



Mammal Persistence Along Riparian Forests in Western India Within a Hydropower Reservoir 55 Years Post Construction

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Jelil SN, Gaykar A, Girkar N, Ben C, Hayward MW and Krishnamurthy R (2021) Mammal Persistence Along Riparian Forests in Western India Within a Hydropower Reservoir 55 Years Post Construction. Front. Ecol. Evol. 9:643285. doi: 10.3389/fevo.2021.643285 While the negative impacts of dam construction on downstream river stretches and riparian forests are well studied, the status of wildlife presence and persistence in upstream reservoir deltas is virtually unknown. We investigated the drivers of terrestrial mammal occupancy and persistence along riparian forests of Koyna reservoir in western India 55 years after its construction. We adopted a catchment-wide field design grounded in the river continuum concept and sampled different stream orders within the reservoir. Camera traps, nested in an occupancy modeling framework, were deployed across 72 riparian sites and replicated for four seasons across all stream types. We recorded a total of nineteen species of terrestrial mammals during the study period. Multi-season occupancy models revealed three key patterns of mammal persistence: (a) ungulates were more frequently photo-captured in riparian forests; gaur and wild pig had the highest proportions of the total sampled area (0.84 \pm 0.12 SE; 0.77 \pm 0.07 SE, respectively); (b) small-sized ungulates were more vulnerable to local extinction than large-bodied ungulates; extinction probability was highest for barking deer (0.59 ± 0.07) and lowest for sambar (0.15 \pm 0.07); and (c) distance from stream played major roles in determining mammal detection. Riparian forests are fundamentally important to ecosystem functioning and biodiversity conservation, and using the data from this study, managers can plan to sustain high mammal persistence along riparian forests at Koyna reservoir or similar Indian reserves. Further, our robust sampling approach, grounded in the terrestrial-riverine continuum concept, can be applied globally to understand species assemblages, aiding in multi-landscape and wildlife management planning.

Keywords: dammed river, occupancy modeling, colonization, extinction, reservoir biodiversity, river continuum

INTRODUCTION

The river continuum concept was the first unified hypothesis proposing that rivers and associated watersheds should be viewed as a continuum to understand the complete structure and functioning of a river (Vannote et al., 1980). Like river systems, riparian forests form their own continuum running along rivers and streams, from headwaters to perennial rivers, and hence riparian

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vegetation is also likely to conform to the river continuum concept. Riparian forests as ecotones protect riverbanks from erosion resulting in bank stability (Pinay et al., 2018), drive organic matter and nutrients into streams (Vannote et al., 1980), moderate temperature extremes in river environments (Dugdale et al., 2018), and are predicted to function as hotspots for climate change adaptation (Seavy et al., 2009; Capon et al., 2013). Hence, riparian forests are key constituents of terrestrial-aquatic continua and reflect the functional status of an entire catchment. Large animal ecology in riparian forests has been long studied and was probably first highlighted in mainstream conservation science by the pioneering studies of Naiman (1988); Pastor et al. (1988), and Naiman and Rogers (1997). These studies summarized how large ungulates influence riparian system dynamics primarily by their foraging behavior. There have been few recent studies highlighting the importance of riparian forests for forest mammals, but the riverine-continuum concept is slowly gaining traction across various ecosystems, especially with important works of Santos et al. (2011) and Zimbres et al. (2018). In India, there have been frequent general discussions about dam effects on biodiversity, but detailed empirical studies on the dynamics and distribution of forest mammals within riparian forests remain virtually non-existent. In regards to riparian forests, studies have mainly focused on riparian obligate species like otters (Umapathy and Durairaj, 1995; Hussain and Choudhury, 1997; Anoop and Hussain, 2006a,b; Perinchery et al., 2011; Prakash et al., 2012; Raha and Hussain, 2016), or certain large mammals in floodplains/wetland-dependent species, such as Asiatic buffalo and rhinocerous (Chatterjee and Bhattacharyya, 2021). Chatterjee and Bhattacharyya (2021) found that even though wetland-dependent mammals have been studied, there remains a large knowledge gap in regards to these species ecology and conservation.

