# Chapter 6 Survey Methods and Hierarchical Modeling for Mexican Primates



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Abstract The Southeastern part of Mexico is inhabited by two species of howler monkeys (Alouatta palliata, Alouatta pigra) and one species of spider monkey (Ateles geoffroyi), thereby making Mexico the most northern distribution of Neotropical primates. All species are Endangered according to the IUCN red list; thus, accurate abundance estimates and evaluation of population threats and trends are indispensable to establish effective conservation measures. Hierarchical models are a powerful tool for gathering such information and obtaining comparable results across surveys and study sites. We conducted a literature review to evaluate the eligibility of hierarchical modeling for studies involving data from surveys of Mexican primates. We found recce walks to be the most commonly used survey method for Mexican primates, and both abundance and presence/absence-related outcomes to be the most frequently reported response variables derived from such surveys. The vast majority of studies did not take heterogeneity in detection probability into account, potentially causing bias in results, and often did not use inferential statistics for hypothesis testing. Whereas only one study has used

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hierarchical modeling for Mexican primate abundance estimates so far, we show that hierarchical models are very suitable for data gathered using both traditional and recently developed survey methods for spider and howler monkeys. We particularly advocate for an increased application of hierarchical models using presence/absence data for species with a high degree of fission–fusion dynamics, which impedes reliable counts at the individual and group levels.

Keywords Detectability · Drones · Fission–fusion dynamics · Monitoring · Occurrence · Passive acoustic monitoring · Sampling

### 6.1 Introduction

Hierarchical models have gained popularity in the field of mammal population ecology over the last two decades for various reasons. Hierarchical models estimate animal occupancy (i.e., the probability of an animal being present within an area) or abundance (i.e., the number of individuals or groups within an area) based on data from repeated surveys, and only a few assumptions are required to be met for their use (Royle and Dorazio [2006](#page-29-0)). Similar to distance-sampling approaches (Buckland et al. [2015\)](#page-24-0), hierarchical modeling approaches assume the sighting of an animal to be influenced not only by the actual number of individuals present in the survey area but also by the probability of detecting the animal (Bolker et al. [2008;](#page-24-1) Royle and Dorazio [2006](#page-29-0)). Whereas the variation in animal abundance and occupancy depends on habitat characteristics and other climatic and ecological factors that influence the distribution of a species at large and small spatial scales, the variation in detection probability depends on factors that enhance or reduce the observer's ability to detect an animal (Dénes et al. [2015\)](#page-26-0). The latter factors include weather conditions during a survey, vegetation density at a site, and survey effort. Hierarchical modeling allows for more accurate and unbiased estimation of different aspects of species ecology by including covariates expected to affect detection probability independently from covariates affecting the species' presence or abundance at a site (Royle [2004](#page-29-1)). In contrast to multiple-covariate distance-sampling approaches (MCDS, Marques et al. [2007\)](#page-27-0), detection probability in hierarchical models can be estimated independently from the perpendicular distance between the observer and the animal sighted and include any other potentially relevant factor. This feature makes hierarchical modeling an ideal and flexible tool to be applied to data from surveys in which animals on the transect center-line are not detected with certainty and to be combined with a whole range of survey methods that do not allow for distance estimation, including the combination of multiple survey methods.

Although mostly applied to data from camera-trap surveys (Rovero and Spitale [2016\)](#page-29-2), hierarchical modeling can easily be applied to data collected using more recently developed survey methods such as aerial or acoustic monitoring (Kalan et al. [2015;](#page-27-1) Williams et al. [2017\)](#page-30-0). Besides its independence from animal–observer

<span id="page-2-0"></span>

Fig. 6.1 The three Mexican primate species: (a) Geoffroy's spider monkey, (b) the black howler monkey, and (c) the mantled howler monkey. (Photo credit: Fabrizio Dell'Anna, Denise Spaan, and Ben Keen [licensed under creative commons share alike [CC BY 4.0, [https://www.inaturalist.org/](https://www.inaturalist.org/photos/164443433?size=original)  [photos/164443433?size](https://www.inaturalist.org/photos/164443433?size=original)=original])

distances, the use of hierarchical modeling requires fewer sightings than distance sampling, which makes it applicable to surveying species that occur at low densities. Whereas 60–80 sightings are required to apply distance sampling to data from linetransect surveys, and 75–100 sightings to data from point-transect surveys (Buckland et al. [2001\)](#page-24-2), complex hierarchical models can be run with fewer sightings depending on the detection probability and true occupancy or abundance of the species of interest (Guillera-Arroita et al. [2010;](#page-27-2) Guillera-Arroita and Lahoz-Monfort [2012\)](#page-27-3). For instance, 42 detections of Geoffroy's spider monkeys (Ateles geoffroyi) were sufficient to fit Royle–Nichols models with eight site-level covariates in a recent study (Hutschenreiter et al. [2022\)](#page-27-4). Despite its flexibility, hierarchical models have not yet received much attention in research on Neotropical mammals that are not commonly monitored with camera traps such as primate species.

Mexico is the northernmost distribution of Neotropical primate species. Only three species from two genera inhabit the country: the Geoffroy's spider monkey (Ateles geoffroyi), the black howler monkey (Alouatta pigra), and the mantled howler monkey (A. paliatta, Fig. [6.1](#page-2-0)). Whereas Geoffroy's spider monkeys are widely distributed from central to eastern Mexico, including most of the Yucatan Peninsula, the distribution is limited to central Mexico for the mantled howler monkey and mainly to the Yucatan Peninsula and part of central Mexico for the black howler monkey (Calixto-Pérez et al. [2018\)](#page-24-3). All three Mexican primate species perform important ecological roles as seed dispersers (Fuzessy et al. [2017;](#page-26-1) González-Di Pierro et al. [2021](#page-26-2)) and face declining populations due to habitat loss, habitat modification, and hunting (Arroyo-Rodríguez and Dias [2010;](#page-23-0) Oropeza Hernández and Rendón Hernández [2012;](#page-28-0) Méndez-Carvajal et al. [2022\)](#page-27-5). As a result, all Mexican primate species are Endangered according to the IUCN red list (Cortés-Ortíz et al. [2020](#page-25-0); Cortés-Ortíz et al. [2021](#page-25-1); Cuáron et al. [2020\)](#page-25-2). Therefore, large-scale population monitoring is crucial to accurately document population trends and determine important predictors of species' occurrence and abundance, providing vital information to develop targeted conservation management plans. Effective survey methods and flexible options for data analysis are needed to ensure accurate and precise population estimates from such monitoring efforts that can be compared across time and space. In this chapter, we review methods used for surveying and analyzing data on the three primate species occurring in Mexico and evaluate the eligibility of hierarchical modeling for such survey data. We conclude by arguing for the increased use of hierarchical models for these cryptic species.

#### 6.2 Survey Methods for Spider and Howler Monkeys

Various survey methods have been used to infer the occupancy, abundance, or density of spider and howler monkeys, including line- and strip-transect sampling, point-transect sampling, recce walks, complete counts, lure counts using playback recordings, acoustic triangulation, passive acoustic monitoring, arboreal camera trapping, and drone surveys (Table [6.1](#page-4-0); see Spaan et al. in review). Information on the presence of spider and howler monkey species can also be gathered indirectly through interviewing local people (Calixto-Pérez et al. [2018](#page-24-3); Shedden et al. [2022](#page-29-3)) and the emergence of open-access biodiversity databases such as the Global Biodiversity Information Facility ([www.GBIF.org](http://www.gbif.org)) allows for larger-scale studies that make use of preexisting presence data (Vidal-García and Serio-Silva [2011](#page-30-1)). In the following sections, we selected two common traditional survey methods and two more recently developed survey methods for spider and howler monkeys to show the feasibility of combining them with hierarchical modeling approaches.

