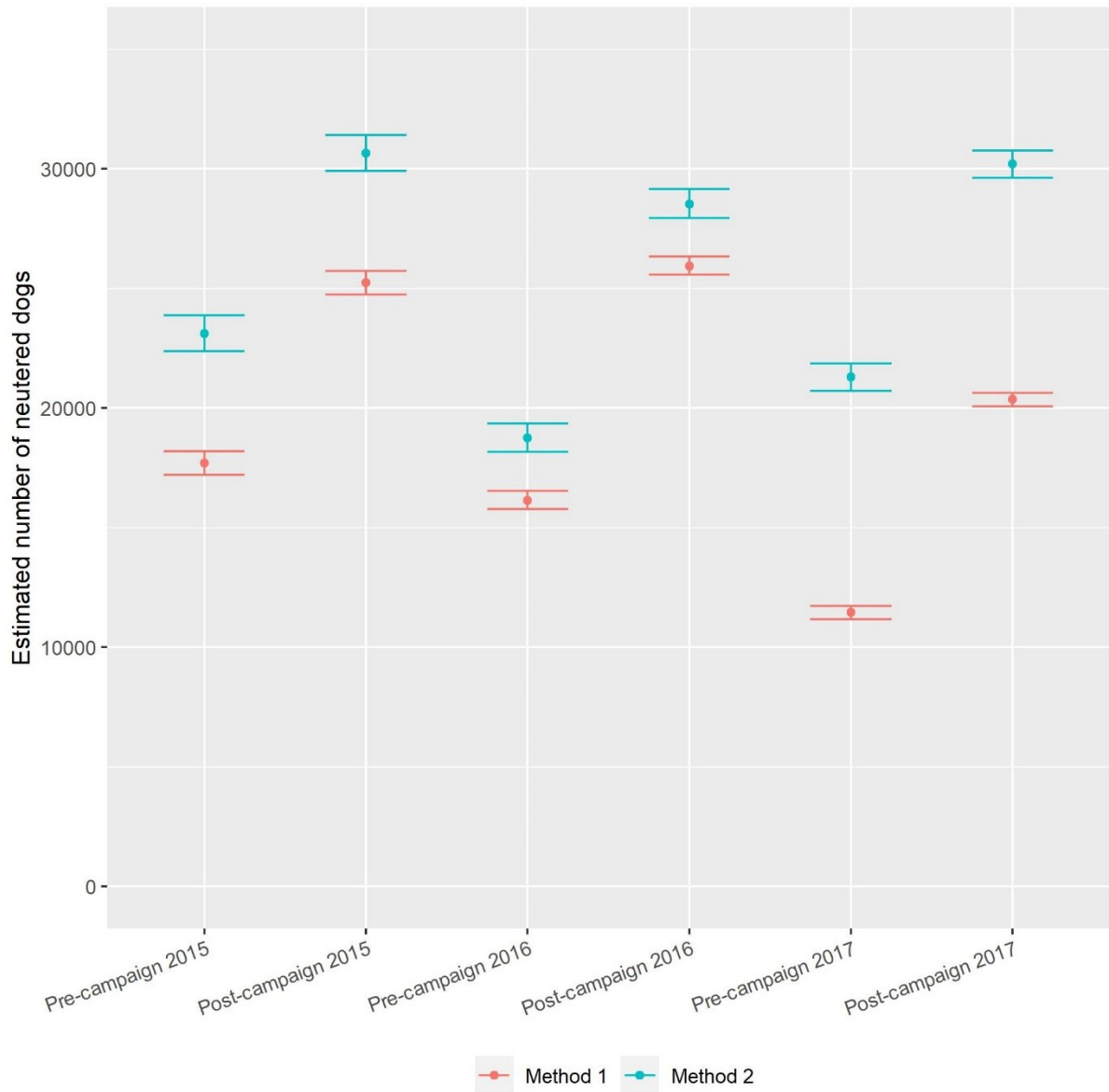
496 Figure 1 A: Jarkhand state within India B: Ranchi city within Jarkhand C: Administrative ward
497 boundaries within Ranchi city