A novel avenue for riparian ecology research opened up very recently with studies of Datry et al. (2014, 2016, 2017a,b), which stressed the ecology of dry and intermittent rivers, as perennial river systems have received the majority of research attention historically. Following the research on fluvial dynamics of perennial and temporary rivers, Sánchez-Montoya et al. (2016) studied dry streams as corridors for large mammals using an innovative animal footprint method. These studies have all contributed to the development of the terrestrial riverine continuum concept, but they have also all been conducted largely in free-flowing rivers and associated riparian forests. Within altered habitats, especially in upstream hydropower reservoirs, research on forest mammals in riparian forests is still lacking. These altered habitats are interesting especially because the riparian forests experience high levels of flooding and drought owing to uneven rainfall patterns. Unlike natural watersheds, the water level in reservoirs is operated by dam authorities which alters the normal hydrological cycle of the river (Alho, 2011). Species occupancy patterns in an environment of such dynamic water level fluctuations is key to provide insights into how species persist within these reservoirs. With this background in the river continuum framework, we aimed to identify the drivers of mammal assembly and persistence in a human-altered watershed, a dammed river which now forms the Koyna Wildlife Sanctuary in the northern Western Ghats.

MATERIALS AND METHODS

Study Area: The Koyna Hydroelectric Project is the largest completed hydropower station in India with a total capacity of 1960 MW. It is comprised of four dams, the largest of which, the Koyna Dam, was completed in 1963, forming the Shivsagar Reservoir (Bokil, 1999). The reservoir is now protected as Koyna Wildlife Sanctuary (hereafter referred to as "Koyna"). Koyna forms an important corridor between Mahabaleshwar-Panchgani Ecologically Sensitive Zone in the north and Chandoli National Park in the south; Koyna and the Chandoli National Park together form the Sahyadri Tiger Reserve. With seven land cover types (Jelil et al., 2020; Figure 1), Koyna covers 423.55 km² and the vegetation in the sanctuary is classified as southern tropical evergreen forest and southern moist deciduous forest (Champion and Seth, 1968). Red clay is the main soil type. The mean annual rainfall in Koyna is \sim 5,000 mm, which falls predominantly from June-September (Joglekar et al., 2015). Koyna was declared a wildlife sanctuary in 1985, and private forests owned by villagers before resettlement now persist as grasslands, scrub and moist deciduous forests (Joglekar et al., 2015). Joglekar et al. (2015) reported that the relative inaccessibility and undulating terrain supports some of the few remaining undisturbed tall evergreen forests in the northern Western Ghats, and hosts large mammals such as the common leopard (Panther pardus), dhole (Cuon alpinus), sloth bear (Melursus ursinus), Indian gaur (Bos gaurus), and sambar (Rusa unicolor). The last confirmed record of tiger (Panthera tigris) from Chandoli National Park was in 2018 (Jelil et al., 2020), but the species has not been recorded in Kovna since 2007.

Field Study Design: We used stream types as sampling strata with the river stretch divided into three sections (Table 1). In each section, we assessed riparian forests associated with a perennial order, two intermittent orders, four ephemeral orders and eight headwater orders (Figures 1, 2). We sampled four locations in both the perennial and intermittent order and eight locations in both ephemeral and headwaters orders. In total, we sampled 24 locations in each of the three sections resulting in 72 total sampled locations. The riparian buffer was set at 1 km in either direction of the stream edge in the perennial habitat, at 500 m in the intermittent, 200 m in ephemeral and 100 m in headwater streams. The study was carried out from April 2018 to March 2020 encompassing four seasons (two summer and winter seasons, i.e., summer 2018, winter 2018, summer 2019, and winter 2019). Summer season data collection was conducted from April to July and winter data collection from November to February. This amounted to c. 480 days of survey effort in the 2 year period.