### 6.2.1 Examples of Traditional Survey Methods for Spider and Howler Monkeys: Line-Transect Sampling and Acoustic Triangulation

Line-transect sampling is the most commonly used method to estimate primate densities (i.e., the number of individuals or groups per unit area) in their natural habitat (Buckland et al. [2010;](#page-24-4) Campbell et al. [2016;](#page-24-5) Plumptre et al. [2013](#page-28-1)). The method consists of observers counting the number of individuals or groups of the species of interest detected while walking a continuous straight trail of a certain length (Plumptre et al. [2013\)](#page-28-1). When applying a distance-sampling approach, certain detection is assumed only for animals located directly on the transect line, while detection probability decreases for animals located at increasing distances from the transect line (Buckland et al. [2015](#page-24-0)). Based on the number of detected animals and their perpendicular distance from the transect line, the density of individuals or groups can be estimated using a detection function or a cut-off width (as used during strip-transect or belt-transect sampling; Buckland et al. [2015](#page-24-0)). Sightings from line-

		Example study	
Survey		for howler	Example study for
method	Description	monkeys	spider monkeys
Camera traps	Use of remote photographic or video	Cudney-	Blake et al. (2010):
	devices to detect species	Valenzuela et al.	A. belzebuth
		$(2021)$ : A. pigra	
Complete	Ground surveys covering the complete	Galán-Acedo	<b>NA</b>
counts	area of a predefined size, assuming all	et al. (2021):	
	individuals present were detected	A. pigra,	
		A. palliata	
Database	Presence data based on publicly avail-	Vidal-García	Vidal-García and
	able datasets	and Serio-Silva	Serio-Silva (2011):
		(2011):	A. geoffroyi
		A. pigra,	
		A. palliata	
Drone	Systematic aerial surveys using drones	Kays et al.	Spaan et al.
surveys	along transect lines or covering a	$(2019)$ :	(2019a):
	predefined area	A. palliata	A. geoffroyi
Historic	Use of specimen records and catalog	Baumgarten and	Ortiz-Martínez
records	entries of selected museums to gather	Williamson	et al. (2008):
	presence data of species	$(2007)$ :	A. geoffroyi
		A. pigra,	
		A. palliata	
<b>Interviews</b>	Use of questionnaires or workshops to	Calixto-Pérez	Calixto-Pérez et al.
	gather presence data of species from	et al. (2018):	(2018):
	local informants or experts	A. pigra,	A. geoffroyi
		A. palliata	
Line- or	Systematic ground surveys on transect	Anzures-Dadda	Spaan et al. (2020):
strip-transect	lines	and Manson	A. geoffroyi
sampling		$(2006)$ :	
		A. palliata	
Passive	Use of remote sound recording devices	Do Nascimento	Hutschenreiter
acoustic	to detect species vocalizations	et al. (2021):	et al. (2022):
monitoring		A. caraya	A. geoffroyi
		Salcedo et al.	Peck et al. (2010):
Playbacks	Auditory detection of animals by broadcasting recorded species calls to	(2014):	A. fusciceps
	prompt a vocal response	A. palliata	
Point-count	Systematic ground surveys at selected	<b>NA</b>	Hutschenreiter
sampling	points for a predetermined period		et al. (2022):
			A. geoffroyi
Recce walks	Ground surveys on existing trails, no	Arroyo-	Ortiz-Martínez and
	systematic search	Rodríguez et al.	Rico-Gray (2007):
		(2013):	A. geoffroyi
		A. pigra	
Triangulation	Simultaneous ground surveys in person	Estrada et al.	Estrada et al.
	or using sound recording devices at	$(2004)$ :	$(2004)$ :
	multiple locations to determine the	A. pigra	unsuccessful for
	position of vocalizing animals		A. geoffroyi

<span id="page-4-0"></span>Table 6.1 Survey methods used for occurrence and abundance estimation of howler (Alouatta spp.) and spider monkeys (Ateles spp.) in Mexico (when available) and other countries

transect sampling can also be used to calculate encounter rates as the number of detected individuals or groups per unit distance or survey or to obtain presence/ absence data per transect walk (Campbell et al. [2016](#page-24-5)). Such presence and count data can be combined with hierarchical modeling, which is useful when detection probability is expected to differ systematically between transect walks (e.g., when vegetation density varies across sites or when climatic conditions vary greatly across survey periods).

As howler monkeys emit intense vocalizations at specific times of the day, acoustic triangulation is another survey method traditionally used to determine howler monkey occupancy and group density (Estrada et al. [2004](#page-26-5); Stoner [1994\)](#page-29-7). Acoustic triangulation consists in the establishment of at least three listening posts covering a survey area at which observers note the time and compass direction of a call (Brockelman and Ali [1987](#page-24-7)). By combining the information from the listening posts, the location of the calling animals can be determined. Then, population density can be estimated from the number of calling individuals or groups per survey area as the total area at which calls can be detected by at least two listening posts (Brockelman and Ali [1987;](#page-24-7) Gilhooly et al. [2015\)](#page-26-6). To obtain accurate population density estimates using this method, it is crucial to perform surveys over a period of time that ensures that each individual or group inhabiting the survey area calls at some point and hence is detected. Alternatively, a correction factor accounting for noncalling animals can be incorporated into the statistical analysis (Cheyne et al. [2008;](#page-25-4) Gilhooly et al. [2015\)](#page-26-6). Hierarchical modeling could aid with the latter by accounting for the detection heterogeneity of calling subjects by modeling call detectability as a binomial distribution (detected or not detected; Kéry and Royle [2016\)](#page-27-7), but we are not aware of a study that has done so yet. Although density estimates from triangulation can also be derived using distance-sampling approaches (Gilhooly et al. [2015](#page-26-6)), the use of hierarchical modeling such as N-mixture models might be superior given that sound transmission is affected by a variety of other factors apart from animal–observer distance (see next section).

## 6.2.2 Examples of Novel Survey Methods for Spider and Howler Monkeys: Drones and Passive Acoustic Monitoring

Recently, new survey methods for spider and howler monkeys have been developed to increase survey efficiency given that line-transect sampling for such low-density occurring species usually results in high proportions of zero detections (Hutschenreiter et al. [2021](#page-27-8); Plumptre et al. [2013\)](#page-28-1). Drones can cover large survey areas in a short time and have become increasingly popular as a survey tool for a broad variety of species (Wich and Koh [2018](#page-30-2)). Kays et al. [\(2019](#page-27-6)) and Spaan et al. [\(2019a](#page-29-4)) were able to detect Geoffroy's spider monkeys and mantled howler monkeys using drones mounted with thermal cameras. The primates were detected based

on the difference in reflectance between the animals' body temperature and the surface temperature of the forest canopy. Although accurate detection from thermal images can be problematic in forests where similarly sized arboreal mammal species coexist due to possible false-positive detections from species mix-ups (Kays et al. [2019\)](#page-27-6), thermal imaging is a promising tool in abundance estimation of spider monkeys as individuals in large subgroups can be counted more accurately than from the ground (Spaan et al. [2019a\)](#page-29-4). Abundance estimation for howler monkeys is likely to be equally successful using this survey method but has not been tested yet.

Counts from drone surveys can be used to obtain relative densities and encounter rates (Wich et al. [2016\)](#page-30-3) and be combined with hierarchical modeling to obtain animal densities (Corcoran et al. [2020](#page-25-5)). The combination of drone surveys with distance-sampling approaches is rather challenging for arboreal animals as the probability of detecting an individual does not necessarily depend on its distance from the transect line but rather on its vertical position in the tree canopy and on technical factors such as flight altitude (Witczuk and Pagacz [2021](#page-30-4)) and ground-sampling distance (Bonnin et al. [2018](#page-24-8)). These technical factors can be easily incorporated in hierarchical abundance approaches such as N-mixture models (Corcoran et al. [2020](#page-25-5)). Alternatively, presence/absence data can be collected during drone surveys for spider (and possibly howler) monkeys using visual-spectrum redgreen-blue (RGB) cameras (Kays et al. [2019;](#page-27-6) Spaan et al. [2022\)](#page-29-8) instead of thermal cameras. Although many individuals are missed on RGB images because only animals located above the tree canopy are detected, this less cost-intensive survey method (compared to drone surveys using thermal imaging) is perfectly suitable to be combined with hierarchical modeling approaches such as occupancy modeling (Williams et al. [2017](#page-30-0)).

