#### RESEARCH ARTICLE



# Exploring dispersal barriers using landscape genetic resistance modelling in scarlet macaws of the Peruvian Amazon

George Olah • Annabel L. Smith • Gregory P. Asner • Donald J. Brightsmith • Robert G. Heinsohn • Rod Peakall

Received: 18 July 2016/Accepted: 20 October 2016/Published online: 21 November 2016 © Springer Science+Business Media Dordrecht 2016

#### **Abstract**

Context Dispersal is essential for species persistence and landscape genetic studies are valuable tools for identifying potential barriers to dispersal. Macaws have been studied for decades in their natural habitat, but we still have no knowledge of how natural landscape features influence their dispersal.

Objectives We tested for correlations between landscape resistance models and the current population genetic structure of macaws in continuous rainforest to explore natural barriers to their dispersal.

Methods We studied scarlet macaws (Ara macao) over a 13,000 km<sup>2</sup> area of continuous primary Amazon rainforest in south-eastern Peru. Using remote sensing imagery from the Carnegie Airborne Observatory, we constructed landscape resistance surfaces

**Electronic supplementary material** The online version of this article (doi:10.1007/s10980-016-0457-8) contains supplementary material, which is available to authorized users.

G. Olah (🖾) · R. G. Heinsohn Fenner School of Environment and Society, The Australian National University, Frank Fenner Building No 141, Canberra, ACT 2601, Australia e-mail: george.olah@anu.edu.au

G. Olah · A. L. Smith · R. Peakall Research School of Biology, The Australian National University, Canberra, ACT 2601, Australia

A. L. Smith School of Natural Sciences.

School of Natural Sciences, Zoology, Trinity College Dublin, The University of Dublin, Dublin 2, Ireland in CIRCUITSCAPE based on elevation, canopy height and above-ground carbon distribution. We then used individual- and population-level genetic analyses to examine which landscape features influenced gene flow (genetic distance between individuals and populations).

Results Across the lowland rainforest we found limited population genetic differentiation. However, a population from an intermountain valley of the Andes (Candamo) showed detectable genetic differentiation from two other populations (Tambopata) located 20–60 km away ( $F_{\rm ST}=0.008$ , P=0.001–0.003). Landscape resistance models revealed that genetic distance between individuals was significantly positively related to elevation.

Conclusions Our landscape resistance analysis suggests that mountain ridges between Candamo and Tambopata may limit gene flow in scarlet macaws. These results serve as baseline data for continued

G. P. Asner

Department of Global Ecology, Carnegie Institution for Science, 260 Panama Street, Stanford, CA 94305, USA

D. J. Brightsmith

Department of Veterinary Pathobiology, Schubot Exotic Bird Health Center at Texas A&M University, College Station, TX, USA



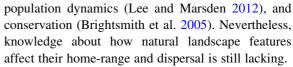
landscape studies of parrots, and will be useful for understanding the impacts of anthropogenic dispersal barriers in the future.

**Keywords** Population genetics · Dispersal · Movement ecology · Feathers · Microsatellites · Neotropics · Andes · Barriers · LiDAR

#### Introduction

Dispersal is an important ecological process as it allows individuals to locate new resources, avoid competition, and avoid inbreeding depression. On a larger scale, dispersal influences spatial population dynamics, maintains genetic diversity and enables adaptation (Clobert et al. 2012; McDougald et al. 2012; Szövényi et al. 2012; Orsini et al. 2013; Smith et al. 2016). Flight ability is assumed to be a good proxy for dispersal (Hanski et al. 2004; Kokko and López-Sepulcre 2006) as it often correlates with range size (Böhning-Gaese et al. 2006), but understanding what influences dispersal in flying species at a landscape scale is important. Both natural and manmade landscape features can impede gene flow, with roads, rivers, or mountain ridges being potentially impenetrable barriers for some species (Storfer et al. 2007). Direct tracking to infer dispersal across these structures is notoriously difficult (Schofield et al. 2013) but landscape genetics can help elucidate relationships between landscape features and gene flow (Manel et al. 2003; Storfer et al. 2007; Manel and Holderegger 2013), and identify potential dispersal barriers (Andrew et al. 2012).

The Amazon basin is a highly diverse and globally important ecosystem which is undergoing rapid changes such as continual development of highways and gold mining exploration at an enormous scale (Beheregaray and Caccone 2007; Asner et al. 2013; Baraloto et al. 2015; Keenan et al. 2015). To understand the effect of these changes on Amazonian fauna, we need baseline data about their biology and ecology in continuous, natural habitat. Macaws have been studied for decades in their natural habitat in south-eastern Peru, providing insights about their breeding biology (Brightsmith 2005; Vigo et al. 2011; Olah et al. 2014), foraging ecology (Brightsmith 2004), parasitology (Olah et al. 2013),



Recent studies have shown contrasting results about genetic structure in macaws. For example, some studies found very low genetic differentiation among populations in continuous rainforest at scales of 100 km distance (Table 1), which might be expected given their large size and strong flying ability. Other studies, however, showed significant genetic differentiation between populations separated by only 80–170 km (Table 1). Unfortunately, these studies did not explicitly include spatial information in their genetic analyses and they had limited sample sizes mainly from nesting birds, limiting insights into the mechanisms behind these contrasting patterns. More progress can be made in understanding dispersal at landscape scales if spatial information about relevant habitat features is incorporated into landscape genetic analyses and more extensive, non-invasive samples are analyzed from a wide geographic scale (Andrew et al. 2013).