Camera Trapping Surveys: The camera traps were deployed up to 1 km from the waterway for the perennial stream-type, up to 500 m for the intermittent stream-type, up to 200 m for the



FIGURE 1 | Map of study area detailing the field survey design and the camera trap locations. In each of three sections of the river we sampled four kinds of stream types: perennial, intermittent, ephemeral and headwater streams.

TABLE 1	Description of riparian	habitat complexes/hab	tat types selected for	the study and the rat	tionale/basis for selecting t	the habitat types.
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Stream type	Description	Mean altitude \pm SE (m)	Buffer width fixed (m)	Mean distance of cameras from stream edge \pm SE (m)
Perennial	Water flows in these stretches all year round	645.67 (±1.27)	1,000	251.08 (±16.68)
Intermittent	Water flows for more than half of the year (6–8)	649.58 (±1.08)	500	123.08 (±8.05)
Ephemeral	Water flows for less than half of the year (3–5)	653.25 (±2.12)	200	66.67 (±2.92)
Headwater	Water drains out immediately (>1 month)	666.29 (±3.31)	100	15.62 (±1.57)

Two criteria were considered, (a) water flow in the stream types (b) mean elevation of habitats. The riparian buffer selected for perennial streams was 1,000 m, intermittent streams was 500 m, ephemeral streams was 200 m and headwater streams was 100 m.

ephemeral stream type, and up to 100 m for headwater stream type. Mean values for the distance of the camera-trap site to the waterway shown in **Table 1**. At each of the 72 sites, a single Cuddeback white flash (C1 model) camera trap was deployed by affixing it at a height of *c*. 60-70 cm to suitable trees. These were set to take consecutive images (set 5 s apart) when triggered.

Cameras were checked regularly in field after deployment to limit the missing survey replicates. The mean of the trapping days in summer 2018 was 24.4 (\pm 0.62 SE) days, winter 2018 was 39.89 (\pm 1.75 SE), summer 2019 was 40.97 (\pm 0.89 SE) days and winter 2019 was 35.05 (\pm 1.73 SE) days. The trapping effort in summer 2018 was lower because initially we had fewer number of



FIGURE 2 | Different habitat types selected for the study.

camera traps available for this study, and hence, we had to cover the 72 sites in two rounds. However, during the next sessions, more camera traps were at our disposal and all 72 cameras could be deployed at once. In any case, the different number of camera traps days is likely to increase confidence intervals and thereby means that any differences in effects due to variable effort are conservative.

Riparian Habitat Assessment: To test habitat factors influencing species occupancy, circular vegetation plots were established in all the 72 riparian buffers for collection of fine-scale habitat data. Keeping the camera trap location as the center, the number of trees and fallen logs were assessed within 10 m radius plots covering 314 m². Percent canopy cover, elevation, the adjacent stream type and the distance to stream edge were recorded from the center of the plot. We set the radius of the plot to be short to conserve time in the field.

Data Analyses: Images retrieved from the camera traps were identified to species level excluding random captures of birds, and data were sorted into species-specific folders for all sites by season. Images were considered to be independent when they were at least 30 min apart (Linkie and Ridout, 2011; Rovero and Zimmerman, 2016; Allen et al., 2018, 2020).

Occupancy Modeling Framework: We constructed speciesspecific multi-season occupancy models (MacKenzie et al., 2002, 2006) using PRESENCE 12.6 (Hines, 2006). We modeled occupancy of species that had at least 20 independent captures across all four seasons. We arranged our camera trap data into 7 day occasions (weekly replicates) to record detection and non-detection to create detection history matrices for each site. A detection was coded as (1), non-detection was coded as (0) and a missing survey was coded as (.), which in our case would mean that a camera stopped working during the deployed time. We finally compiled our detection history matrices with four replicates for summer 2018, seven for winter 2018, summer 2019 and winter 2019. Hence, we had 25 replicates across all four seasons, i.e., we had 25×7 days = 175 occasions for each of the 72 sites covering all four seasons. For all multi-season models, the model parameterization was fixed to initial occupancy, local colonization, extinction and detection. The parameters used in multi-season models were:

