# Predicting Potential Habitat Suitability for an Endemic Gecko Calodactylodes aureus and its Conservation Implications in India

S. M. MAQSOOD JAVED $^{1*}$ , MITHUN RAJ $^2$  & SUNIL KUMAR $^3$ 

<sup>1</sup>H.No. 2-5-26/H, Flat No. 122, 1st Floor, HHH Suites, Pillar No. 202, Upparpalle Rajendranagar, Hyderabad, Ranga Reddy District-500048, Telangana, India
<sup>2</sup>Plot No. 28, Sri Sai Nagar Colony, Kanajiguda, Secunderabad, Hyderabad–500015, Telangana, India

<sup>3</sup>1499 Campus Delivery, Natural Resource Ecology Laboratory, Colorado State University, Fort Collins, Colorado, 80523, USA

Abstract: The Indian Golden Gecko Calodactylodes aureus (Beddome 1870) is an endemic reptile species largely confined to the Eastern Ghats, India. To estimate its potential habitat suitability, species distribution modelling (SDM) was carried out based on occurrence data and climatic and topographic datasets. We used Maximum Entropy (MaxEnt) model for predicting potential habitat suitability for *C. aureus*. The MaxEnt model predicted potential suitable habitat for *C. aureus* mainly in the northern and southern parts of Eastern Ghats spread across Odisha, Andhra Pradesh and Tamil Nadu states. Majority of the suitable habitat areas identified by MaxEnt are outside the protected areas and experience high anthropogenic pressure. Slope and mean diurnal range in temperature were the strongest predictors of *C. aureus* habitat suitability in the Eastern Ghats. Our results can be effective tools in exploring new ways of understanding *C. aureus* ecology and biogeography, and for planning and future surveys, and prioritizing conservation activities.

**Key words:** Biodiversity conservation, habitat suitability modelling, geckos, MaxEnt, maximum entropy model, protected areas.

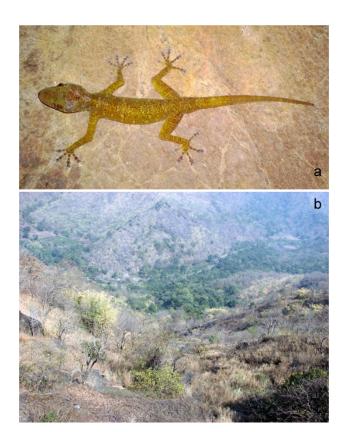
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#### Introduction

The Indian Golden Gecko Calodactylodes aureus (Beddome 1870) occurs in rupicolous habitats in forested tracts along the seasonal streams and few areas close to human habitation (Fig. 1a, b) (Bauer & Das 2000; Javed et al. 2007; Russell & Bauer 1989). It was rediscovered in 1986 after more than 100 years. The Gekkonoidae family are the most primitive living saurians and the genus Calodactylodes consists of large, distinctive geckos endemic to rocky habitat in peninsular India and Sri Lanka. The genus Calodactylodes can be identified on the basis of derived

digital structure, the presence of paraphalanges, bright yellow gular patch (in adult males) and distinctive vocalization. The Golden Gecko is of special interest to herpetologists worldwide as it represents one of the two known species in the genus *Calodactylodes*, which are considered as Gondwanan relics (Bauer & Das 2000). It is unclear how extensive the range of *C. aureus* is, but the few localities known suggest that it is widespread in the southern portion of Eastern Ghats. It is expected to occur wherever appropriate rocky habitats are present. The portion of the Eastern Ghats inhabited by *C. aureus* is relatively xeric and the vegetation is dominated by dry

<sup>\*</sup>Corresponding Author; e-mail: javedbiodiversity@gmail.com



**Fig. 1.** (a) The Indian Golden Gecko (*Calodactylodes aureus*) in its natural habitat; (b) Overview of typical habitat of *C. aureus* depicting hilly terrain with valley bearing dry deciduous forest. (Photographed by S. M. Maqsood Javed).

deciduous and thorn scrub (Legris & Meher-Homji 1982). Diet mainly consists of small insects and larval forms.