recently been applied to survey black-and-gold howler monkeys (A. caraya, Do Based on the success of triangulation surveys for howler monkeys, passive acoustic monitoring is a promising survey method for the Alouatta genera. It has Nascimento et al. [2021;](#page-26-4) Pérez-Granados and Schuchmann [2021\)](#page-28-5) and successfully been tested for black howler monkeys (Hutschenreiter et al. [2023](#page-27-9)). Geoffroy's spider monkeys were also successfully surveyed using passive acoustic monitoring (Hutschenreiter et al. [2022](#page-27-4); Lawson et al. [2023\)](#page-27-10), despite the less intense nature of the species' vocal repertoire compared to that of howler monkeys. To conduct passive acoustic monitoring, autonomous recording units (ARUs) are used to capture sounds from the environment in a circular survey area around the ARU (Deichmann et al. [2018](#page-25-6); Gibb et al. [2019\)](#page-26-7). The acoustic information can then be analyzed for various purposes, such as the detection of a species by the presence of its vocalization in the acoustic recordings (Gibb et al. [2019](#page-26-7)). Passive acoustic monitoring is mostly used to obtain presence/absence data and therefore is frequently combined with occupancy modeling (Campos-Cerqueira and Aide [2016](#page-25-7)). Various techniques have also been developed for population density estimation depending on the information compiled (Marques et al. [2013](#page-27-11); Pérez-Granados and Traba [2021;](#page-28-6) Thompson et al. [2010\)](#page-29-9). For example, if distance estimation between a vocalizing animal and ARU is possible (e.g., based on Sound Pressure Level measurements of the recorded vocalization), distance-sampling approaches using point-transect

protocols can be applied (Marques et al. [2013\)](#page-27-11). Alternatively, vocal activity rates (i.e., the number of detected vocalizations during sampling time) can provide a relative density estimate (Thompson et al. [2010\)](#page-29-9). However, density estimation from passive acoustic monitoring is a very recent development and has not been applied to any spider or howler monkey species surveys to date. The use of hierarchical models for analyzing acoustic data is beneficial because sound transmission is influenced by a variety of factors such as weather conditions (Huveneers et al. [2016\)](#page-27-12) and anthropogenic background noise (Zwerts et al. [2021\)](#page-30-5) that might also influence species' abundance or occupancy. Hierarchical models can include such factors independently as covariates affecting detection probability and as covariates affecting abundance or occupancy estimates without confounding these types of effects.

Since primate calls recorded during passive acoustic monitoring cannot be assumed to be independent detections (because various calls could stem from the same individual or from different individuals of the same group or subgroup), we recommend the use of occupancy and Royle–Nichols models that are based on presence/absence data in combination with this survey method. Alternatively, relative abundance estimates of howler monkeys can be obtained (Kéry and Royle [2016](#page-27-7)) based on the number of detected vocalizations, assuming that the vocal activity at a site increases with increasing species abundance (Thompson et al. [2010](#page-29-9)). This is the case for agonistic loud call detections from both black and mantled howler monkeys, as roaring males evoke vocal responses from males of neighboring groups (Briseño-Jaramillo et al. [2021](#page-24-9); Ceccarelli et al. [2021](#page-25-8)). In contrast, the use of detected vocalization numbers to estimate relative abundance is not recommended for species with high degrees of fission–fusion dynamics such as spider monkeys because vocalization rates might reflect subgroup-spacing behavior rather than group size (Dubreuil et al. [2015](#page-26-8); Spehar and Di Fiore [2013](#page-29-10)).

### 6.2.3 Detection Probability Based on the Behavioral Ecology of Spider and Howler Monkeys

When considering variables that potentially influence the probability to detect an animal, the behavioral ecology of the species of interest can provide valuable information. By accounting for animal movements, activity budgets, social behavior, habitat use, and their temporal variation, researchers can determine how and when to survey the species of interest, what factors may hamper detection, and whether assumptions are met for applying a particular data-analysis method. The following are a few examples of how the behavioral ecology of spider (Ateles spp.) and howler monkeys (Alouatta spp.) potentially impact detection probability during surveys and selection of data-analysis options.

Spider monkeys and howler monkeys are highly arboreal primates, which make them generally difficult to detect in the dense tropical forests they inhabit. As they spend most of their time in the upper canopy (Wallace [2008;](#page-30-6) Youlatos and Guillot [2015\)](#page-30-7), leaf coverage often impedes visual detection from both the ground and the sky (Spaan et al. [2019a](#page-29-4)). In forests where leaf coverage changes substantially throughout the year, detection probability might vary between seasons. Spider monkeys are generally easier to detect when moving or feeding compared to when they are resting due to the additional visual cues (such as moving branches and tree crowns) and auditory cues (such as cracking of branches while traveling, fruit dropping sounds while feeding, and vocalizations) that aid in perceiving their presence. It is hence recommendable to survey spider monkeys during hours of elevated activity, typically during the morning and late afternoon (Di Fiore et al. [2008\)](#page-26-9), when using a survey method that relies on such cues. Given their generally slow movements, howler monkeys are less detectable by visual cues than spider monkeys. However, the loud and low-frequency roaring of male howler monkeys can be heard up to large distances (Bergman et al. [2016](#page-24-10); Da Cunha and Byrne [2006;](#page-25-9) Van Belle et al. [2014](#page-30-8)) making it fairly easy to determine their presence through auditory cues. These loud calls are emitted by either one or several individuals (Briseño-Jaramillo et al. [2017](#page-24-11); Cornick and Markowitz [2002](#page-25-10)) in the early morning and late afternoon, making these the preferable survey periods for howler monkeys.

Spider monkeys live in multimale–multifemale groups (Schaffner et al. [2012](#page-29-11)) with a high degree of fission–fusion dynamics, resulting in the formation of subgroups that frequently change in size and composition (Aureli et al. [2008\)](#page-23-4). Whereas this highly flexible component of their social system impedes accurate abundance estimation of spider monkey groups or individuals (Spaan et al. [2019b](#page-29-12)), it may facilitate the detection of group members dispersed in subgroups over wide areas (Ramos-Fernández et al. [2011\)](#page-28-7) compared to species with a high degree of group cohesion (Spaan et al. in review). As subgroup number and size change in relation to food availability (Pinacho-Guendulain and Ramos-Fernández [2017\)](#page-28-8), the detection probability of a spider monkey group may also change across seasons. When information is available on the feeding tree phenology of a surveyed area, it might thus be useful to add food abundance at a site as a numeric covariate for modeling spider monkey detection probability. When such information is not available, simply accounting for the time of a survey (e.g., by including Julian day or current season as a covariate) may perform equally well to explain variation in detection probability.

Howler monkeys live in multimale or unimale groups with several females and subadult offspring (Van Belle and Estrada [2006\)](#page-29-13). Average group sizes and degree of fission–fusion dynamics differ between species, with mantled howler monkeys forming larger groups (6–23 individuals; Crockett and Eisenberg [1986\)](#page-25-11) with a higher degree of fission–fusion dynamics (Dias and Luna [2006](#page-26-10)) than black howler monkeys (4–6 individuals; Crockett and Eisenberg [1986](#page-25-11)). As larger groups are generally easier to sight or hear, detection probabilities for different howler monkey species might differ even though the same survey method is used.

Home-range estimates for Geoffroy's spider monkeys vary greatly (Fedigan et al. [1988;](#page-26-11) Ramos-Fernández and Ayala-Orozco [2003;](#page-28-9) Chaves et al. [2011\)](#page-25-12) and can be as small as 5 ha (Ramos-Fernández et al. [2013\)](#page-28-10) and as large as 304 ha (Asensio et al. [2012\)](#page-23-5) reflecting not only the impact of different ecological factors but also methodologically induced variability in home-range estimates (Boyle [2021\)](#page-24-12). Homerange estimates for howler monkeys are smaller than for spider monkeys (6–75 ha for A. palliata; 1–33 ha for A. pigra; Arroyo-Rodríguez et al. [2015\)](#page-23-6), and home-range sizes decrease with increasing group density in a forest (Fortes et al. [2015\)](#page-26-12). Standardizing sampling units for spider and howler monkey surveys (e.g., length of line transects, the distance between remote sensors, or area covered by drone surveys) based on home-range sizes can thus be ambiguous, but the interdependence of sampling units does not necessarily impede accurate occupancy estimation, as long as sites are selected randomly (MachKenzie and Royle [2005\)](#page-27-13).

### 6.3 Current Use of Survey and Data-Analysis Methods for Mexican Primate Species

Despite the variety of survey methods used for spider and howler monkeys (Table [6.1](#page-4-0)) and the feasibility of combining them with hierarchical modeling, hierarchical modeling is still not frequently applied to data from primate surveys. We conducted a literature review to evaluate the use of survey methods, dataanalysis methods, and response variables to assess occurrence, abundance, and group composition patterns in any of the three Mexican primate species since 2002, the year in which the first study on hierarchical modeling of unmarked populations was published (MacKenzie et al. [2002](#page-27-14)).

#### 6.3.1 Literature Review

In May 2022, we conducted a search in Scopus for literature in English using a variety of terms related to primate surveys in Mexico (Primate\* OR monkey\* OR Ateles OR Alouatta AND Mexico OR Oaxaca OR Chiapas OR Yucatan OR Quintana Roo OR Tabasco OR Campeche OR Veracruz AND survey OR density OR distribution OR abundance OR transect\* OR occurrence OR presence OR rang\* OR habitat OR space use OR population OR encounter OR absence OR occupancy). Scopus was selected as it is one of the most extensive databases for literature published from a wide range of journals after 1995 (Falagas et al. [2008\)](#page-26-13). We included original research articles and book chapters reporting previously unpublished data. To check for any work on hierarchical modeling published in Spanish that might have been missed due to the use of Scopus, we also scanned the available literature in Spanish using Google Scholar. However, we did not find any additional research using hierarchical modeling to analyze data from Mexican primate surveys.