 ψ : occupancy probability (probability that the area is occupied by the species)

p_i: detection probability (probability of detection species in survey i, given the species is present)

 γ_i : colonization probability (probability of unoccupied site being colonized between seasons i and i + 1)

 ϵ_i : extinction probability (probability of occupied site going extinct between seasons i and i + 1)

Predictor Variables: The riparian habitat covariates were selected a priori because of their likely importance in driving wildlife occupancy along streams (Table 2). To minimize model overfitting, which often risks the inclusion of spurious variables (Burnham and Anderson, 2002), we tested for pairwise correlations between covariates using Pearson's correlation analyses. This was done using cor function and plotted using corrplot function in the corrplot 0.84 (Wei and Simko, 2017) package in R 4.0.0 (R Core Team, 2020). Correlation threshold was fixed at $r \ge 0.7$ (Dornmann et al., 2013; Supplementary Code 1 and Supplementary Figure 1) and when correlation between two variables was higher than 0.7, we removed one of the two covariates. Since cameras were set at specific distances from stream edge at each of the stream types, we sensed a possible correlation of habitat type with distance to stream. However, since habitat type was a categorical variable it was not possible to test for correlation using the above method, since that only works with continuous variables. Regression models allow to test for this by using square root of the R^2 value as a surrogate that can be treated similarly to correlation. This works for a regression model considering a continuous variable (in our case distance from stream edge) as dependent variable and a categorical variable (stream type) as independent variable. Again, the correlation threshold was fixed at 0.7 (Supplementary Code 2).

Simultaneously, we ran a principal component analysis (PCA) to test for multicollinearity in addition to the pair-wise correlation analysis. We ran the PCA using the *prcomp* function in the factoextra 1.0.7 package (Kassambara and Mundt, 2020) in R (**Supplementary Code 3**, **Supplementary Figure 2**, and **Supplementary Table 1**).

Model Selection: For model selection, χ^2 goodness-of-fit test (MacKenzie and Bailey, 2004) using 999 parametric bootstraps was run to estimate overdispersion parameter \hat{c} (Burnham and Anderson, 2002). This was done keeping in mind the caveat described by Burnham and Anderson (2002) that estimating \hat{c} for every model would make the correct use of model selection criteria tricky, hence they recommend that the global model should be used as the basis for estimating a single variance inflation factor \hat{c} . We evaluated model fit with program PRESENCE by using the "assess model fit" function, while creating the design matrix of the global model. Finally, to account for overdispersion (where $\hat{c} > 1$) indicating a lack of fit, the model selection was done using quasi AIC (QAIC), and model parameters were adjusted by multiplying the standard errors by

TABLE 2	Description of	covariates with a	<i>priori</i> hypotheses	along riparian forests
	Description of	covariates with a		along npanan lorosis.

Covariate	Expected influe		
	Species	Parameter with expected effect	Supporting citation
Elevation	Gaur, sambar, barking deer Porcupine, wild pig	ψ (+), γ (+), ε (−) ψ (+), γ (+), ε (−)	Schaller, 1967; Johnsingh et al., 2004 Timmins et al., 2015, 2016
Number of trees	Gaur, sambar, barking deer, porcupine Wild pig	Ψ (+), $γ$ (+), $ε$ (-) Ψ (-), $γ$ (-), $ε$ (+)	Schaller, 1967
Canopy cover	Gaur, sambar, barking deer, porcupine, wild pig	ψ (+), γ (+), ϵ (–)	Duckworth and Hedges, 1998; Duckworth et al., 1999; Greiser Johns, 2000; Timmins and Ou, 2001
Distance from stream	Gaur, sambar, barking deer, porcupine, wild pig	р (—)	Timmins et al., 2015
Season	Gaur, sambar, barking deer, porcupine, wild pig	p (+/-)	

a factor of $\sqrt{\hat{c}}$ (Burnham and Anderson, 2002). The QAIC was computed using the following formula:

$$QAIC = -2\log Like/\hat{c} + 2k$$

where,

log Like = log likelihood of the model

 \hat{c} = dispersion parameter from the global model

k = number of parameters in the model

The estimates of occupancy (ψ), seasonal colonization (γ), local extinction (ϵ), and detection probability (p) were obtained through the null models of each species. Graphs were created using ggplot2 (Wickham, 2016) and ggpubr 0.4.0 (Kassambara, 2020) R packages.