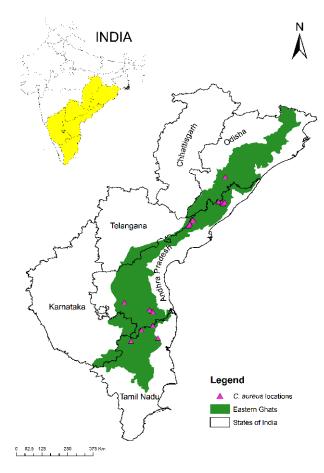
The present study was conducted using Species Distribution Modelling (SDM) techniques to develop a broader understanding of its potential habitat distribution, biogeography, and the relevance of these techniques in biodiversity conservation practices considering climatic and topographical factors.

Assessing the status, pattern and range distribution is a challenge, especially when a species is cryptic, shy, nocturnal as well as semi-diurnal in nature. However, it is essential to more precisely determine the distribution of a species in the wild, particularly when it is an endemic and threatened by deforestation, habitat fragmentation and anthropogenic exploitations (Kumara *et al.* 2009). The genus *Calodactylodes* (Beddome 1870) is restricted to tropical South Asia and is represented by two species: the Indian Golden Gecko *Calodactylodes aureus* and the Sri Lankan

Golden Gecko Calodactylodes illingworthorum (Deraniyagala 1953). Calodactylodes aureus is distributed along the coastal hills of Andhra Pradesh, southern Odisha and northern Tamil Nadu regions of Eastern Ghats, India (Bauer & Das 2000; Dutta et al. 2005; Javed et al. 2007; Chakrapani et al. 2014).

There have been several reports of discovery (unpublished) and photography of a gecko similar to C. aureus from Castle Rock, north Karnataka (Bauer & Das 2000) which suggest either a wider peninsular distribution for C. aureus or the occurrence of a new species in the northern Western Ghats. Whereas, Chettri & Bhupathy (2010) mentioned that these reports from northern Western Ghats are erroneous. However, in a very recent development this gecko was recorded for the first time from the state of Karnataka (Srinivasulu et al. 2014) which further strengthens the claims of wider distribution than known range within India. Calodactylodes aureus is of special interest to herpetologists worldwide due to its unique toe morphology and breeding habits (Javed et al. 2007; Sreekar et al. 2010). Calodactylodes aureus possess a unique pattern of paraphalangeal cartilages and paired structures occurring lateral to the joints in the digits of the geckos (Russell & Bauer 1989). This gecko generally prefers riparian habitat with boulders and dense vegetation. It also has a very unique breeding plan or behaviour; lays eggs under the roof of the boulders and more than one female lays eggs at same site as a case of egg laying site fidelity. The clutch size varies from five to several eggs with very tough eggshell. Therefore, C. aureus is placed in Schedule I (Part II) of the Indian Wildlife Protection Act, 1972, and is listed as "Least Concern" in IUCN Red list. However, key factors like, typical toe morphology, breeding habit, threats to its habitat and restricted known current distribution strongly makes a case of elevating the status of C. aureus to an "Endangered" species under IUCN Red list.

Currently, as per confirmed occurrences, *C. aureus* thrives in small pockets restricted to a defined set of ecological conditions in its known distribution range which is under a series of ever increasing anthropogenic threats. Recently, sightings from the vicinity of earlier known locations were published along with brief information on its breeding and habitat selection (Chettri & Bhupathy 2010; Kalaimani & Nath 2012; Sreekar *et al.* 2010). But, there is still lack of comprehensive information on its ecology and potential habitat distribution, which is very crucial



**Fig. 2.** Study area map showing the Indian Golden Gecko (*Calodactylodes aureus*) occurrence points in the Eastern Ghats.

for sustainable conservation of this species. Thus, identifying potential distribution range of this endemic Gecko species using Species Distribution Models (SDM) becomes important in the tropical region of the Eastern Ghats where vast areas still remain unexplored.