We found 342 studies that matched our criteria of the Scopus search. As a first step, we excluded results by title and abstract that were review articles and book chapters reporting previously published data, studies not carried out in Mexico, studies that reported no survey data, or no data on primate species. Of the remaining 39 results, we further excluded: two studies that tested methodological aspects of surveys instead of collecting survey data, one study that predicted future trends in distribution under different climate change scenarios, one study that included survey data from outside Mexico, two studies with no or minimal information on how surveys were conducted, one study on hybrid species, and four studies that were published before 2002. These exclusions resulted in 28 studies published between January 2002 and May 2022 reporting data from Mexican primate surveys. We additionally included one research article published in July 2022 by us and one book chapter known to us that was not found during the literature search. Therefore, we considered a total of 30 studies for the analyses (Table [6.2](#page-11-0)). We extracted information on the publication year, the species surveyed, the sites where surveys were carried out, the survey methods, data-analysis methods, and response variable (s) derived from survey data for each of the 30 studies.

### 6.3.2 Locations of Mexican Primate Surveys

Surveys on primate species were carried out at various sites in all Mexican states of their known geographic distribution (Fig. [6.2](#page-13-0)). Four studies included surveys at multiple sites (leading to a total of 39 surveys), and six studies reported data on broader regions such as all of Southeastern Mexico, the Yucatan Peninsula, and the states of Campeche and Oaxaca. The most common sites were Los Tuxtlas Biosphere Reserve in Veracruz ( $n = 4$  studies), Palenque National Park in Chiapas  $(n = 4)$ , Lacandona forest in Chiapas  $(n = 4)$ , and the Uxpanapa valley in Veracruz ( $n = 4$ ). Together, these studies accounted for about 41% of all surveys (out of the 39 surveys in total; Fig. [6.2](#page-13-0)). Of the 30 studies, 10 reported data on Alouatta palliata, 20 on Alouatta pigra, and 13 on Ateles geoffroyi (11 studies reported data on more than one species).

### 6.3.3 Survey and Data-Analysis Methods Used in Mexican Primate Surveys

Nine methods were used to survey the three Mexican primate species' populations (Table [6.2](#page-11-0) and Fig. [6.3\)](#page-14-0). In 7 of the 30 studies, multiple survey methods were used and results were combined (Table [6.2\)](#page-11-0). Recce walks were the most frequently reported survey method ( $n = 13$  studies), followed by complete counts ( $n = 7$ ) and line- or strip-transect sampling ( $n = 6$ ). Whereas survey methods such as linetransect sampling, recce walks, interviews, and gathering information from historic records and databases were applied to all three species, four methods were used only

					Data- analysis	Study
Source	Authors	Year	Species	Survey methods	method	ID
Scopus	Estrada et al.	2002	A. pigra	Triangulation	<b>BPT</b>	$\mathbf{1}$
Scopus	Estrada et al.	2002 <sub>b</sub>	A. pigra	Triangulation	Descr	$\overline{c}$
Scopus	Fernández et al.	2003	A. pigra, A. geoffroyi	Recce walks, Interviews	Descr	3
Scopus	Estrada et al.	2004	A. pigra, A. geoffroyi	Triangulation, Recce walks	Descr	$\overline{4}$
Scopus	Cristóbal- Azkarate et al.	2005	A. palliata	Complete count	MLR	5
Scopus	Anzures- Dadda & Manson	2006	A. palliata	Strip-/Line-transect sampling	<b>GLMM</b>	6
Additional	Serio-Silva et al.	2006	A. pigra, A. geoffroyi	Strip-/Line-transect sampling	Descr	$\overline{7}$
Scopus	Baumgarten & Williamson	2007	A. palliata, A. pigra	Historic records, database, recce walks	Descr	8
Scopus	Ortiz-Martínez & Rico-Gray	2007	A. geoffroyi	Recce walks	Descr	9
Scopus	Arroyo- Rodríguez et al.	2008	A. palliata	Complete count	GLMM	10
Scopus	Pozo-Montuy et al.	2008	A. pigra	Recce walks	<b>BPT</b>	11
Scopus	Ortiz-Martínez et al.	2008	A. pigra, A. geoffroyi	Historic records, interviews, recce walks	<b>ENM</b>	12
Scopus	Urquiza-Haas et al.	2009	A. pigra, A. geoffroyi	<b>Interviews</b>	MLR.	13
Scopus	Bonilla- Sánchez et al.	2010	A. pigra	Complete count	MLR	14
Scopus	Pozo-Montuy et al.	2011	A. pigra	Recce walks	<b>GLMM</b>	15
Scopus	Vidal-García & Serio-Silva	2011	All three	Interviews, data- base, recce walks	<b>ENM</b>	16
Scopus	Arroyo- Rodríguez et al.	2013	A. pigra	Recce walks	MLR	17
Scopus	Puig-Lagunes et al.	2016	A. palliata	Recce walks	<b>GLMM</b>	18
Scopus	Ortiz-Lozada et al.	2017	A. palliata	Strip-/line-transect sampling	Descr	19
Scopus	Calixto-Pérez et al.	2018	All three	Interviews, database	<b>ENM</b>	20

<span id="page-11-0"></span>Table 6.2 Studies selected for the literature review

(continued)

Source	Authors	Year	<b>Species</b>	Survey methods	Data- analysis method	Study ID
Scopus	Galán-Acedo et al.	2019	A. geoffroyi	Recce walks	<b>GLMM</b>	21
Scopus	Arce-Peña et al.	2019	A. pigra	Recce walks	<b>MLR</b>	22
Scopus	Klass et al.	2020	A. pigra	Complete count	<b>RA</b>	23
Scopus	Alcocer- Rodríguez et al.	2020	A. palliata	Complete count	<b>MLR</b>	24
Scopus	Klass et al.	2020b	A. pigra	Complete count	<b>BNPT</b>	25
Scopus	Spaan et al	2020	A. geoffroyi	Strip-/Line-transect sampling	<b>GLMM</b>	26
Scopus	Spaan et al.	2021	A. pigra, A. geoffroyi	Strip-/Line-transect sampling	Descr	27
Scopus	Galán-Acedo et al.	2021	A. palliata, A. pigra	Complete count	<b>GLMM</b>	28
Scopus	Shedden et al.	2022	A. pigra, A. geoffroyi	Recce walks	<b>GLMM</b>	29
Additional	Hutschenreiter et al.	2022	A. geoffroyi	Point-count sam- pling, PAM	HM	30

Table 6.2 (continued)

Notes. Year = Year of publication (first published online). Survey methods and data-analysis methods correspond to descriptions in Tables [6.1](#page-4-0) and [6.4](#page-18-0). Study ID corresponds to IDs in Fig. [6.2](#page-13-0). BPT Bivariate parametric test, Descr descriptive statistics or not reported, MLR multiple linear regression (general linear models), GLMM generalized linear (mixed) models, ENM ecological niche modeling, RA redundancy analysis, BNPT bivariate nonparametric test, HM hierarchical modeling

to survey one to two species: Complete counts were not applied to survey Geoffroy's spider monkeys, and triangulation was not used to survey mantled howler monkeys. Passive acoustic monitoring and point-count sampling were only used to survey Geoffroy's spider monkeys.

Data-analysis methods used in the 30 studies are described in Table [6.3](#page-15-0). Most studies used generalized linear (mixed) models (GLMM:  $n = 8$ ) or reported descriptive statistics and population density estimates without explicitly mentioning the calculation method used (Descriptive or not reported:  $n = 8$ ). Only one study used a hierarchical modeling approach by running Royle–Nichols models. Whereas the use of descriptive statistics and bivariate parametric tests was predominant before 2010, the use of GLMMs and ecological niche modeling became prominent within the past 10 years (Fig. [6.4](#page-16-0)).

The combinations of survey methods and data-analysis methods used for all species are illustrated in Fig. [6.5](#page-17-0). The most common combinations were the use of recce walks to run multiple linear regressions or GLMMs.