RESULTS

Our camera trap efforts accounted for 10, 021 trap nights across all four seasons—1757 trap nights in summer 2018, 2872 in winter 2018, 2868 in summer 2019 and 2524 in winter 2019. We photo-captured 19 species of terrestrial mammals (**Table 3** and **Figure 3**). Our camera capture threshold criterion of at least 20 independent captures was fulfilled by 10 species in summer 2018, 10 in winter 2018, six in summer 2019 and 10 in winter 2019. Only five species fulfilled this criterion across all four seasons and hence multi-season models were run for these five species—gaur (*Bos gaurus*), wild pig (*Sus scrofa*), sambar (*Rusa unicolor*), barking deer (*Muntiacus muntjak*), and porcupine (*Hyxtrix indica*).

Final Set of Predictor Variables: The pairwise correlation test showed that distance from stream edge and type of stream/habitat had high correlation (0.94) (**Supplementary Code 2**) and hence stream type was removed from the final variable set. Further, distance from stream, number of fallen logs, and percent understory cover were removed from the occupancy, colonization and extinction models because the test for multicollinearity (PCA) demonstrated these covariates to have low contribution in the overall dataset. However, we retained distance from stream as a covariate to model species detection probabilities. The final list of covariates after both correlation and multi-collinearity analyses were used as occupancy, seasonal

colonization, local extinction and detection probability covariates in the occupancy models (**Table 4**).

Model Selection: We detected evidence of overdispersion for two species viz., gaur ($\hat{c} = 2.83$) and sambar ($\hat{c} = 2.05$) (**Table 4**). No model overdispersion was detected for barking deer ($\hat{c} = 0.03$), wild pig ($\hat{c} = 0.88$) and porcupine ($\hat{c} = 0.85$) (**Supplementary Table 2**). Top ranking models for each species (Δ QAIC ≤ 2) were considered which accounted for 83 and 95% of the QAIC model weight for sambar and gaur, respectively. For barking deer, porcupine and wild pig, top ranking models (Δ AIC ≤ 2) accounted for 67, 81, and 93% of AIC model weights, respectively.

Occupancy modeling results (occupancy, colonization, extinction and detection probability parameter estimates with standard error SE are reported within parentheses):

Porcupine (0.43 ± 0.01) had the highest detection probability followed by wild pig (0.37 ± 0.02) , sambar (0.31 ± 0.01) , barking deer (0.29 ± 0.02) , and gaur (0.27 ± 0.03) . Indian gaur (0.84 ± 0.12) had the highest proportion of occupied sites followed by wild pig (0.77 ± 0.07) , porcupine (0.65 ± 0.07) , sambar (0.49 ± 0.10) , and barking deer (0.49 ± 0.08) . Sambar (0.63 ± 0.10) had the highest probability to colonize unoccupied sites between seasons, followed by wild pig (0.62 ± 0.08) , gaur (0.57 ± 0.15) , porcupine (0.47 ± 0.06) , and barking deer (0.24 ± 0.05) . Barking deer (0.59 ± 0.07) had the highest probability to go extinct from a previously occupied site between seasons, followed by porcupine (0.43 ± 0.05) , gaur (0.39 ± 0.11) , wild pig (0.32 ± 0.04) , and sambar (0.15 ± 0.07) (**Figure 4**).