In the Peruvian Amazon, the preferred habitat of scarlet macaws (Ara macao) is considered to be lowland primary rainforest (Collar et al. 2016), consistent with the general pattern of macaw distribution noted by Forshaw (2011) to be up to 500 m above sea level (asl). Within our study site, the foothills of the Andes Mountains rise to over 1000 m asl and thus might act as natural barriers to their dispersal. Scarlet macaws also prefer riverside rainforest habitats with emergent trees so they can access the canopy from the side (Britt et al. 2014), and habitat suitability can influence gene flow (Wang et al. 2008). In this study we used population genetic structure analysis and landscape resistance modelling to test whether elevation, canopy height, river system and above-ground carbon distribution (biomass) might influence dispersal in macaws.

#### Methods

Study site and target species

This study was conducted in the Tambopata/Candamo region of the south-eastern Peruvian Amazon, including two large protected areas: (1) the Tambopata



varying scale and habitat among nonulations macawe with

1 1	Semente premier or	im So mucani a mi	2000	There a region population states of the services of the service and the service and the service and the service services of the service and th					
Species	Countries	Comparison	Distance (km)	Distance Habitat between populations (km)	N	# Genetic markers	$F_{ m ST}$	Ь	References
Scarlet macaw (Ara macao cyanoptera)	Costa Rica	Two populations	08	Montane areas to the coast of the 41; 55 Pacific, roads	41; 55	7	0.048	<0.001	0.048 <b>&lt;0.001</b> Monge et al. (2016)
	Guatemala and Belize	Two populations	170	Heavily degraded landscape (roads, agriculture)	13; 61 11	11	0.2	<0.001	Schmidt (2013)
	Guatemala	Among three focal breeding areas	<35	Primary rainforest	7; 8; 16	11	<0.009	>0.05	Schmidt (2013)
Hyacinth macaw (Anodorhynchus	Brazil	Two populations	100	Cerrado habitat	16; 16	4	0.05	0.12	Faria et al. (2008)
hyacinthinus)	Brazil	Two pairwise populations	1600	Heavily degraded landscape (roads, agriculture, cities)	6; 16; 16	4	>0.25	<0.001	Faria et al. (2008)

National Reserve (13°8′S, 69°37′W; 2747 km²) and (2) the Bahuaja-Sonene National Park (13°30′S, 69°47′W; 10,914 km²). The area is tropical moist forest receiving an average annual rainfall of 3236 mm (Brightsmith 2004). Elevation gradually increases from the Lower Tambopata (lowland rainforest with average elevation of 200 m), to Upper Tambopata (lowland rainforest closer to the foothills of the Andes Mountains, 260 m), and Candamo (intermountain valley, 350 m) surrounded by foothills of the Andes (up to 1300 m) that separate this region from Tambopata (Fig. 1).

The distribution of the scarlet macaw extends from Mexico to Bolivia (BirdLife International and NatureServe 2014). Although population sizes are decreasing in some regions, they are presently listed as Least Concern with an estimated global population size between 20,000 and 50,000 individuals (IUCN 2014). They are secondary cavity nesters using hollows of emergent trees (Brightsmith 2005; Renton and Brightsmith 2009) and also occupy artificial nests in our study site (Olah et al. 2014).

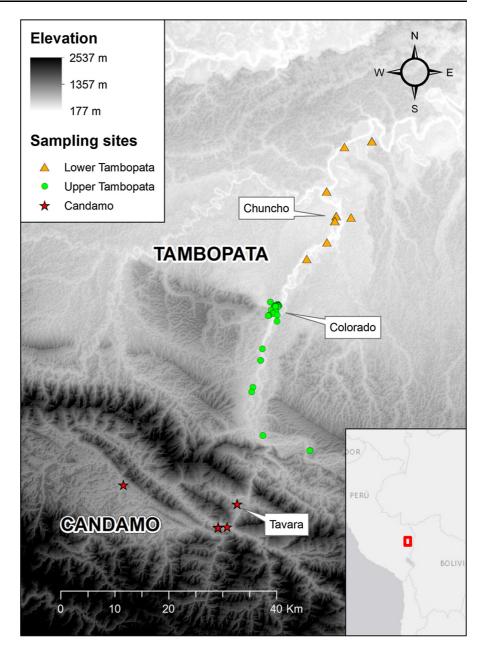
# Sample collection and genetic markers

A total of 166 DNA samples was collected during the breeding season (November-April) each year between 2009 and 2012. We collected 126 DNA samples noninvasively by sampling naturally shed feathers from nests, around nesting and roosting sites, and from clay licks (Fig. 1). We collected about 100 µL of blood from the jugular vein of 22 macaw nestlings and 18 adults in natural and artificial nests, accessed by using single-rope ascending techniques (Olah et al. 2014). Blood samples were stored in 70 % ethanol or on FTA paper (Whatman). When blood samples from known family units were identified, siblings or parent/offspring samples were excluded from the analyses (keeping samples of one parent whenever possible), so that only non-related individuals were included in the data set.

DNA was amplified at nine species-specific, polymorphic microsatellite markers: SCMA 09, SCMA 14, SCMA 22, SCMA 26, SCMA 30, SCMA 31, SCMA 32, SCMA 33, SCMA 34 (Olah et al. 2015). Genotyping errors were calculated from randomly selected samples that yielded full genotype data, and the markers selected in this study showed low or no error and low amplification failure (Olah et al. 2016).



Fig. 1 Locations of scarlet macaw (*Ara macao*) DNA samples in the foothills of the Andes, south-eastern Peru. Sampling sites were located around three major clay licks: Chuncho (N = 26), Colorado (N = 35), and Tavara (N = 19)



Molecular sexing of individuals was performed using the P8\_SCMA\_F/P2\_SCMA\_R primers (Olah et al. 2016).