<span id="page-13-0"></span>

Fig. 6.2 Map of primate surveys carried out in Mexico since 2002. Highlighted areas in (a) show the Mexican multistate regions where surveys took place, and (b–d) show the specific locations where survey studies were carried out in each area. Numbers coincide with study IDs from Table [6.2](#page-11-0). Bicolored circles indicate more than one species was surveyed in the same study. Study IDs in (a) refer to nationwide surveys. Broad-scale surveys also include one survey of the Yucatan Peninsula  $(13)$ , one in the state of Campeche  $(3)$ , and one in the state of Oaxaca  $(12)$ 

#### 6.3.4 Response Variables Used in Mexican Primate Surveys

Survey data were used to calculate from one to nine response variables per study and species. As studies evaluate different aspects of the species' population ecology, we grouped response variables into five types: abundance of individuals, group composition, abundance of groups, species presence/absence, and others (Table [6.4\)](#page-18-0). Whereas abundance of individuals was the most common type of response variable for surveys on the black howler monkey (42%,  $n = 15$  response variables), presence/ absence-related outcomes were most reported for the mantled howler monkey (47%,  $n = 9$ ). The abundance of individuals (27%,  $n = 6$ ) and presence/absence-related

<span id="page-14-0"></span>

Fig. 6.3 Survey methods (the inner circle) and corresponding data-analysis methods (outer circle) were reported for studies on (a) Ateles geoffroyi, (b) Alouatta pigra, and (c) Alouatta palliata. Descriptive Descriptive statistics or not reported, HM Hierarchical modeling, GL(M)M Generalized linear (mixed) models, ENM Ecological niche modeling (see Table [6.3](#page-15-0) for details on data-analysis methods). When multiple data-analysis methods were used in the same study, we report the statistical approach with the highest complexity among them (see Table [6.3](#page-15-0) for the degree of complexity)

outcomes (27%,  $n = 6$ ) were the most reported response variables for Geoffroy's spider monkey (Table [6.4\)](#page-18-0).

Types of response variables were combined with several data-analysis methods across species (Fig. [6.5](#page-17-0)). Response variables measuring the abundance of individuals and group composition were mostly combined with descriptive statistics (12%,  $n = 7$  combinations), whereas response variables based on species presence/absence data were more broadly combined with data-analysis methods including ecological niche modeling, GLMMs and descriptive statistics (15%,  $n = 9$ ; Fig. [6.5](#page-17-0)).

Data-analysis method category	Details of the specific methods used in the 30 studies	Degree of complexity (criterion for the degree)
Descriptive or not reported	No statistical inference or distance- sampling approach used; if density estimates are reported, no information about how they were calculated	Low (no inferential statistics)
Bivariate non- parametric test	Mann-Whitney U-test, Kruskal-Wal- lis test and Spearman rank correlation	Low (one dependent and one inde- pendent factor)
Bivariate para- metric test	T-test and bivariate linear regression, assuming normal error distribution of response variable	Low (one dependent and one inde- pendent factor)
Multiple linear regression	General linear models, <i>i.e.</i> , multiple (including stepwise) regression models assuming normal error distri- bution of response variables	Intermediate (one dependent and multiple independent factors)
Redundancy analysis	Extension of multiple linear regression to analyze variation in multiple response variables	Intermediate (multiple dependent and independent factors)
<b>GLMM</b>	Generalized linear models or general- ized linear mixed models, i.e., assum- ing non-normal error distribution of the response variable	High (one dependent and multiple independent factors, possibility to include random effects)
Ecological niche modeling	Correlative model of presence data and climatic parameters to predict species habitat suitability	High (one dependent and multiple independent factors, specifically developed for modeling species distribution)
Hierarchical modeling	Conditionally related set of general- ized linear models	Highest (two dependent and multiple independent factors, linking sets of models through conditional probabilities)

<span id="page-15-0"></span>Table 6.3 Data-analysis methods used for data derived from Mexican primate surveys

### 6.4 Discussion

In our literature review, we found 30 studies reporting survey data on Mexican primate species that were published between 2002 and 2022. The black howler monkey was the most often surveyed species followed by Geoffroy's spider monkey and the mantled howler monkey. Most surveys were conducted at a few sites in the states of Chiapas and Veracruz. Despite a great variety of methods used to collect and analyze data from Mexican primate surveys, we found only one study that used hierarchical modeling for data analysis. GLMMs and descriptive statistics were the most common data-analysis methods overall, although there appears to be a trend toward using more complex data-analysis methods over time. In most studies, response variables related to the individual abundance of a species were reported, followed by measures of presence/absence-related outcomes and measures of group composition.

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Fig. 6.4 Data-analysis methods used in the 30 reviewed studies plotted by their year of publication. When multiple data-analysis methods were used in the same study, we report the statistical approach with the highest complexity among them (see Table [6.3](#page-15-0) for the degree of complexity). Boxplots show minimum and maximum values (lower and upper whiskers), first and third quartile (lower and upper box limits), medians (white lines), and outliers (dots) for each data-analysis method. Methods used in only one study are represented by a single line corresponding to the publication year. Abbreviations for data-analysis methods correspond to those used in Table [6.2](#page-11-0)

Notably, the total number of surveys on Mexican primate populations since 2002 is small. This, in part, is certainly the result of limiting our literature review to Scopus, which includes less gray literature than databases such as Google Scholar (Calver et al. [2017](#page-24-13)). Hence, we probably missed unpublished work such as dissertations, reports for funding bodies and by governmental agencies and NGOs, and literature that was published in regional/national journals and IUCN specialist group journals. This was intentional as our aim was not to conduct an extensive systematic review but to create an overall picture of the main methods used to survey Mexican primates. Still, we point out that presumably more surveys were conducted on Mexican primates than reported in this chapter, including surveys from studies we excluded, e.g., those that used data from inside and outside Mexico in the same analysis or lacked information on survey methodology, as well as multispecies studies that included data on Mexican primate species but report results at the community level (e.g., Cudney-Valenzuela et al. [2021\)](#page-25-3). As the latter type of studies was not picked up by our search strategy (i.e., using keywords related to Mexican primates specifically rather than to animal assemblages), we might have missed studies using hierarchical modeling for data on Mexican animal communities that included primate species.

<span id="page-17-0"></span>

**Data-analysis method** 

Interviews, Historic records, Recce walks

Fig. 6.5 Combinations of survey methods, data-analysis methods, and types of response variables used in the 30 studies (based on 57 data points as multiple types of data-analysis methods and response variables were used in 18 studies). Colored lines connect survey methods with the dataanalysis methods and data-analysis methods with the types of response variables they were combined with. The thicker the line, the more often a specific combination of survey and dataanalysis method or data-analysis method and type of response variable reported. Vertical black bars indicate which lines are connected to the respective survey method, data-analysis method, and type of response variable. The order of methods and response types was set to minimize overlap between lines for improved readability. Note that all data-analysis methods were included in the Figure, not only those of the highest complexity in a study

### 6.4.1 Survey Methods

We found recce walks to be the most common method to survey Mexican primate species since 2002 followed by complete counts and line-transect sampling, all consisting of observers detecting primates from the ground (Plumptre et al. [2013\)](#page-28-1). Recce walks have no systematic search strategy, which makes the method more susceptible to bias from observer behavior (e.g., spending more time scanning more accessible areas or areas where the species is assumed to be present) than linetransect sampling, and is prone to bias from heterogeneity in detection probability (Campbell et al. [2016](#page-24-5)). In contrast, the use of complete counts assumes that all animals present in an area are detected during a survey (Plumptre et al. [2013;](#page-28-1) Campbell et al. [2016\)](#page-24-5), making it unnecessary to control survey results for detection probability. This method is therefore preferable to recce walks, when feasible, i.e., when habitat type, animal behavior, observer experience, and survey effort allow for detection of all individuals present, as it is the case, e.g., for howler monkey surveys in small forest fragments (Klass et al. [2020a\)](#page-27-15). Feasibility of complete counts, however, is often hampered in surveys of arboreal primate species given the low

Type of response		Percentage of use $(\%)^a$				
variable	Specific response variables	A. geoffroyi A. pigra		A. palliata		
Abundance of individuals	Individual encounter rates Individual density Number of individuals per group Number of individuals per sub- group Number of individuals per fragment	27	42.	26		
Group composition	Adult sex ratio Juvenile sex ratio Immature-to-female ratio Immature-to-adult ratio Infant-to-adult ratio Infant-to-female ratio Juvenile-to-infant ratio	14	19	16		
Abundance of groups	Group density Number of groups at study site Subgroup density $\lambda$ (average abundance at site)	18	11	11		
Species presence/ absence	Naïve occupancy Naïve patch occupancy Presence or absence Presence probability Predicted distribution	27	22	47		
Other	Area of distribution Habitat type <b>Biomass</b>	14	6	$\Omega$		

<span id="page-18-0"></span>Table 6.4 Types of response variables derived from data from Mexican primate surveys

<sup>a</sup>The percentage of use was calculated out of the total number of types of response variables used in all studies for each of the three species

visibility in tropical forests, causing individuals to be missed due to imperfect detection (Spaan et al. [2017](#page-29-14)), and the high mobility of the animals in a vast space, causing individuals to be missed due to their temporary absence during the time of the survey (Plumptre et al. [2013](#page-28-1); Dénes et al. [2015](#page-26-0)). Recently developed survey methods, such as drone surveys with thermal infrared cameras, can contribute to increasing the feasibility of complete counts by covering large survey areas with high detectability, but these methods are still in development for Mexican primates (Spaan et al.  $2019a$ ). Whether requirements are met to consider survey results as complete counts (also called "full counts," "total count method," or "complete census") also depends on the definition of the term (which may differ between fields) and on the unit of observation (e.g., a focal patch or a specified sample area). It is vital to define the dependent variable to allow comparisons between studies. Note that the studies in our review report complete counts as surveys that cover entirely an area of predetermined size and assume all individuals present were detected.