SDMs are being widely used at multiple scales to predict the geographical distribution of habitat suitability or species potential distributions (Franklin 2009; Kumar & Stohlgren 2009; Rushton et al. 2004; Scott et al. 2002). These models and their resulting predictions are used for conservation planning and land management (Burgman et al. 2005; Ferrier et al. 2002), and to predict the impacts of climate change on species and ecosystems (Araújo et al. 2006; Iverson & Prasad Khanum et al. 2013). 1998: Furthermore. predictions from SDMs have been used to address basic research questions in ecology and biogeography regarding environmental versus biotic control on species distribution and abundance,

niche differentiation and patterns of species richness even with low occurrence data (Jetz & Rahbek 2002; Pearson *et al.* 2007; Raxworthy *et al.* 2003; Sreekumar *et al.* 2016).

This study was conducted after collecting occurrence points and establishing a model based on SDM. Our study is an attempt to produce potential habitat distribution maps of C. aureus using SDM for planning future surveys using systematic scientific sampling and habitat evaluation. These maps fill persisting gaps and provide valuable biogeographical information that may help target surveys to accelerate the discovery of unknown populations of C. aureus in peninsular India (Raxworthy et al. 2003). It is also important to note that these maps identify regions that have environmental conditions where species currently maintains populations should not be interpreted as the actual limits of the range of the species (Pearson et al. 2007).

### Materials and methods

We used SDM methods that have been successfully executed using a small sample size in the context of endangered and threatened species (Kumar & Stohlgren 2009; Pearson *et al.* 2007). It is well known that the distribution data on cryptic, nocturnal, threatened and endangered species are often sparse and clustered (Ferrier *et al.* 2002). But, the aforesaid methodology paves the way to overcome difficulties in modeling species' suitable habitat using smaller number of samples.

We collected 22 occurrence points for C. aureus species from our surveys using Garmin eTrex GPS during an earlier regional herpetofauna inventory, opportunistic visits and published data from the Eastern Ghats, peninsular India (Fig. 2). During the survey, a conventional distance sampling and a line transect method was adopted. Opportunistic searches were carried out during day and night and included slow walking among the rock boulders along all the habitats over a vast area. Both vertical and horizontal crevices in rock boulders were searched intensely for recording the presence of golden geckos. Every rock boulder was searched for the presence of geckos and number of geckos observed was noted down. We state clearly that no specific permissions were required for these locations/activities because the species is also sighted in and around the public places. It is currently not listed as an Endangered Threatened species. No specimen was collected.

#### Study area

The Eastern Ghats are represented by several broken and isolated hills of the Deccan Plateau. These hills (11°03′–22°03′ N and 77°02′–87°02′ E) extend over a stretch of 1,750 km starting from south of the Chota-Nagpur Plateau in Odisha to south western peninsula in Tamil Nadu via passing through the state of Andhra Pradesh (Mani 1995) (Fig. 2). The total area of the Eastern Ghats comprises of about 232,290 km<sup>2</sup>. According to Rodgers et al. (2002), the Eastern Ghats were included under 6C Eastern Highlands of the Deccan Plateau, which is one of the biologically richest 'Biogeographic Zones' in India. The northern and southern sections of the Eastern Ghats are separated by the delta of the River Godavari, which is approximately 130 km in width. Other important breaks are formed by the drainages of the rivers Mahanadi and Krishna. The Biligirirangan Hills at 1,750 m is the highest range in the Eastern Ghats. Moisture regimes show a general gradient, from a relatively mesic northern range, with dry and moist deciduous forests, to a relatively dry southern subzone, with dry deciduous and thorn scrub (Legris & Meher-Homji 1982). Unlike the Western Ghats, studies on the distribution of reptiles in the Eastern Ghats are scanty (Bauer & Das 1999). Srinivasulu and Das (2008) recommended detailed analysis of faunal relationships along the Eastern Ghats, including comparative diversity of lineages as an effect of breaks in the continuity of the ranges, humidity, and elevation effects. They also recorded fragmented distribution of species like C. aureus that is known from both north and south of the range of Eastern Ghats; reinforcing the argument for more sampling of the fauna.