### Population-level genetic differentiation

We divided the study area into three sampling sites based on geographic location: Lower Tambopata (N = 54), Upper Tambopata (N = 82), and Candamo (N = 30), which were mainly aggregated around large

clay licks (Fig. 1). We used analysis of molecular variance (AMOVA) in GenAlEx 6.5 (Peakall and Smouse 2006, 2012) to partition genetic variation within and among these sampling sites and to estimate overall and pairwise population genetic differentiation ( $F_{\rm ST}$ ) (Wright 1965; Excoffier et al. 1992; Peakall et al. 1995). Tests for genetic differentiation were performed by 1000 random permutations. In order to assess if there was any bias in  $F_{\rm ST}$  estimation given the uneven sample size, we performed AMOVA on



randomly subsampled sets of 30 samples from each site using the 'shuffle' function of GenAlEx. The means and standard errors were calculated across 10 replicates.

#### Individual-level population structure analysis

We used two different Markov chain Monte Carlo (MCMC) Bayesian clustering models to identify potential population genetic structure. The first was STRUCTURE 2.3.4 (Pritchard et al. 2000) for which we used the admixture model, correlated allele frequencies, and no location priors (Falush et al. 2003). Burn-in was set to 50,000 iterations, followed by 50,000 MCMC iterations and replicated 10 times for each value of the number of genetic clusters (K) from 1 to 5. We used STRUCTURE Harvester (Earl and vonHoldt 2012) to determine K (Evanno et al. 2005). The second analysis was conducted in GENELAND 4.0.0 (Guillot et al. 2005) which includes geographical coordinates for each individual. This inclusion makes it more sensitive to weak genetic structure than the STRUCTURE analysis because spatially adjacent individuals are more likely to be in the same cluster (Guillot et al. 2012). We used the uncorrelated allele frequency model (Guillot et al. 2005) with 500,000 MCMC repetitions (saving every 100th iteration), and allowed K to vary between 1 and 5, with 5 independent runs. We set spatial uncertainty of coordinates to 10 km based on estimated daily movements (Munn 1992). We also used individual multilocus spatial autocorrelation analysis for each sex separately (Smouse and Peakall 1999; Peakall et al. 2003) to investigate potential sex-biased dispersal.

#### Individual-level landscape resistance analysis

We conducted landscape resistance analyses at two scales: (1) across the whole study area including all individuals (N=166) and (2) across a subset of the data (N=112) focusing on Upper Tambopata and Candamo. The latter, finer-scale analysis allowed us to specifically examine if gene flow was restricted by the foothills of the Andes and this is the main geographic barrier separating these two areas.

We developed five landscape resistance models to examine whether topography and vegetation affected macaw gene flow. The models were based on maps derived from the Carnegie Airborne Observatory (http://cao.carnegiescience.edu) using high-resolution radar and LiDAR (light detection and ranging) mapping technologies (Asner et al. 2012, 2014). Each was compiled on a separate raster grid with a 100 m (1 ha) resolution in ARCMAP 10.2 (ESRI). (1) The isolation-by-distance model (IBD) was a null model where each cell was given a value of one to investigate the effect of distance alone (Cushman et al. 2006). (2) The elevation model (Elev), based on a digital elevation model (meters above sea level), investigated the effect of topography on gene flow. (3) The tree canopy height (TCH) model considered the distribution of emergent canopy trees which are used by macaws as nests. This landscape feature might influence gene flow through an effect of habitat suitability [e.g., lower or higher gene flow in areas of preferred habitat (Smith et al. 2016)]. (4) The above-ground carbon distribution (ACD) model, representing biomass (Girardin et al. 2010) was used as a proxy for habitat complexity. Scarlet macaws in tropical rainforest prefer riverside habitats with gaps in the canopy that contain lower biomass (Britt et al. 2014). (5) The river distance model (Rio) was used to determine if the preferred riverside habitat of scarlet macaws acted as a dispersal corridor. This model was developed with a 500 m buffer zone at each side along the river system, with values of '1' given to the cells of the grid within this buffer zone and '100' outside of this zone, representing floodplain versus terra firme areas.

We used CIRCUITSCAPE 4.0.3 to generate land-scape resistance values between each pair of individuals, taking into account all possible pathways (McRae and Beier 2007). To test the effect of the landscape on genetic distance, we used two different methods: Mantel and partial Mantel tests in a causal modelling framework (Cushman et al. 2006), and multiple regression of distance matrices (MRDM; Legendre et al. 1994). These methods were implemented in the 'ecodist' library (Goslee and Urban 2007) for R (R Core Team 2013) with *P* values based on 5000 permutations.

Causal modelling began with simple Mantel tests of IBD and all other resistance models. We then conducted partial Mantel tests to assess the significance of relationships between genetic distance and landscape resistance, given the spatial distance between samples (Partial 1). We assessed significance using one-tailed *P*-values for simple Mantel tests



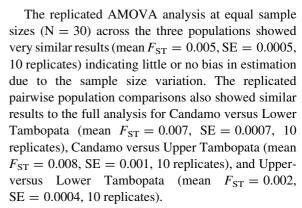
 $(\alpha = 0.05)$  and two-tailed P values for partial Mantel tests (Goslee and Urban 2007). Elevation was an exception to this, as we predicted resistance would increase with elevation and thus report a one-tailed P value for that model. When there was a significant correlation in the first partial Mantel test, we calculated the effect of the IBD model on genetic distance while controlling for the landscape resistance model (Partial 2). Where Partial 1 was significant and Partial 2 was nonsignificant, we inferred significant effects of the landscape resistance model on genetic distance, beyond the effects of geographic distance (Cushman et al. 2006; Smith et al. 2014). For MRDM, we analysed the IBD model separately and then together with each other resistance model. Thus, these models included one predictor for IBD and a maximum of two predictor variables for all other models (Smith et al. 2016).