Line-transect sampling is the preferred ground-survey method when requirements for total counts are not met (Campbell et al. [2016](#page-24-5)) as its standardized methodology allows for the application of data-analysis methods accounting for differences in detection probability (e.g., distance sampling; Buckland et al. [2010\)](#page-24-4). However, in areas of challenging terrain or restricted accessibility, line-transect surveys may not always be logistically feasible. In such cases, point-transect sampling, camera-trap surveys, passive acoustic monitoring, or drone surveys might be more spatially flexible alternatives to detect primate species using standardized methodology.

The use of interviews as an indirect survey method is rare and mostly used in combination with other survey methods for presence-only data-analysis methods such as ecological niche modeling (Fig. [6.5](#page-17-0)). Local ecological knowledge is a valuable source of information and can provide accurate presence/absence data that coincide with results from direct survey methods such as ground surveys (Shedden et al. [2022\)](#page-29-3). The potential for interviews as a survey method to be combined with data-analysis methods such as occupancy modeling should thus be further explored for its applicability to primate surveys. Recent studies have applied detectability measures to interview data to evaluate potential biases of presence/ absence information based on local ecological knowledge. For example, Camino et al. ([2020\)](#page-24-14) estimated the probability of false-negative and false-positive detections of animals during interviews compared to information from camera-trapping and line-transect sampling, and Brittain et al. ([2022\)](#page-24-15) identified predictors of detection probability during interviews such as the time an informant spent in the forest. Once important predictors are identified, they can be incorporated into occupancy modeling with interview data to provide more accurate occupancy estimates. Like interviews, presence data from citizen science projects and open-access community science platforms (e.g., iNaturalist) are rich sources of information but are affected by bias (e.g., sightings might be clustered around touristic sites or cities). Modeling these sources of bias with hierarchical models (van Strien et al. [2013;](#page-30-9) Bird et al. [2014\)](#page-24-16) can aid the addition of citizen science data into primate surveys. As such, interview and citizen science data will likely be increasingly used as a stand-alone survey method or in combination with other survey methods.

None of the studies reviewed used camera trapping or playbacks to survey Mexican primate species although these survey methods have been used at the community level (e.g., Cudney-Valenzuela et al. [2021\)](#page-25-3) and for howler and spider monkeys outside of Mexico (Blake et al. [2010](#page-24-6); Peck et al. [2010;](#page-28-3) Salcedo et al. [2014\)](#page-29-6). Studies using novel survey methods for Mexican primate species are mostly aimed at improving methods to obtain accurate and precise population estimates (e.g., testing the use of drones: Spaan et al. [2019a,](#page-29-4) [2022\)](#page-29-8) or were used to gather behavioral information (e.g., the use of camera traps to document terrestrial drinking behavior: Delgado-Martínez et al. [2021\)](#page-25-13). Although these methodological studies indicate that novel survey methods will be applied to field surveys soon, traditional ground survey methods are still popular and will likely remain the standard in the near future across Mesoamerica. It is therefore important to promulgate how such traditional data-collection methods can be combined with recently developed data-analysis methods such as hierarchical modeling (Cavada et al. [2016\)](#page-25-14).

Regardless of the method used (traditional or more recent survey methods), widescale surveys of Mexican primates have yet to take place. This is key, as although the national action plan for the conservation of Mexican primates (Oropeza Hernández and Rendón Hernández [2012](#page-28-0)) draws attention to the need to gain more information on their abundance and distribution, we found that most of the survey efforts in Mexico are focused on a few study sites. Knowledge gaps remain in many regions of the country, especially regarding the distributional limits of each of the three species and along the coast of the states of Oaxaca and Chiapas (Ortiz-Martínez et al. [2008\)](#page-28-2).

#### 6.4.2 Data-Analysis Methods

Although the use of descriptive statistics is still common practice in surveys on Mexican primate species, a trend toward the use of more complex multivariate dataanalysis methods, predominantly GLMMs, over the past decade is evident from our literature review. GLMMs are a powerful tool to model Poisson-distributed count data or binomially distributed occurrence data, while accounting for the impact of a multitude of predictor variables (Bolker et al. [2008](#page-24-1)). A problem with using GLMMs to analyze survey data is that count or occurrence data might be biased by heterogeneity in detection probability across sites and survey periods if individuals are not detected with 100% certainty. Approaches such as model-based distance sampling (e.g., plot count models; Buckland et al. [2015\)](#page-24-0), N-mixture models and hierarchical distance sampling (Kéry and Royle [2016](#page-27-7)) resolve this issue as these approaches correct count data for detection probability before modeling abundance as Poissondistributed count data (i.e., before applying generalized linear modeling to count data). However, we found none of these approaches to have been applied to Mexican primate survey data.

Occupancy models and Royle–Nichols models are analogous options to correct for heterogeneity in detection probability before modeling occupancy or abundance based on occurrence data with a binomial error distribution (i.e., before applying generalized linear modeling to presence/absence data). We only found one study that applied Royle–Nichols models to the presence/absence data of Geoffroy's spider monkeys (Hutschenreiter et al. [2022](#page-27-4)) and not a single study using occupancy modeling for any of the three species. Occupancy modeling is common practice in population monitoring studies for many other mammal species (Rivero and Spitale 2016) and can easily be applied to data from primate surveys (e.g., Johnson et al. [2020\)](#page-27-16). Many of the studies included in our literature review collected presence/ absence data and could easily have made use of occupancy modeling but instead used GLMMs (which is ideal when used in combination with complete counts, but not when there is heterogeneity in detection probability), only reported descriptive statistics, or used potentially inappropriate data-analysis methods (e.g., Bonilla-Sánchez et al. [2010](#page-24-17)) such as bivariate parametric tests or general linear models (Table [6.3](#page-15-0) and Fig. [6.5](#page-17-0)). Both methods require the response variable to have normally distributed residuals, which is not the case for count and presence/absence data that usually follow Poisson and binomial error distributions (or derivates such as negative-binomial; Buckley [2015](#page-24-18)). When data are not corrected through, e.g., normalization approaches (as applied in Alcocer-Rodríguez et al. [2020](#page-23-7); Arce-Peña et al. [2019](#page-23-8); but see O'Hara and Kotze [2010\)](#page-28-11), results from parametric data-analysis methods can lead to incorrect estimates of predictor variables (Buckley [2015\)](#page-24-18) and should be used with caution in primate surveys. Given their limited informative power, the stand-alone use of descriptive statistics should be avoided when possible, considering the broad palette of data-analysis methods available for primate survey data.

The lack of use of distance-sampling approaches in the 30 studies obtained from our literature search might be caused partly by the need for a large number of sightings at a single site to accurately estimate population densities (Buckland et al. [2001](#page-24-2)), a number that is often unrealistic to obtain in surveys of primate species given the low densities at which most of these species occur (e.g., Spaan et al. [2020](#page-29-5)) and the usually low detection probabilities during surveys (Spaan et al. [2022](#page-29-8)). In contrast, the use of hierarchical modeling approaches is not encumbered by the need for a minimum number of sightings. Instead, survey effort can be increased to a reasonable extent if species occur at low densities (Guillera-Arroita et al. [2010](#page-27-2)) yet another reason we encourage the use of hierarchical modeling.