#### Data and model building

We used 22 occurrence points for *C. aureus* habitat suitability modeling; two occurrences were dropped during spatial filtering to reduce model complexity and minimize the effects of spatial autocorrelation (Boria *et al.* 2014). We considered 23 environmental predictor variables representing climate (19 bioclim variables; Hijmans *et al.* 2005), vegetation and topography (elevation, slope, and aspect). All environmental predictor variables were re-sampled to ~1 km × 1 km spatial resolution (Albers Equal Area Conic projection, WGS 84 datum). Twenty environmental variables including bioclimatic and elevation were extracted from the WorldClim database (Hijmans *et al.* 2005) (http://

www.worldclim.org/) and a global land cover variable data of 1 km resolution was downloaded from the European Commission web site (http://bioval.jrc.ec.europa.eu/products/glc2000/products.p hp). Slope and aspect were generated in GIS using elevation data from WorldClim database.

#### Model development and analysis

It has been shown that the choice of predictor variables has a significant effect on model accuracy (Peterson & Nakazawa 2008). Models developed with predictor variables that have a direct effect on species distribution are considered more accurate, biologically informative and generalizable (Austin  $et\ al.\ 2006$ ). Furthermore, SDM results are difficult to interpret when predictor variables are correlated (Kivinen  $et\ al.\ 2008$ ); so only less correlated variables (Pearson correlation coefficient |r|<0.80) were used in the MaxEnt model (Dormann  $et\ al.\ 2013$ ).

We used Maximum Entropy model "MaxEnt" version 3.3.3k (Phillips et al. 2006; http://www. cs.princeton.edu/~schapire/maxent/) as it uses presence-background data and has been shown to perform well for species with small sample sizes (Benito et al. 2009; Elith et al. 2006; Hernandez et al. 2006; Kumar & Stohlgren 2009; Ortega-Huerta & Peterson 2008; Papes & Gaubert 2007; Pearson et al. 2007; Wisz et al. 2008). Initially 22 variables were considered in the model (Appendix A), but based on training gain; variable contribution and multicollinearity only four variables were finally used - mean diurnal range in temperature (bio2), temperature annual range (bio7), precipitation of driest quarter (bio17) and slope. We used "(n-1)jackknife" or "leave-one-out" approach suggested by Peterson et al. (2011). Pearson et al. (2007) used a delete-one jackknife to develop a test assessing the statistical significance of ENMs made with small numbers of occurrence records (Shcheglovitova & Anderson 2013). Initially, default settings in MaxEnt were used viz., the convergence threshold (10<sup>-5</sup>), the maximum number iterations (5000) and the logistic output format (Phillips & Dudík 2008). The MaxEnt model was run with different regularization parameter values (1.0, 1.5, and 2.0). The "fade-by-clamping" procedure was used to avoid erroneous predictions outside the environmental range of training data. We ran 20-fold cross-validation for testing the model performance. A bias surface was generated using SDM toolbox (Brown 2014) and used in MaxEnt to account for possible sampling bias in C.

aureus occurrence data. Model was trained for the Eastern Ghats extent which includes currently reported *C. aureus* occurrences and areas that have been accessible to the species to disperse and colonize (Soberon & Peterson 2005). This model was then projected to peninsular India including four states (Fig. 2).