498



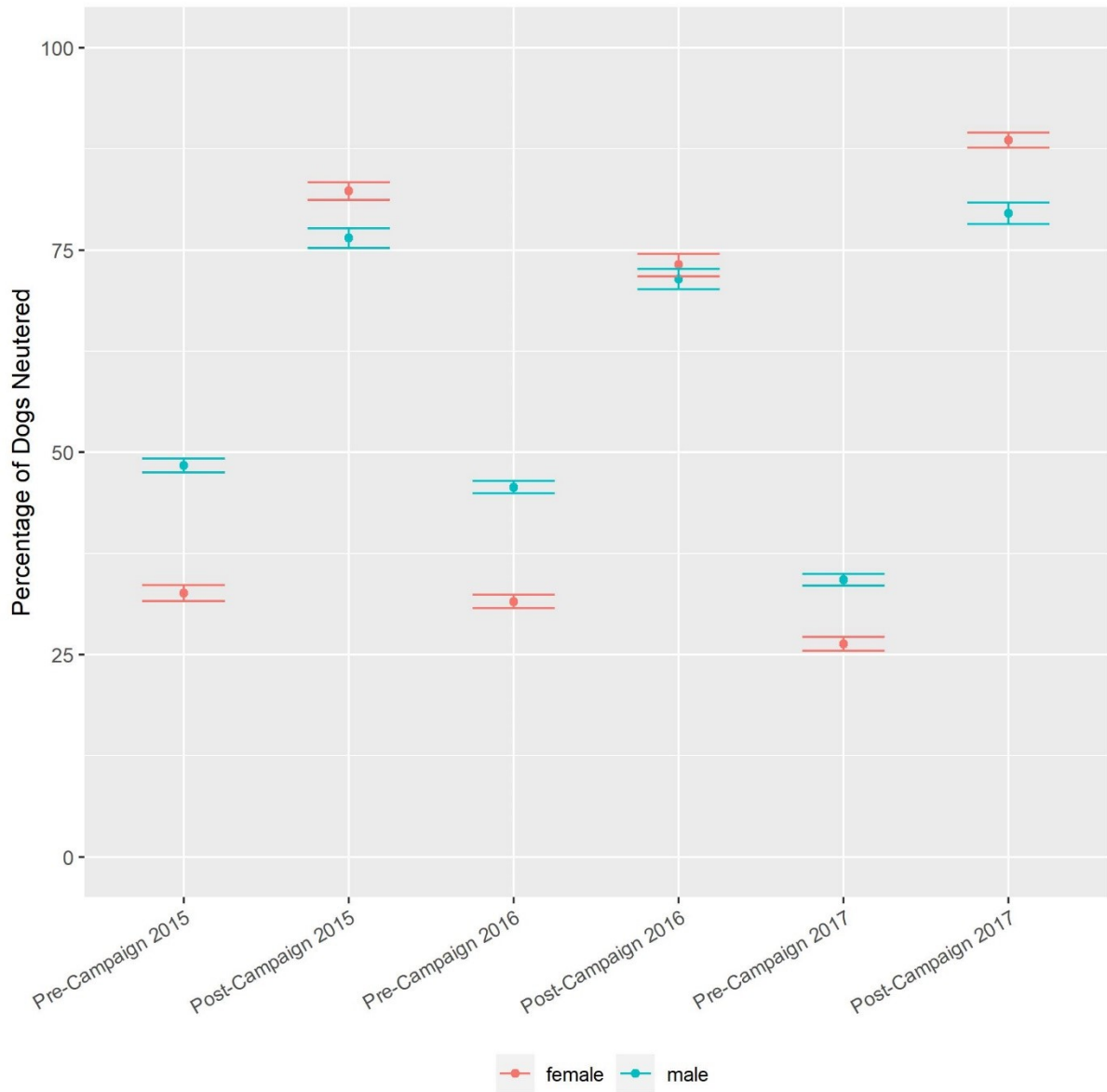
499

500 Figure 2 Choropleth maps of the percentage of dogs captured during Phase 1 (Pre-Campaign) and
 501 sighted in the Phase 2 re-sight surveys (Post-Campaign)) that were neutered.