We generated cumulative current maps for every pair of samples with CIRCUITSCAPE to identify areas which contribute most to connectivity between sample sites (McRae et al. 2013). Maps were visualized in QGIS 2.14 (http://www.qgis.org).

#### Results

#### Population genetic analyses

Among the 166 scarlet macaws in our data set, the mean allele number was 15.7 and mean expected heterozygosity was 0.884 (Table S1). We identified 74 males and 69 females (23 unknown) using the sexing markers. STRUCTURE and GENELAND indicated a single genetic cluster and lack of population boundaries among all individuals at both a large- and small scale. Results from STRUCTURE Harvester and GENELAND are given in Fig. S1 of the supplementary material. The AMOVA analysis revealed a low but significant level of genetic differentiation among the three populations ( $F_{ST} = 0.005$ , P = 0.001). The Candamo population was significantly different from the other two populations (Lower Tambopata  $F_{\rm ST} = 0.008,$ P = 0.003;Upper Tambopata  $F_{\rm ST}=0.008,\,P=0.001),$  driving the overall significant differentiation. Upper and Lower Tambopata populations were not significantly different  $(F_{ST} = 0.001, P = 0.199).$ 



No significant patterns of spatial genetic structure were detected by spatial autocorrelation analysis of individual-by-individual genetic distance when females and males were analyzed separately (Fig. S2), thus there was no evidence of sex-biased dispersal.

## Landscape resistance models

There were no significant effects of the landscape resistance models at the large scale (whole study area). However, at the small scale, we found a significant effect of elevation on genetic distance between Candamo and Upper Tambopata ( $r_{\rm M}=0.128$ , P=0.02; Table 2; Fig. 2). Both isolation-by-distance and elevation (max. 1200 m) were significant explanatories of the genetic distance in a simple Mantel test and in the MRDM analysis (Mantel  $P_{\rm IBD}=0.021$ ,  $P_{\rm Elev}=0.01$ ; MRDM  $P_{\rm IBD}=0.031$ ,  $P_{\rm Elev}=0.021$ ; Table 2; Fig. 2). Isolation-by-distance was not significant when controlling for elevation in the partial Mantel test ( $r_{\rm M}=-0.104$ , P=0.98; Table 2), indicating that elevation, not geographic distance on its own, influences genetic distance between individuals.

#### Discussion

To our knowledge, this is the first study to combine population genetic analysis with spatially-explicit habitat information in a landscape genetic study of parrots. Our study in the Amazon rainforest habitat of scarlet macaws, where no high mountain ranges exist, suggested extensive gene flow and high dispersal ability. Nevertheless, we found evidence for some restriction of their gene flow in the foothills of the Andes Mountains indicating that high mountain



**Table 2** The effect of geographic distance (IBD) and landscape resistances (ACD, Elev, TCH, Rio) on genetic distance in scarlet macaw (Ara macao) using causal modelling and multiple regression of distance matrices (MRDM)

Scale of analysis	Mantel test type	Predictor	Mantel test		MRDM	
			$r_{ m M}$	P	$R^2$	P
Large scale (N = 166) three populations	Simple	IBD	0.023	0.201	0.001	0.385
	Simple	ACD	0.022	0.548	0.001	0.833
	Simple	Elev	0.054	0.088	0.007	0.148
	Simple	TCH	0.024	0.474	0.001	0.826
	Simple	Rio	-0.023	0.713	0.001	0.667
	Partial 1	ACDIBD	0.004	0.944		
	Partial 1	ElevIIBD	0.080	0.063		
	Partial 1	TCHIBD	0.006	0.914		
	Partial 1	RiolIBD	-0.029	0.632		
	Partial 2	<b>IBD</b>  Elev	-0.063	0.914		
Small scale (N = 112) two populations	Simple	IBD	0.080	0.021	0.006	0.031
	Simple	ACD	0.064	0.144	0.007	0.280
	Simple	Elev	0.110	0.010	0.023	0.021
	Simple	TCH	0.071	0.080	0.007	0.276
	Simple	Rio	-0.009	0.889	0.007	0.263
	Partial 1	ACDIBD	-0.031	0.640		
	Partial 1	Elev IBD	0.128	0.020		
	Partial 1	TCHIBD	-0.027	0.681		
	Partial 1	RiolIBD	-0.033	0.632		
	Partial 2	IBD Elev	-0.104	0.980		

For partial Mantel tests, genetic distance (y) was modeled as a function of x given z (y  $\sim$  xlz). Significant effects are shown in bold. All regression analyses included IBD either alone or with one other spatial predictor variable

IBD solation by distance, ACD boveground carbon distribution, Elev elevation above sea level, TCH tree canopy height, Rio river distance

ranges can impose dispersal limitations to macaws. Given the large and rapid changes occurring in the Amazon, our results provide a valuable baseline from which to compare future studies of global change in this region.