Despite the existence of hierarchical modeling for the past two decades, our literature review revealed that its widespread application to analyzing survey data on Mexican primates has yet to take place. Statistical approaches can only make their way into survey design when (1) these approaches are known, and (2), sufficient training is provided to implement them. For the former, attention needs to be drawn to the power and usefulness of a novel approach, such as through the release and dissemination of works like the present book. For the latter, the provision of capacity-building options among practitioners is crucial. Given the existing mismatch between the amount of available literature on hierarchical modeling and the frequency of its use with data from Mexican primate surveys, we emphasize the need for both attention-raising and training opportunities. Ecological statistics is a rapidly advancing field (Mundry [2019](#page-28-12); Anderson et al. [2021](#page-23-9)), which sometimes makes it difficult to distinguish between statistical "fashion trends" that mainly aid in making a study more attractive for publication (Warton [2022\)](#page-30-10), and approaches that provide valid solutions to existing problems and eventually become established research tools. In this chapter, we aimed to show that hierarchical modeling is such a powerful approach by arguing the various ways it can be advantageously used to survey data of spider and howler monkeys as well as of other primate and arboreal mammal species across Mesoamerica and South America.

#### 6.4.3 Response Variables

We found the abundance of individuals to be the most common type of response variable calculated from survey data on Mexican primates. When the degree of fission–fusion dynamics is high to moderate, such as in spider monkeys (Aureli et al. [2008\)](#page-23-4) and some populations of mantled howler monkeys (Dias and Luna [2006\)](#page-26-10), reporting outcomes based on individual sightings is useful as subgroups of the same group can be widely spaced and vary in number and size depending on current food availability (Pinacho-Guendulain and Ramos-Fernández [2017](#page-28-8); Spaan et al. [2019b\)](#page-29-12). Hence, the size and composition of a sighted subgroup does not reveal any information about the group size and composition, and the number of sighted subgroups might be more related to seasonal food availability than to the actual group size. We, therefore, recommend the use of individual encounter rates or densities rather than subgroup size or subgroup density estimates for populations that form subgroups (i.e., a high to moderate degree of fission–fusion dynamics). Alternatively, the use of presence/absence data in hierarchical models can provide reliable estimates of occupancy and relative abundance when populations form subgroups. Royle– Nichols modeling might be more suitable than occupancy modeling in this case as it assumes heterogeneity in species abundance within sampling areas (Royle and Nichols [2003\)](#page-29-15), which might better model the distribution of multiple primate groups and subgroups at a site (Hutschenreiter et al. [2022](#page-27-4)).

After individual abundance estimates and presence/absence-related outcomes, measures of group composition were the most commonly calculated response variables. To accurately estimate group composition and demography, researchers need to ensure that detection probability is consistent across individuals in the group. This is not always the case as, e.g., young might be missed easier than adult individuals (as shown for spider monkeys: Spaan et al. [2017](#page-29-14)), leading to biased group size and composition estimates. This is particularly problematic in two instances: (1) when comparing group size across sites or over time and (2) when calculating group composition ratios (e.g., young-adult female ratios), which provide important information on the reproductive and, therefore, conservation status of a population. To overcome biased estimates, it might be feasible to calculate detection probabilities separately for different age and sex categories of individuals (e.g., adults versus young or females versus males) and correct individual counts in each category before calculating corresponding ratios (e.g., young-adult female ratio). To our knowledge, no study on primate surveys has put such an approach to the test yet.

### 6.5 Conclusions

Our literature review revealed that, to date, the use of hierarchical modeling is still underrepresented in surveys on Mexican primate species, despite having been developed two decades ago and having been applied to surveys of many other mammal species. Besides distance sampling, hierarchical modeling provides the only approach to incorporate detection probability into estimates of species abundance, but in contrast to distance sampling, it can do so in a much more flexible way in combination with any type of traditional or novel survey method. Moreover, hierarchical modeling based on presence/absence data can overcome sampling bias due to high degrees of fission–fusion dynamics. We, therefore, emphasize the suitability of hierarchical modeling for Mexican and other primate surveys, and advocate for capacity building to implement this data-analysis method in field surveys.