Predictors of species occupancy, detection, local colonization and extinction between seasons (β estimates with standard error SE are reported within parentheses):

Barking Deer: Barking deer occupancy was positively affected by elevation (0.09 ± 0.01) and number of trees (0.05 ± 0.02) , and negatively by canopy cover (-0.06 ± 0.01) . Its colonization probability was positively affected by canopy cover (0.03 ± 0.01) , and negatively by elevation (-0.04 ± 0.01) and number of trees (-0.01 ± 0.02) . Its extinction probability was negatively affected by elevation (-0.05 ± 0.01) , canopy cover (-0.01 ± 0.01) , and number of trees (-0.05 ± 0.02) . Its detection was higher at sites near to streams (-0.01 ± 0.01) (**Figures 5, 6** and **Supplementary Tables 3-6**).

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Species	Summer 2018	Winter 2018	Summer 2019	Winter 2019
Porcupine	156 (8.87)	191 (6.65)	158 (5.51)	149 (5.90)
Gaur	83 (4.72)	71 (2.47)	83 (2.89)	147 (5.82)
Wild pig	101 (5.74)	86 (3.00)	253 (8.82)	137 (5.42)
Sambar	67 (3.81)	89 (3.10)	148 (5.16)	193 (7.64)
Barking deer	64 (3.64)	59 (2.05)	52 (1.81)	36 (1.42)
Mouse deer	34 (1.93)	35 (1.21)	10 (0.34)	17 (0.67)
Sloth bear	30 (1.71)	24 (0.83)	54 (1.88)	15 (0.59)
Leopard	21 (1.19)	53 (1.84)	17 (0.59)	41 (1.62)
Common palm civet	33 (1.87)	98 (3.41)	15 (0.52)	110 (4.35)
Small Indian civet	23 (1.31)	18 (0.62)	13 (0.45)	94 (3.72)
Ruddy mongoose	17 (0.97)	32 (1.11)	12 (0.41)	66 (2.61)
Dhole	2 (0.11)	10 (0.35)	6 (0.21)	50 (1.98)
Indian pangolin	3 (0.17)	5 (0.17)	1 (0.034)	3 (0.11)
Gray mongoose	4 (0.23)	2 (0.07)	_	-
Indian hare	16 (0.91)	8 (0.28)	9 (0.31)	19 (0.75)
Indian gerbil	2 (0.11)	-	_	-
Stripe-necked mongoose	_	16 (0.56)	4 (0.14)	6 (0.23)
Rusty spotted cat	_	1 (0.03)	_	1 (0.039)
Brown palm civet	-	-	-	2 (0.079)

We report the number of captures and overall capture rates (expressed per 100 trap nights in parentheses) across all four seasons.



Porcupine: Porcupine occupancy was positively affected by canopy cover (0.01 ± 0.01) , number of trees (0.03 ± 0.01) , and negatively by elevation (-0.01 ± 0.01) . Its colonization probability was positively affected by canopy cover (0.02 ± 0.01) , number of trees (0.01 ± 0.01) and

negatively by elevation (-0.03 ± 0.01) . Its detection was higher closer to streams (-0.001 ± 0.001) and it was also affected by season. None of the covariates considered could explain porcupine extinction probability (**Figures 5, 6** and **Supplementary Tables 3–6**).

Parameter	Site-specific covariate	Type of variable	Mean values (range)
ψ, γ, ε	Elevation (m)	Continuous	655.72 (633–695)
	Canopy cover (%)	Continuous	61.15 (0–90)
	Number of trees	Continuous	19.68 (0–50)
p	Distance from stream edge (m)	Continuous	Perennial: 251.08 (90–358) Intermittent: 123.08 (90–168) Ephemeral: 66.67 (40–100) Headwater: 15.62 (5–25)
	Season	Categorical	-

Gaur: Gaur detection (-0.02 ± 0.01) were higher at sites near streams. Its detection was also affected by season. Its occupancy, colonization and extinction probabilities were not explained by any of the covariates considered in the occupancy models (**Figure 6** and **Supplementary Tables 3–6**).

Sambar: Sambar occupancy, colonization and extinction probability were not influenced by any of covariates. However, sites near to streams (-0.001 ± 0.001) and season affected its detection probability (**Figure 6** and **Supplementary Tables 3–6**).