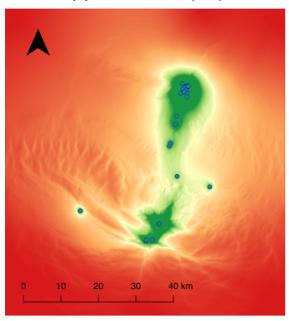
Isolation-by-elevation at the Andean foothills

Both of our landscape genetics analysis methods (causal modelling and MDRM) indicated significant isolation-by-elevation between two populations of macaws separated by only 20 km of mountain ridges over 1000 m in the Andean foothills. This suggests that elevation can form a natural dispersal barrier, influencing gene flow even in large, strong flying species.

Our results about the genetic differentiation in Candamo (Table 2) might point towards more restricted gene flow between the birds in this valley and the two lowland populations separated by high (about 1000 m) foothills of the Andes (Fig. 1). A recent satellite telemetry study in Upper Tambopata (ten tagged scarlet macaws) estimated their 9-month home range to be 1730 km<sup>2</sup> (J. Boyd and D. J. Brightsmith, unpublished data). In that study, movements always occurred to the north-east (away from the foothills) up to 150 km but they always returned to the same area or even the same nest hollow to breed. They flew much further than the distance between Candamo and Tambopata but none of the tagged macaws were detected in Candamo, or even flew near to the foothills.



# (A) Elevation model (Elev)



(B) Isolation-by-distance (IBD) model

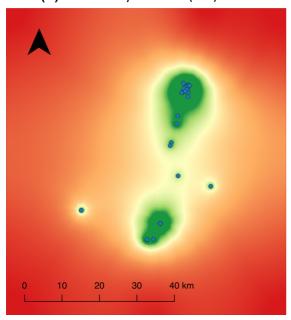


Fig. 2 Cumulative resistance maps of CIRCUITSCAPE models for scarlet macaws (*Ara macao*) in the Peruvian Amazon. Colors indicate the predicted areas of conductance (*green*) and resistance (*red*) among the samples (*blue circles*). The analysis was based on samples from Candamo and Upper Tambopata sites. (Color figure online)

Although they fly long distances, the philopatry and nest fidelity of these macaws suggest that dispersal rarely occurs over large scales. Furthermore, our results suggest that movements of birds between the valley of Candamo and the lowland might be limited by the high elevation. Despite the significant genetic differentiation between Candamo and Tambopata, the low magnitude of  $F_{ST}$  indicates that dispersal does occur between these areas. The only obvious connection between Candamo and the lowland Tambopata is a small river which cuts through multiple parallel mountain ridges (Fig. 1). The cumulative current maps highlight this river as a conductance funnel (Fig. 2) potentially providing the corridor for gene flow. Although our river model showed no significant correlation itself with the genetic structure, its effect was incorporated into the elevation model as rivers also represent the lowest elevation in the landscape.

Dispersal models show that birds may evolve to avoid risky movements even if they are capable of doing so (Shaw et al. 2014). The dispersal of scarlet macaws from Candamo might be explained by a combination of habitats, river system, and elevation gradients. Other factors like unsuitable habitat, temperature or humidity might also influence gene flow but data were not available for analysis in the current study. In future, these data and more detailed LiDAR maps could be used to explore spatial patterns of gene flow in finer detail.

Despite parrots and macaws being noted for their capability of flying long distances over large land-scapes (Faria et al. 2008), our landscape resistance models indicate that high elevation might create barriers for these species. Landscape resistance has also been implied by the work of Monge et al. (2016) who attributed the observed genetic differentiation between two large scarlet macaw populations of Costa Rica (Table 1) to montane barriers rather than recent habitat fragmentation. The central cordilleras of Costa Rica and Panama ranging in elevation from 500 to 3800 m are recognized to separate the two subspecies of scarlet macaw (Schmidt 2013), further suggesting that mountains can act as geographic barriers for macaws.

Recent studies have raised concerns about using partial Mantel tests in landscape genetics because they



assume linearity between distance matrices (Legendre and Fortin 2010) and disregard information about other factors (e.g., mating and dispersal) influencing gene flow (Graves et al. 2013). Despite problems with partial Mantel tests, simple Mantel tests are appropriate for testing isolation by distance (Guillot and Rousset 2013), so our results of IBD in scarlet macaws are unlikely to be biased. Furthermore, both causal modelling and MRDM analyses indicated similar effects of elevation on gene flow in macaws, giving us greater confidence in our findings.

# Population structure of scarlet macaws in Tambopata

Previous studies on macaws (Table 1) suggested low genetic differentiation among populations living in undisturbed habitat. Our study site consists of two adjacent protected areas with a total area of more than 13,000 km² of primary rainforest. The Bayesian approaches could not detect any population structure in our samples from Tambopata. We identified 74 males and 69 females (23 unknown) among our samples, but we did not detect any sex-biased dispersal. In monogamous species like macaws, competition for both mates and resources is likely to affect both sexes equally, leading to predictions of equal rates of dispersal (Dobson 1982).

#### Implications for conservation

Understanding landscape effects on gene flow is important for conservation management (Segelbacher et al. 2010; Keller et al. 2015), but these patterns are still unknown for most species. Macaws still inhabit a large nationally-protected lowland rainforest in Tambopata, but the rapidly growing human population along the recently built inter-oceanic highway is a serious conservation issue in the region (Tickell 1993; Conover 2003; Baraloto et al. 2015). The apparently natural population of macaws within this area has allowed us to obtain baseline data that may become useful for future conservation genetic studies, for example evaluating macaw response to human induced habitat fragmentation. The Candamo valley and its vicinity, which is also a biological hotspot, is of commercial interest for oil extraction and gold mining activities (Finer et al. 2008; Asner et al. 2013). Repeated DNA sampling over the same area could also be compared to our results in the future, to see if accelerated habitat degradation could push the species to cross previously avoided natural barriers like high mountain ridges.