Model performance was evaluated using the Area Under the Receiver Operating Characteristic (ROC) Curve (AUC) (Elith et al. 2006; Phillips et al. 2006) and omission rates at two thresholds (Boria et al. 2014; Kumar 2014). AUC is a threshold independent measure of discrimination and varies from 0.5 to 1. An AUC value of 0.5 represents a model with random predictions and values closer to one represent higher discrimination. An AUC value between 0.9-1.0 show excellent model performance; 0.8-0.9 = good; 0.7-0.8 = average; 0.6-0.7 = poor; 0.5-0.6 =insufficient (Thuiller et al. 2003). The AUC values should be interpreted with caution as it gives equal weights to commission and omission errors (Lobo et al. 2008; Peterson et al. 2008). Because of the small sample size we could not calculate Partial AUC ratio as suggested by Peterson et al. (2008). Two omission rates (OR) were calculated following Boria et al. (2014): OR at 0% training mission or lowest predicted threshold (LPT), and 10 % training omission. Omission rates assess a model's performance ability; lower OR indicates higher performance. Specificity (i.e. percentage of correctly classified absences) was not used because no absence data were available. To evaluate the importance of environmental predictor variables, we used jackknife procedure in MaxEnt. Variables that produced the highest training gains are considered to be the most important predictor variables (Kouam et al. 2010). We also examined the response curves that show the relationships between the environmental predictor variables and the probability of species presence.

Initial model was run with default settings in MaxEnt. However, the default settings produced relatively complex model and higher test omission rates. MaxEnt model included only Linear, Quadratic and Hinge features because of smaller sample size. Next, several experiments were conducted with different combinations of environmental variables and regularization multiplier values (ranging from 1–3) and optimal model was selected based on highest test AUC values, and lower omission rates.

For an appropriate model, areas of high probability will cover the majority of presence records and areas with low probability will be characterized by lower possibility of presence records or species absence (Yost et al. 2009). MaxEnt model produced a continuous layer of probability of presence for C. aureus. We used "minimum training presence logistic threshold of 0.1" and a "10th percentile training presence logistic threshold of 0.3", thresholds to convert it to binary maps showing suitable and unsuitable habitat for C. aureus. The predicted probability of presence was reclassified into four arbitrary habitat suitability classes (0.0-0.1, 0.1-0.3, 0.3-0.6 and > 0.6) and a relative habitat suitability map was prepared. Further, area of each class was calculated by tabulating in Geographical Information System (GIS) environment. The SDM predicted area was calculated following data manipulation in GIS environment. The SDM was confined to Eastern Ghats of peninsular India using accepted Eastern Ghats boundary obtained from open source followed by extrapolation using projection layers of peninsular India. DIVA GIS domain version 7.5.0 was used for handling and preparation of maps. A combined map of potential distribution of C. aureus was prepared by overlaying currently known occurrences. The extent of overlap between the protected area (PA) network and the spatial distribution of suitable and unsuitable habitat obtained from the current study was analysed by superimposing the respective combined map of four states (Andhra Pradesh, Karnataka, Odisha and Tamil Nadu) in peninsular India.

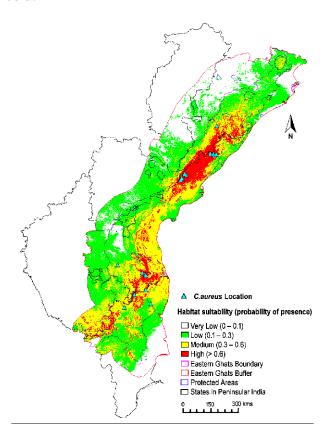
#### Results

Distribution range prediction of *C. aureus* was exceptional and coincided well with the known distribution of the species. The model predicted suitable habitat were more extensive and reached beyond the study area boundary (Eastern Ghats) towards the other parts of peninsular India (Figs. 3, 4). The average test AUC value for this model was 0.84 and model correctly predicted the known range of the species (Fig. 5; Table 1). The percent variables contributions and jackknife procedure in MaxEnt showed that slope and mean diurnal range in temperature (bio2) had the greatest effects on C. aureus distribution (Table 1 and 3; Fig. 5). The probability of presence of C. aureus increased with increaseing slope, and initially increased with an increase in temperature annual range (up to 5 °C) and then decreased slowly (Fig. 6A, B). The probability of presence was