Wild Pig: Wild pig extinction probability was positively affected by elevation (0.02 ± 0.01) , and negatively by canopy cover (-0.02 ± 0.01) , number of trees (-0.06 ± 0.08) . Its detection was higher near streams (-0.01 ± 0.01) , and was also affected by season. No factors could explain its occupancy and colonization (**Figures 5, 6; Supplementary Tables 3–6**).

DISCUSSION

Three key patterns emerge from our study. Firstly, ungulates were the most frequently photo-captured mammals in camera traps, with higher occupancy probability in riparian forests. Apart from ungulates, small mammals were also captured, however, large carnivores which included leopard *Panthera pardus*, dhole *Cuon alpinus* and sloth bear *Melursus ursinus* had low captures rates (**Table 3**). Pioneering studies by Naiman (1988); Pastor et al. (1988), and Naiman and Rogers (1997) found substantial evidence of large ungulates shaping structure of riparian forests in temperate ecosystems by selective browsing, dispersing seeds, and thereby affecting riparian plant community and ultimately modifying channel morphology (Naiman and Rogers, 1997). A similar kind of ungulate dominance in terms of high occupancy and persistence was found in riparian forests in Koyna.

Secondly, we observed an ungulate body size effect on colonization and extinction probabilities, in that the smallest ungulate, barking deer (20–30 kg), had highest extinction probability (0.59 \pm 0.07) and lowest colonization probability (0.24 \pm 0.05), while the much larger sambar (100–350 kg) had highest colonization probability (0.63 \pm 0.10) and lowest extinction probability (0.15 \pm 0.07) (Figure 4 and Supplementary Table 7). This indicates that smaller ungulates are more vulnerable to vacate previously occupied sites (local

extinction) than larger ungulates, perhaps due to resource competition. In a larger landscape context, however, the opposite of this pattern has been recorded, i.e., large herbivores are more vulnerable to extinction through large-scale anthropogenic factors (Ripple et al., 2015). However, at local scales, more empirical studies are needed to understand this pattern further. Body size has been successfully used to explain ungulate niche differentiation with regards to food requirements and predator sensitivity (Veldhuis et al., 2019). Previous studies in parts of Asia show that smaller ungulate species persist more widely than larger species (Karanth, 2016; Phumanee et al., 2020). Whereas muntjac and wild pig occurred at more sites than sambar and gaur in Thailand (Phumanee et al., 2020), gaur and pig were the least and most wide-ranging species in Karnataka Western Ghats landscape (Karanth, 2016). Contrastingly, Lamichhane et al. (2020) found that barking deer had lowest site occupancy in comparison to other species in Shuklaphanta National Park, Nepal. Hence, there exists much variation in ungulate occupancy patterns in regards to body size, perhaps influenced by local habitat, environmental factors and anthropogenic pressure. We found that large ungulates occur at a higher number of sites, and that gaur and pig both had higher rates of occupancy, in contrast to Karanth (2016) study.

Thirdly, distance from stream edge was a dominant predictor of mammal detection probabilities (**Figure 6** and **Supplementary Table 3**). As distance from stream increased, we observed a drop in the probabilities suggesting that ungulates in riparian forests congregate near streams. It is now well established that rivers, riparian forests and adjacent upland forests are part of a single large contiguous system composed of different smaller units of landscape. Hence viewing riparian forests as part of river continuum framework is essential. Among other riparian habitat factors, elevation was an important feature that influenced species persistence across seasons conforming with the previous occupancy study by Karanth (2016). Canopy cover and number of trees also affected species occupancy, colonization and extinction in our study, as we had hypothesized (**Table 2**).