#### Conclusion

In our study of scarlet macaws, we found no evidence for strong population genetic structure across the lowland of Tambopata (over 80 km). These results indicate that gene flow is extensive and correlates with the large home range of these birds. We found evidence of a single population of scarlet macaws in Tambopata, over a large protected area. However, our study also suggests that high elevation might act as a natural barrier to gene flow, as the Candamo population situated behind mountain ridges was genetically differentiated from the other lowland populations. Intermountain rainforest valleys similar to Candamo can host other populations of scarlet macaws over their distribution range. The Candamo valley also hosts a large diversity of other species, some with much more restricted dispersal movements than large macaws. Our findings provide baseline information about natural dispersal barriers in parrots that can assist in understanding the influence of rapid anthropogenic change on their genetic population structure in the Amazon Basin.

**Acknowledgments** This research was funded by the Loro Parque Foundation, Rufford Small Grant Foundation, Idea Wild, and The Australian National University. Thanks for technical laboratory support to Christine Hayes and Cintia Garai. We thank for the laboratory space provided by the Unidad de Biotecnología Molecular, Laboratorio de Investigación y Desarrollo, Universidad Peruana Cayetano Heredia in Lima, Peru. We thank to Janice Boyd, Texas A&M University to provide us preliminary results from the satellite telemetry analysis on scarlet macaws in Tambopata. Samples were collected under research permits from the Servicio Nacional de Areas Naturales Protegidas (SERNANP) in Peru. CITES permits were provided by the Peruvian and Australian authorities. Genetic access to the samples was granted by the Servicio Nacional Forestal y de Fauna Silvestre (SERFOR) in Peru. The Animal Experimentation Ethics Committee of the Texas A&M University approved all methods. The Carnegie Airborne Observatory portion of this study was supported by a grant to G.P.A. from the John D. and Catherine T. MacArthur Foundation. Two anonymous referees provided helpful comments that improved the manuscript.



#### References

- Andrew RL, Bernatchez L, Bonin A, Buerkle CA, Carstens BC, Emerson BC, Garant D, Giraud T, Kane NC, Rogers SM, Slate J, Smith H, Sork VL, Stone GN, Vines TH, Waits L, Widmer A, Rieseberg LH (2013) A road map for molecular ecology. Mol Ecol 22(10):2605–2626
- Andrew RL, Ostevik KL, Ebert DP, Rieseberg LH (2012) Adaptation with gene flow across the landscape in a dune sunflower. Mol Ecol 21(9):2078–2091
- Asner GP, Knapp DE, Boardman J, Green RO, Kennedy-Bowdoin Ty, Eastwood M, Martin RE, Anderson C, Field CB (2012) Carnegie Airborne Observatory-2: increasing science data dimensionality via high-fidelity multi-sensor fusion. Remote Sens Environ 124:454–465
- Asner GP, Knapp DE, Martin RE, Tupayachi R, Anderson CB, Mascaro J, Sinca F, Chadwick KD, Higgins M, Farfan W, Llactayo W, Silman MR (2014) Targeted carbon conservation at national scales with high-resolution monitoring. Proc Natl Acad Sci 111(47):E5016–E5022
- Asner GP, Llactayo W, Tupayachi R, Luna ER (2013) Elevated rates of gold mining in the Amazon revealed through high-resolution monitoring. Proc Natl Acad Sci 110(46):18454–18459
- Baraloto C, Alverga P, Quispe SB, Barnes G, Bejar Chura N, da Silva IB, Castro W, da Souza H, de Souza Moll IE, Del Alcazar Chilo J, Duenas Linares H, Quispe JG, Kenji D, Marsik M, Medeiros H, Murphy S, Rockwell C, Selaya G, Shenkin A, Silveira M, Southworth J, Vasquez Colomo GH, Perz S (2015) Effects of road infrastructure on forest value across a tri-national Amazonian frontier. Biol Conserv 191:674–681
- Beheregaray LB, Caccone A (2007) Cryptic biodiversity in a changing world. J Biol 6(4):1–5
- BirdLife International and NatureServe (2014) Bird species distribution maps of the world. Version 4.0. BirdLife International, Cambridge, UK and NatureServe, Arlington, USA.
- Böhning-Gaese K, Caprano T, Van Ewijk K, Veith M (2006) Range size: disentangling current traits and phylogenetic and biogeographic factors. Am Nat 167(4):555–567
- Brightsmith DJ (2004) Effects of weather on parrot geophagy in Tambopata, Peru. Wilson Bull 116:134–145
- Brightsmith DJ (2005) Parrot nesting in Southeastern Peru: seasonal patterns and keystone trees. Wilson Bull 117:296–305
- Brightsmith DJ, Hilburn J, del Campo A, Boyd J, Frisius M, Frisius R, Janik D, Guillen F (2005) The use of hand-raised psittacines for reintroduction: a case study of scarlet macaws (*Ara macao*) in Peru and Costa Rica. Biol Conserv 121:465–472
- Britt CR, Anleu RG, Desmond MJ (2014) Nest survival of a long-lived psittacid: scarlet Macaws (*Ara macao cyanoptera*) in the Maya Biosphere Reserve of Guatemala and Chiquibul Forest of Belize. Condor 116(2):265–276
- Clobert J, Baguette M, Benton TG, Bullock JM, Ducatez S (2012) Dispersal ecology and evolution. Oxford University Press, Oxford
- Collar N, Boesman P, Sharpe CJ (2016) Scarlet Macaw (Ara macao). In: del Hoyo J, Elliott A, Sargatal J, Christie DA,