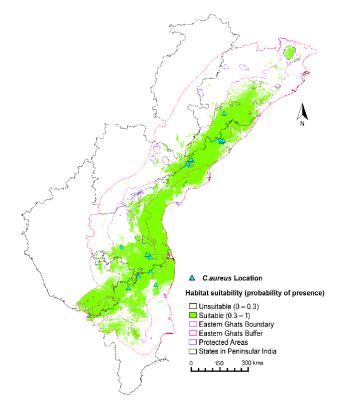
Table 1.	MaxEnt mode	l selection	summary	for Gecko.
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Model variables (in order of	Number of	Regularization	0% Test	10% Test	Average
their decreasing importance)	environmental	Parameter (L)	Omission	Omission	$\operatorname{test} \operatorname{AUC}$
	variables		Rate	Rate	
Slope, bio2, bio7, bio17	4	1.0	0.10	0.10	0.84
Slope, bio2, bio7, bio17	4	1.5	0.15	0.15	0.82
Slope, bio2, bio7, bio17	4	2.0	0.15	0.15	0.81
Slope, bio2, bio17	3	1.0	0.05	0.20	0.83
Slope, bio2, bio17	3	1.5	0.10	0.15	0.82
Slope, bio2, bio17	3	2.0	0.10	0.15	0.82
Slope, bio7, bio2	3	1.0	0.05	0.20	0.85
Slope, bio7, bio2	3	1.5	0.05	0.15	0.83
Slope, bio2	2	1.0	0.10	0.15	0.81
Slope, bio2	2	1.5	0.10	0.15	0.80
Slope, bio2, bio7, bio17,	5	1.5	0.25	0.25	0.81
elevation					
Slope, bio2, eastness, bio7,	6	1.5	0.25	0.25	0.79
bio17, elevation					

Note: Bio2 is mean diurnal range in temperature; bio7 is temperature annual range; and bio17 is precipitation of driest quarter; AUC is area under the Receiver Operating Characteristic (ROC) curve. The best model is shown in **bold**.



**Fig. 3.** Predicted habitat suitability (probability of presence) for the Indian Golden Gecko (*C. aureus*) in peninsular India.



**Fig. 4.** Predicted suitable and unsuitable areas for the Indian Golden Gecko (*C. aureus*) covered under Protected Areas network in Peninsular India. Binary map was prepared based on 10th percentile training presence logistic threshold of 0.3.

**Table 2.** Estimates of relative contributions of the environmental variables to the MaxEnt model for distribution modeling of the Indian Golden Gecko (*C. aureus*) in the Eastern Ghats of India. Values shown are averages over 20 runs.

Variable	Percentage contribution	Permutation importance
$Slope^{\gamma}$	48.3	15.7
Mean diurnal range in temperature (Bio2; °C)*	20.2	23.7
Temperature annual range (Bio7; °C)*	20.1	26.6
Precipitation of driest quarter (Bio17; mm)*	11.4	34.0

Data sources: \*Bioclim variables (Bio1–Bio19) were obtained from WorldClim dataset (http://www.worldclim.org/).

YSurface Radar Topography Mission (SRTM) - http://srtm.csi.cgiar.org/

highest at the intermediate levels of temperature annual range (Fig. 6C), and was highest when precipitation of driest quarter was between 5–25 mm (Fig. 6D).

The best MaxEnt model predicted a total of 418,176 km<sup>2</sup> area as suitable for C. aureus with a threshold of 0.1. The class with the highest suitability (> 0.6) for the C. aureus had an area of about 60,956 km<sup>2</sup> (Fig. 3). However, the binary map of predicted probability with a threshold of 0.3 revealed about an area of 209,975 km<sup>2</sup> (Fig. 4). A combined binary map of potential distribution range of C. aureus and Protected Areas (PAs) network indicated that very small predicted potential area is covered by the existing PAs (Fig. 4; Table 2). Currently, 38 PAs are known from the buffer study area spread across six states of peninsular India including Eastern Ghats, covering an area of 25,810 km<sup>2</sup> representing 4.66% of the total study area (i.e., 553,704 km²). In total within the 38 PAs only 7 PAs have the potential predicted suitable habitat of 7,687 km<sup>2</sup>, which is about 29.7% of the total PAs area (i.e., 25,810 km<sup>2</sup>).