Testing the role of riparian forests, especially in regards to stream proximity, is important to understand how climate change will affect ungulate communities (Speakman and Król, 2010; Fuller et al., 2014; Shreshtha et al., 2014; Veldhuis et al., 2019), because increasing land temperatures, changing rainfall regimes and habitat fragmentation increase the risk of regional extinctions (Ripple et al., 2015). The integration of food and water requirements, predation risk and thermoregulation constraints yields a multi-dimensional framework that generates testable predictions to understand ungulate assemblages (Veldhuis et al., 2019). Our work adds to this framework by documenting persistence of forest mammals in riparian forests. Our testing focused on habitat cover and proximity to water and this offers insights into mammal persistence in an altered habitat regime.

Mammal Persistence in Koyna Reservoir: Nilsson and Dynesius (1994) report two major impacts of dams to be the permanent inundation of vast areas of land and disruption of the seasonal flood regime along the river. Other local disturbances due to dam construction may be highly variable globally; however, Alho (2011) generally describes what land mammals





face when a river dam is constructed. The prolonged noise produced by machinery, light, presence of workers and other activities during the period of construction disturb wild animals, which will then try to escape to adjacent habitats. Large dams take a long time to complete—Koyna Dam construction began in 1954 and was completed in 1963. The formation of the reservoir displaces resident animals to nearby areas where higher densities of individuals of the same species are already resident. This phenomenon is termed as the reservoir's extended effect (Sá, 1995; Alho, 2011). This renders free ranging individuals



without fixed home ranges more vulnerable and they eventually submit to resident individuals in disputes/competition over natural resources. The result is that animals displaced by the effects of reservoir will die or move to more vulnerable areas. However, once a reservoir is complete and a substantial amount of time has passed, mammals adapt to their surroundings. In our case, 55 years have passed since the Koyna Dam was completed. The landscape has since experienced numerous changes in terms of land and river structure as well the socio-political context. Many villages in the valley have been relocated, firstly when the dam was being constructed and secondly when the area was notified as a wildlife sanctuary in 1985. Tigers also experienced local extinction from Koyna landscape with the last confirmed tiger record from Koyna in 2007. With this study, we know the present status of wildlife in the reservoir, acknowledging that severe changes in mammal community may have taken place which went predominantly undocumented. However, this may be treated as a baseline study on mammal ecology in reference to the Koyna Hydropower Dam five decades after its construction.

Management Implications: Our findings have high relevance for management of riparian forests and accordingly how species can be managed within a reservoir. Habitat variables that contribute to species-specific occupancy and long-term wellbeing were identified which can be prioritized in management plans. By conserving these factors, wildlife authorities can increase long term species persistence and strategically attempt to limit seasonal and local species extinctions. In addition to highlighting species-habitat relationship patterns of mammals utilizing riparian forests, the information generated in this study provides a strong empirical basis for developing catchmentwide and multi-species strategies for conservation management. Management strategies that have focused only on one key aspect and have simplified riverscapes have inevitably failed. Multi-landscape planning that encompasses streams, rivers and adjacent riparian forests which go beyond conventional planning of a single landscape unit, have had overarching benefits (Naiman and Rogers, 1997; Hermosa et al., 2012; Adams et al., 2014). We implemented a novel field design to study riparian forest use across an entire catchment. This approach employs a robust sampling design by incorporating riparian forests adjacent to all stream types of a catchment which presents a better understanding of mammalian occupancy along different stream types. Following this design, researchers can study species assemblages and help management agencies to efficiently draft plans that manage multiple species rather than focusing on only one charismatic species.

DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/**Supplementary Material**, further inquiries can be directed to the corresponding author.

ETHICS STATEMENT

The animal study was reviewed and approved by the Wildlife Institute of India. There was no handling of animals. All surveys were non-invasive in nature (camera traps). All necessary codes of conduct were followed and surveys were permitted by national (Wildlife Institute of India/National Tiger Conservation Authority) and state (Maharashtra Forest Department) authorities.

AUTHOR CONTRIBUTIONS

RK, CB, and SJ: study design. SJ, AG, and NG: data collection. SJ: data analysis and writing. RK, MH: supervision, assistance with

data analysis and writing. All authors contributed to the article and approved the submitted version.

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SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fevo.2021. 643285/full#supplementary-material

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Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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