502

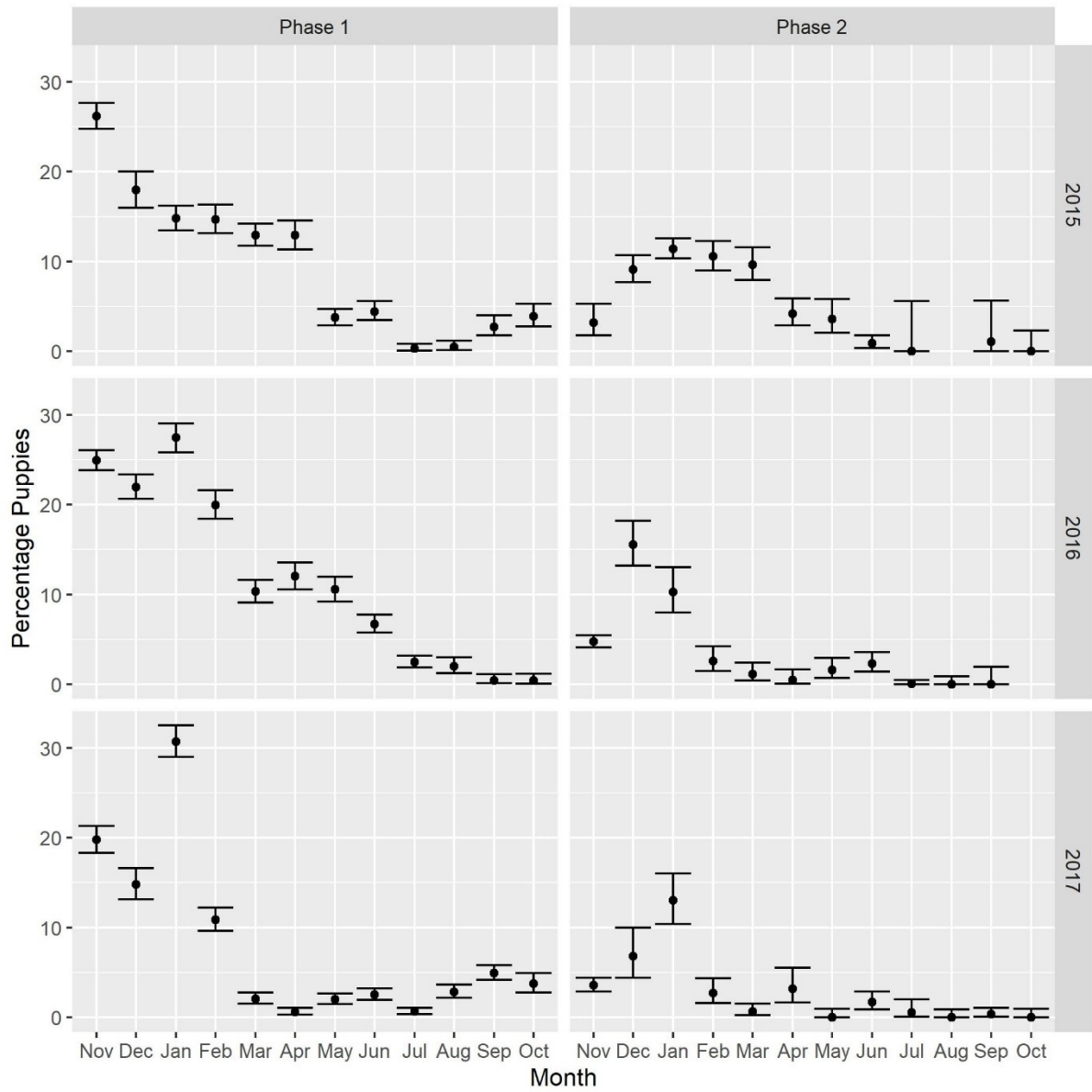
503 Figure 3 Number of neutered free-roaming dogs (and 95% CIs), before and after each campaign,
 504 asses by Method 1 and Method 2.



505

506 Figure 4 Percentages (and 95% CIs) of free-roaming dogs (estimated >12 weeks of age) that were
 507 neutered, Pre- and Post-Campaign, stratified by sex.

508



509

510 Figure 5 Percentages (and 95% CIs) of dogs that were puppies (<12 weeks) during the months of
 511 each campaign