- de Juana E (eds) Handbook of the birds of the world alive. Lynx Edicions, Barcelona. http://www.hbw.com/node/ 54620. Accessed 4 Oct 2016
- Conover T (2003) Perú's long haul: highway to riches, or ruin? Natl Geogr 203:80–100
- Cushman Samuel A, McKelvey Kevin S, Hayden J, Schwartz Michael K (2006) Gene flow in complex landscapes: testing multiple hypotheses with causal modeling. Am Nat 168(4):486–499
- Dobson S (1982) Competition for mates and predominant juvenile male dispersal in mammals. Anim Behav 30(4):1183–1192
- Earl D, vonHoldt B (2012) STRUCTURE HARVESTER: a website and program for visualizing STRUCTURE output and implementing the Evanno method. Conserv Genet Resour 4(2):359–361
- Evanno G, Regnaut S, Goudet J (2005) Detecting the number of clusters of individuals using the software STRUCTURE: a simulation study. Mol Ecol 14(8):2611–2620
- Excoffier L, Smouse PE, Quattro JM (1992) Analysis of molecular variance inferred from metric distances among DNA haplotypes: application to human mitochondrial DNA restriction data. Genetics 131(2):479–491
- Falush D, Stephens M, Pritchard JK (2003) Inference of population structure using multilocus genotype data: linked loci and correlated allele frequencies. Genetics 164(4):1567–1587
- Faria PJ, Guedes NMR, Yamashita C, Martuscelli P, Miyaki CY (2008) Genetic variation and population structure of the endangered Hyacinth Macaw (Anodorhynchus hyacinthinus): implications for conservation. Biodivers Conserv 17:765–779
- Finer M, Jenkins CN, Pimm SL, Keane B, Ross C (2008) Oil and gas projects in the Western Amazon: threats to wilderness, biodiversity, and indigenous peoples. PLoS ONE 3(8):e2932
- Forshaw JM (2011) Parrots of the world. CSIRO Publishing, Collingwood
- Girardin CAJ, Malhi Y, AragÃO LEOC, Mamani M, Huaraca Huasco W, Durand L, Feeley KJ, Rapp J, Silva-Espejo JE, Silman M, Salinas N, Whittaker RJ (2010) Net primary productivity allocation and cycling of carbon along a tropical forest elevational transect in the Peruvian Andes. Glob Change Biol 16(12):3176–3192
- Goslee SC, Urban DL (2007) The ecodist package for dissimilarity-based analysis of ecological data. J Stat Softw 22(7):1–19
- Graves TA, Beier P, Royle JA (2013) Current approaches using genetic distances produce poor estimates of landscape resistance to interindividual dispersal. Mol Ecol 22(15):3888–3903
- Guillot G, Estoup A, Mortier F, Cosson JF (2005) A spatial statistical model for landscape genetics. Genetics 170(3):1261–1280
- Guillot G, Renaud S, Ledevin R, Michaux J, Claude J (2012) A unifying model for the analysis of phenotypic, genetic, and geographic data. Syst Biol 61(6):897–911
- Guillot G, Rousset F (2013) Dismantling the Mantel tests. Methods Ecol Evol 4(4):336–344
- Hanski I, Erälahti C, Kankare M, Ovaskainen O, Sirén H (2004) Variation in migration propensity among individuals



- maintained by landscape structure. Ecol Lett 7(10):958–966
- IUCN (2014) The IUCN red list of threatened species. Version 2014.2. http://www.iucnredlist.org/
- Keenan RJ, Reams GA, Achard F, de Freitas JV, Grainger A, Lindquist E (2015) Dynamics of global forest area: results from the FAO Global Forest Resources Assessment 2015. For Ecol Manag 352:9–20
- Keller D, Holderegger R, van Strien M, Bolliger J (2015) How to make landscape genetics beneficial for conservation management? Conserv Genet 16(3):503–512
- Kokko H, López-Sepulcre A (2006) From individual dispersal to species ranges: perspectives for a changing world. Science 313(5788):789–791
- Lee ATK, Marsden SJ (2012) The influence of habitat, season, and detectability on abundance estimates across an Amazonian Parrot assemblage. Biotropica 44:537–544
- Legendre P, Fortin M-J (2010) Comparison of the Mantel test and alternative approaches for detecting complex multivariate relationships in the spatial analysis of genetic data. Mol Ecol Resour 10(5):831–844
- Legendre P, Lapointe F-J, Casgrain P (1994) Modeling brain evolution from behavior: a permutational regression approach. Evolution 48(5):1487–1499
- Manel S, Holderegger R (2013) Ten years of landscape genetics. Trends Ecol Evol 28(10):614–621
- Manel S, Schwartz MK, Luikart G, Taberlet P (2003) Landscape genetics: combining landscape ecology and population genetics. Trends Ecol Evol 18(4):189–197
- McDougald D, Rice SA, Barraud N, Steinberg PD, Kjelleberg S (2012) Should we stay or should we go: mechanisms and ecological consequences for biofilm dispersal. Nat Rev Micro 10(1):39–50
- McRae BH, Beier P (2007) Circuit theory predicts gene flow in plant and animal populations. Proc Natl Acad Sci 104(50):19885–19890
- McRae BH, Shah VB, Mohapatra TK (2013) Circuitscape 4 user guide. The Nature Conservancy. http://www.circuitscape.org/
- Monge O, Schmidt K, Vaughan C, Gutiérrez-Espeleta G (2016) Genetic patterns and conservation of the Scarlet Macaw (*Ara macao*) in Costa Rica. Conserv Genet 17:745–750
- Munn CA (1992) Macaw biology and ecotourism, or "When a bird in the bush is worth two in the hand". In: Beissinger SR, Snyder NFR, Munn CA (eds) New world parrots in crisis: solutions from conservation biology. Smithsonian Institution Press, Washington, DC, pp 47–72
- Olah G, Heinsohn RG, Brightsmith DJ, Espinoza JR, Peakall R (2016) Validation of non-invasive genetic tagging in two large macaw species (*Ara macao* and *A. chloropterus*) of the Peruvian Amazon. Conserv Genet. doi:10.1007/s12686-016-0573-4
- Olah G, Heinsohn RG, Espinoza JR, Brightsmith DJ, Peakall R (2015) An evaluation of primers for microsatellite markers in Scarlet Macaw (*Ara macao*) and their performance in a Peruvian wild population. Conserv Genet Resour 7(1):157–159
- Olah G, Vigo G, Heinsohn R, Brightsmith DJ (2014) Nest site selection and efficacy of artificial nests for breeding success of Scarlet Macaws *Ara macao* macao in lowland Peru. J Nat Conserv 22(2):176–185