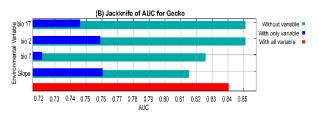
#### **Discussion**

SDMs were applied to predict potential suitable habitat for *C. aureus* which has restricted distribution only in parts of the Eastern Ghats in

**Table 3.** Protection status of the area under modeled potential distribution of the Indian Golden Gecko (*C. aureus*) in the states of peninsular India.

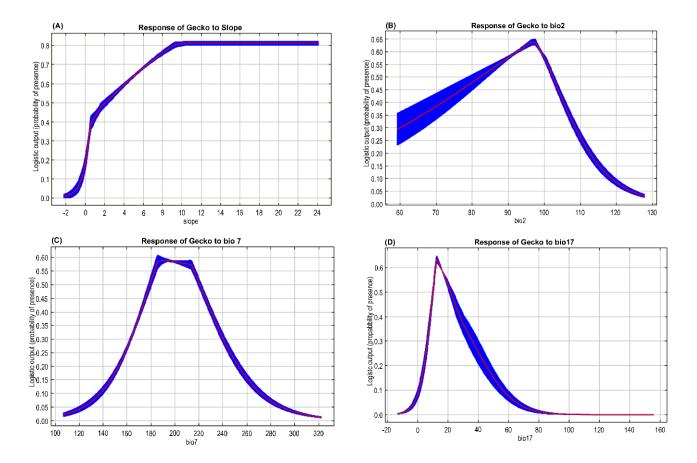
States in peninsular India	Number of PAs (Protected Areas) within Eastern Ghats + Buffer Zone	Total area under PAs (km²) within Eastern Ghats + Buffer Zone	Total PAs area covered by MaxEnt (km²) within Eastern Ghats + Buffer Zone
Andhra Pradesh	13	1767	1768
Fradesn Karnataka	5	1809	1767
Odisha	12	3159	2353
Tamil Nadu	1	32	32
Telangana	3	1855	526
Total	34	8622	6446





**Fig. 5.** Environmental variable contributions to (A) regularized training gain, and (B) AUC (Area under the curve) of the final model for the Indian Golden Gecko (*C. aureus*). The x-axis represents a measure of model predictive ability using 'regularized training gain' and 'AUC.' Values shown are average over 20 replicate runs.

peninsular India. The predictive maps for *C. aureus* showed highly suitable habitats in the northern and southern regions of Eastern Ghats surrounding the occurrence points. A few isolated populations are found on the edge of the predicted distribution range or have left with very little potential predicted area as revealed by the model. MaxEnt model projections to peninsular India revealed probable extension of predicted suitable range beyond the boundary of the Eastern Ghats. Of the four predictor variables used to build our model, slope and mean diurnal range in tempe-



**Fig. 6.** Relationships between top environmental predictors and the probability of presence of the Indian Golden Gecko (*Calodactylodes aureus*); (A) Slope (%), (B) Mean diurnal range (mm; Bio2 Bioclimatic variable), (C) Temperature annual range (°C; Bio7 Bioclimatic variable), and (D) Precipitation of driest quarter (mm; Bio17 Bioclimatic variable). Each of the following curves represents a different MaxEnt model created using only the corresponding variable. Blue margins are ±1 standard deviation calculated over 20 replicates.

rature (bio2) emerged as the strongest range predictors. The mean diurnal range in temperature was important predictor of suitable habitat because of its potential influence on *C. aureus* physiology and daily activities. A projected map of the potential prediction of the *C. aureus* in peninsular India indicates wider distributional range, hereby confirming previous suggestions about possible extension of distribution of this species by Bauer and Das (2000).

The results of this study indicate that SDMs offer important new insights on the biogeography of *C. aureus* throughout the five states of peninsular India. Importantly, we found that the potential ranges of *C. aureus* are poorly covered by the existing protected areas (PAs). The major PAs that contain the potentially suitable habitat for *C. aureus* are the Eturnagaram, Kawal, Koundinya, Papikonda, Sri Penisula Narasimhaswamy, and Sri Venkateshwara in Andhra Pradesh; Badrama,

Debrigarh, Karlapat, Khalasuni, Lakhari Valley, and Sunabedain Odisha; and Bannerghatta, Bhadra, Biligiri Rangaswamy Temple, Cauvery, Dandelli, and Shettihalli in Karnataka. Our study presents a preliminary map of C. aureus habitat suitability. We suggest that our results should be used to design science-based surveys for collection of presence-absence data for *C. aureus* covering its predicted range. This presence-absence data should be used in a future study to generate better habitat suitability maps which can be used for recommending establishment of additional PAs in the region to safeguard this endemic gecko along with its associated biodiversity. Creation of additional PAs will be helpful to check the rate of deforestation and other negative anthropogenic factors within the region. This study also showed SDMs to be useful tools for predicting the species distribution at primary level. Apart from being a useful planning tool it can also be customised to

play a vital role in assessing the impact of climate change on species distribution as well as an effective tool in monitoring and evaluation of conservation programmes (e.g. Khanum *et al.* 2013).

#### Conservation implications

The known distribution of the Indian C. aureus is restricted to the Eastern Ghats of Andhra Pradesh, Odisha and Tamil Nadu. Initially trade was considered to be a major threat to this endemic gecko (Molur & Walker 1998). However, the current studies show that human interference can be a greater problem because most of the Gecko's habitat is present outside the Pas (Kalaimani & Nath 2012; Kalaimani & Nath 2013; Reddy et al. 2013). The developments during the past decade have increased many folds and drastically fragmented the populations and have cornered them to a few pockets along the Eastern Ghats. Each of these populations is exposed to human interferences respective to the socio-cultural and developmental activities specific to the region. In Odisha and north coastal Andhra Pradesh the major threat to the habitat has been extensive mining for bauxite, iron and other minerals. The problem has been compounded due to the socio-cultural aspects of indigenous communities in the region. Frequent shifting cultivation and lack of awareness towards biodiversity conservation has restricted populations of C. aureus. In Andhra Pradesh the major threat to the viable habitat in the Papikonda National Park is due to construction of large multipurpose dam that has the potential to submerge the entire habitat of the Gecko. This has serious conservation implications as its unique habitual instincts are closely linked to its habitat. In Tamil Nadu, habitat loss due to land use conversion from natural vegetation to cultivation is predominant. Large boulders and crevices are an important part of Gecko's breeding habitat which are being plundered to fuel various developmental activities in the region. Given the current conservation status of the *C. aureus* it may soon become extinct without upgrading its IUCN status. Therefore, suitable steps to preserve its existing potential habitat are strongly recommended.

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#### Author Contributions

Conceived and designed the experiments: SMMJ and SK. Performed the experiments: SMMJ, SK and MR. Analyzed the data: SMMJ, SK, MR. Wrote the paper: SMMJ, SK, MR.

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## **Supporting Information**

Additional Supporting information may be found in the online version of this article.

**Table S1.** Environmental variables used for distribution modeling of the Indian Golden Gecko (*Calodactylodes aureus*) in the Eastern Ghats of India. Sources of Data: BIO1–BIO19 were obtained from WorldClim dataset (Hijmans et al. 2005) at (www.worldclim.org). Topographic data were obtained from Surface Radar Topography Mission (SRTM; http://srtm.csi.cgiar.org/). The land use land cover data layer was acquired from European Commission, Joint Research Center, Global Land cover 2000 Products (http://bioval.jrc.ec. europa.eu/products/glc2000/products.php).