- Olah G, Vigo G, Ortiz L, Rozsa L, Brightsmith DJ (2013) Philornis sp bot fly larvae in free living scarlet macaw nestlings and a new technique for their extraction. Vet Parasitol 196(1–2):245–249
- Orsini L, Vanoverbeke J, Swillen I, Mergeay J, De Meester L (2013) Drivers of population genetic differentiation in the wild: isolation by dispersal limitation, isolation by adaptation and isolation by colonization. Mol Ecol 22(24):5983–5999
- Peakall R, Ruibal M, Lindenmayer DB (2003) Spatial autocorrelation analysis offers new insights into gene flow in the Australian bush rat, *Rattua Fuscipes*. Evolution 57(5):1182–1195
- Peakall R, Smouse PE (2006) GENALEX 6: genetic analysis in Excel. Population genetic software for teaching and research. Mol Ecol Notes 6(1):288–295
- Peakall R, Smouse PE (2012) GenAlEx 6.5: genetic analysis in Excel. Population genetic software for teaching and research—an update. Bioinformatics 28(19):2537–2539
- Peakall R, Smouse PE, Huff DR (1995) Evolutionary implications of allozyme and RAPD variation in diploid populations of dioecious buffalograss Buchloë dactyloides. Mol Ecol 4(2):135–148
- Pritchard JK, Stephens M, Donnelly P (2000) Inference of population structure using multilocus genotype data. Genetics 155(2):945–959
- R Core Team (2013) R: a language and environment for statistical computing. R Foundation for Statistical Computing, Vienna
- Renton K, Brightsmith DJ (2009) Cavity use and reproductive success of nesting macaws in lowland forest of southeast Peru. J Field Ornithol 80:1–8
- Schmidt KL (2013) Spatial and temporal patterns of genetic variation in scarlet macaws (*Ara macao*): implications for population management in La Selva Maya. Columbia University, Central America
- Schofield G, Dimadi A, Fossette S, Katselidis KA, Koutsoubas D, Lilley MKS, Luckman A, Pantis JD, Karagouni AD, Hays GC (2013) Satellite tracking large numbers of individuals to infer population level dispersal and core areas for the protection of an endangered species. Divers Distrib 19(7):834–844
- Segelbacher G, Cushman SA, Epperson BK, Fortin M-J, Francois O, Hardy OJ, Holderegger R, Taberlet P, Waits LP, Manel S (2010) Applications of landscape genetics in conservation biology: concepts and challenges. Conserv Genet 11(2):375–385
- Shaw AK, Jalasvuori M, Kokko H (2014) Population-level consequences of risky dispersal. Oikos 123(8):1003–1013
- Smith AL, Bull CM, Gardner MG, Driscoll DA (2014) Life history influences how fire affects genetic diversity in two lizard species. Mol Ecol 23(10):2428–2441
- Smith AL, Landguth EL, Bull CM, Banks SC, Gardner MG, Driscoll DA (2016) Dispersal responses override density effects on genetic diversity during post-disturbance succession. Proc R Soc Lond B 283:20152934
- Smouse PE, Peakall R (1999) Spatial autocorrelation analysis of individual multiallele and multilocus genetic structure. Heredity 82(5):561–573
- Storfer A, Murphy MA, Evans JS, Goldberg CS, Robinson S, Spear SF, Dezzani R, Delmelle E, Vierling L, Waits LP



- (2007) Putting the 'landscape' in landscape genetics. Heredity 98(3):128-142
- Szövényi P, Sundberg S, Shaw AJ (2012) Long-distance dispersal and genetic structure of natural populations: an assessment of the inverse isolation hypothesis in peat mosses. Mol Ecol 21(22):5461–5472
- Tickell O (1993) Highway threatens Tambopata. Geographical 65:7–9
- Vigo G, Williams M, Brightsmith DJ (2011) Growth of scarlet macaw (Ara macao) chicks in southeastern Peru. Ornitol Neotropical 22:143–153
- Wang Y-H, Yang K-C, Bridgman C, Lin L-K (2008) Habitat suitability modelling to correlate gene flow with landscape connectivity. Landsc Ecol 23(8):989–1000
- Wright S (1965) The interpretation of population structure by F-statistics with special regard to systems of mating. Evolution 19(3):395–420