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### **References**

- <span id="page-23-7"></span>Alcocer-Rodríguez M, Arroyo-Rodríguez V, Galán-Acedo C et al (2020) Evaluating extinction debt in fragmented forests: the rapid recovery of a critically endangered primate. Anim Conserv. <https://doi.org/10.1111/acv.12648>
- <span id="page-23-9"></span>Anderson SC, Elsen PR, Hughes BB et al (2021) Trends in ecology and conservation over eight decades. Front Ecol Environ 19:274–282. <https://doi.org/10.1002/FEE.2320>
- <span id="page-23-2"></span>Anzures-Dadda A, Manson RH (2006) Patch- and landscape-scale effects on howler monkey distribution and abundance in rainforest fragments. Anim Conserv 10:69–76. https://doi.org/ [10.1111/j.1469-1795.2006.00074.x](https://doi.org/10.1111/j.1469-1795.2006.00074.x)
- <span id="page-23-8"></span>Arce-Peña NP, Arroyo-Rodríguez V, Dias PAD et al (2019) Linking changes in landscape structure to population changes of an endangered primate. Landsc Ecol 34:2687–2701. [https://doi.org/10.](https://doi.org/10.1007/s10980-019-00914-8)  [1007/s10980-019-00914-8](https://doi.org/10.1007/s10980-019-00914-8)
- <span id="page-23-0"></span>Arroyo-Rodríguez V, Dias PAD (2010) Effects of habitat fragmentation and disturbance on howler monkeys: a review. Am J Primatol 72:1–16. <https://doi.org/10.1002/AJP.20753>
- Arroyo-Rodríguez V, Mandujano S, Benítez-Malvido J (2008) Landscape attributes affecting patch occupancy by howler monkeys (Alouatta palliata mexicana) at Los Tuxtlas, Mexico. Am J Primatol 70:69–77. <https://doi.org/10.1002/ajp.20458>
- <span id="page-23-3"></span>Arroyo-Rodríguez V, González-Perez IM, Garmendia A et al (2013) The relative impact of forest patch and landscape attributes on black howler monkey populations in the fragmented Lacandona rainforest, Mexico. Landsc Ecol 28:1717–1727. [https://doi.org/10.1007/s10980-](https://doi.org/10.1007/s10980-013-9929-2) [013-9929-2](https://doi.org/10.1007/s10980-013-9929-2)
- <span id="page-23-6"></span>Arroyo-Rodríguez V, Andresen E, Bravo SP, Stevenson PR (2015) Seed dispersal by Howler monkeys: current knowledge, conservation implications, and future directions. In: Kowalewski MM, Garber PA, Cortés-Urbani L et al (eds) Howler monkeys: behavior, ecology, and conservation. Springer, New York, pp 111–139
- <span id="page-23-5"></span>Asensio N, Lusseau D, Schaffner CM, Aureli F (2012) Spider monkeys use high-quality core areas in a tropical dry forest. J Zool 287:250–258. <https://doi.org/10.1111/j.1469-7998.2012.00911.x>
- <span id="page-23-4"></span>Aureli F, Schaffner CM, Boesch C et al (2008) Fission-fusion dynamics: new research frameworks. Curr Anthropol 49:627–654. <https://doi.org/10.1086/586708>
- <span id="page-23-1"></span>Baumgarten A, Williamson GB (2007) The distributions of howling monkeys (Alouatta pigra and A. palliata) in southeastern Mexico and Central America. Primates 48:310–315. [https://doi.org/](https://doi.org/10.1007/s10329-007-0049-y)  [10.1007/s10329-007-0049-y](https://doi.org/10.1007/s10329-007-0049-y)
- <span id="page-24-10"></span>Bergman TJ, Cortés-Ortiz L, Dias PAD et al (2016) Striking differences in the loud calls of howler monkey sister species (Alouatta pigra and A. palliata). Am J Primatol 78:755–766. [https://doi.](https://doi.org/10.1002/AJP.22539)  [org/10.1002/AJP.22539](https://doi.org/10.1002/AJP.22539)
- <span id="page-24-16"></span>Bird TJ, Bates AE, Lefcheck JS et al (2014) Statistical solutions for error and bias in global citizen science datasets. Biol Conserv 173:144–154. <https://doi.org/10.1016/J.BIOCON.2013.07.037>
- <span id="page-24-6"></span>Blake JG, Guerra J, Mosquera D et al (2010) Use of mineral licks by white-bellied spider monkeys (Ateles belzebuth) and red howler monkeys (Alouatta seniculus) in Eastern Ecuador. Int J Primatol 31:471–483. <https://doi.org/10.1007/S10764-010-9407-5/FIGURES/6>
- <span id="page-24-1"></span>Bolker BM, Brooks ME, Clark CJ et al (2008) Generalized linear mixed models: a practical guide for ecology and evolution. Trends Ecol Evol 24:127–135. [https://doi.org/10.1016/j.tree.2008.](https://doi.org/10.1016/j.tree.2008.10.008)  [10.008](https://doi.org/10.1016/j.tree.2008.10.008)
- <span id="page-24-17"></span>Bonilla-Sánchez YM, Serio-Silva JC, Pozo-Montuy G, Bynum N (2010) Population status and identification of potential habitats for the conservation of the Endangered black howler monkey Alouatta pigra in northern Chiapas, Mexico. Oryx 44:293–299. [https://doi.org/10.1017/](https://doi.org/10.1017/S0030605310000025)  [S0030605310000025](https://doi.org/10.1017/S0030605310000025)
- <span id="page-24-8"></span>Bonnin N, Van Andel A, Kerby J et al (2018) Assessment of chimpanzee nest detectability in droneacquired images. Drones 2:17. <https://doi.org/10.3390/drones2020017>
- <span id="page-24-12"></span>Boyle SA (2021) Home range analysis. In: Spatial analysis in field primatology. Cambridge University Press, pp 129–151
- <span id="page-24-11"></span>Briseño-Jaramillo M, Biquand V, Estrada A, Lemasson A (2017) Vocal repertoire of free-ranging black howler monkeys' (Alouatta pigra): call types, contexts, and sex-related contributions. Am J Primatol 79:e22630. <https://doi.org/10.1002/AJP.22630>
- <span id="page-24-9"></span>Briseño-Jaramillo M, Berthet M, Estrada A et al (2021) Socially mediated overlap in vocal interactions between free-ranging black howler monkeys. Am J Primatol 83. [https://doi.org/](https://doi.org/10.1002/ajp.23297)  [10.1002/ajp.23297](https://doi.org/10.1002/ajp.23297)
- <span id="page-24-15"></span>Brittain S, Rowcliffe MJ, Kentatchime F et al (2022) Comparing interview methods with camera trap data to inform occupancy models of hunted mammals in forest habitats. Conserv Sci Pract 4. <https://doi.org/10.1111/csp2.12637>
- <span id="page-24-7"></span>Brockelman WY, Ali WR (1987) Methods of surveying and sampling forest primate populations. In: Mittermeier RA, Marsh PRW (eds) Conservation in the tropical rainforest. Alan Liss, New York, pp 23–62
- <span id="page-24-2"></span>Buckland ST, Anderson DR, Burnham KP et al (2001) Introduction to distance sampling: estimating abundance of biological populations. Oxford University Press, Oxford
- <span id="page-24-4"></span>Buckland ST, Plumptre AJ, Thomas L, Rexstad EA (2010) Design and analysis of line transect surveys for primates. Int J Primatol 31:833–847. <https://doi.org/10.1007/s10764-010-9431-5>
- <span id="page-24-0"></span>Buckland ST, Rexstad EA, Marques TA, Oedekoven CS (2015) Distance sampling: methods and applications. Springer International Publishing, Cham
- <span id="page-24-18"></span>Buckley YM (2015) Generalized linear models. In: Fox AG, Negrete-Yankelevich S, Sosa VJ (eds) Ecological statistics contemporary theory and application. Oxford University Press, pp 131–148
- <span id="page-24-3"></span>Calixto-Pérez E, Alarcón-Guerrero J, Ramos-Fernández G et al (2018) Integrating expert knowledge and ecological niche models to estimate Mexican primates' distribution. Primates 59:451– 467. <https://doi.org/10.1007/S10329-018-0673-8>
- <span id="page-24-13"></span>Calver MC, Goldman B, Hutchings PA, Kingsford RT (2017) Why discrepancies in searching the conservation biology literature matter. Biol Conserv 213:19–26. [https://doi.org/10.1016/J.](https://doi.org/10.1016/J.BIOCON.2017.06.028)  [BIOCON.2017.06.028](https://doi.org/10.1016/J.BIOCON.2017.06.028)
- <span id="page-24-14"></span>Camino M, Thompson J, Andrade L et al (2020) Using local ecological knowledge to improve large terrestrial mammal surveys, build local capacity and increase conservation opportunities. Biol Conserv 244:108450. <https://doi.org/10.1016/J.BIOCON.2020.108450>
- <span id="page-24-5"></span>Campbell G, Head J, Junker J, Nekaris KAI (2016) Primate abundance and distribution: background concepts and methods. In: Wich SA, Marshall AJ (eds) An introduction to Primate Conservation. Oxford University Press, pp 79–110
- <span id="page-25-7"></span>Campos-Cerqueira M, Aide TM (2016) Improving distribution data of threatened species by combining acoustic monitoring and occupancy modelling. Methods Ecol Evol 7:1340–1348. <https://doi.org/10.1111/2041-210X.12599>
- <span id="page-25-14"></span>Cavada N, Barelli C, Ciolli M, Rovero F (2016) Primates in human-modified and fragmented landscapes: the conservation relevance of modelling habitat and disturbance factors in density estimation. PLoS One 11:e0148289. <https://doi.org/10.1371/JOURNAL.PONE.0148289>
- <span id="page-25-8"></span>Ceccarelli E, Rangel-Negrín A, Coyohua-Fuentes A et al (2021) Vocal and movement responses of mantled howler monkeys (Alouatta palliata) to natural loud calls from neighbors. Am J Primatol 83. <https://doi.org/10.1002/ajp.23252>
- <span id="page-25-12"></span>Chaves ÓM, Stoner KE, Arroyo-Rodríguez V (2011) Seasonal differences in activity patterns of Geoffroyís spider monkeys (Ateles geoffroyi) living in continuous and fragmented forests in Southern Mexico. Int J Primatol 32:960–973. <https://doi.org/10.1007/s10764-011-9515-x>
- <span id="page-25-4"></span>Cheyne SM, Thompson CJH, Phillips AC et al (2008) Density and population estimate of gibbons (Hylobates albibarbis) in the Sabangau catchment, Central Kalimantan, Indonesia. Primates 49: 50–56. <https://doi.org/10.1007/s10329-007-0063-0>
- <span id="page-25-5"></span>Corcoran E, Denman S, Hamilton G (2020) New technologies in the mix: assessing N-mixture models for abundance estimation using automated detection data from drone surveys. Ecol Evol 10:8176–8185. <https://doi.org/10.1002/ece3.6522>
- <span id="page-25-10"></span>Cornick LA, Markowitz H (2002) Diurnal vocal patterns of the black howler monkey (Alouatta pigra) at Lamanai, Belize. J Mammal 83:159–166. [https://doi.org/10.1644/1545-1542\(2002\)](https://doi.org/10.1644/1545-1542(2002)083<0159:DVPOTB>2.0.CO;2)  083<[0159:DVPOTB](https://doi.org/10.1644/1545-1542(2002)083<0159:DVPOTB>2.0.CO;2)>2.0.CO;2
- Cortés-Ortiz L, Duda TF, Canales-Espinosa D et al (2007) Hybridization in large-bodied new world primates. Genetics 176:2421–2425. <https://doi.org/10.1534/GENETICS.107.074278>
- <span id="page-25-0"></span>Cortés-Ortíz L, Rosales-Meda M, Marsh L, et al (2020) Alouatta pigra. The IUCN Red List of threatened species 2020, e.T914A17926000. [https://doi.org/10.2305/IUCN.UK.2020-3.RLTS.](https://doi.org/10.2305/IUCN.UK.2020-3.RLTS.T914A17926000.en)  [T914A17926000.en.](https://doi.org/10.2305/IUCN.UK.2020-3.RLTS.T914A17926000.en) Accessed on 9 Oct 2022.
- <span id="page-25-1"></span>Cortés-Ortíz L, Solano-Rojas D, Rosales-Meda M, et al (2021) Ateles geoffroyi (amended version of 2020 assessment). The IUCN Red List of threatened species 2021, e.T2279A191688782. <https://doi.org/10.2305/IUCN.UK.2021-1.RLTS.T2279A191688782.en>. Accessed 6 Sept 2022.
- Cristóbal-Azkarate J, Veà JJ, Asensio N, Rodríguez-Luna E (2005) Biogeographical and floristic predictors of the presence and abundance of mantled howlers (Alouatta palliata mexicana) in rainforest fragments at Los Tuxtlas, Mexico. Am J Primatol 67:209–222. [https://doi.org/10.](https://doi.org/10.1002/ajp.20178)  [1002/ajp.20178](https://doi.org/10.1002/ajp.20178)
- <span id="page-25-11"></span>Crockett CM, Eisenberg JF (1986) Howlers: variations in group size and demography. In: Smuts BB, Cheney DL, Seyfarth RW, Wrangham RM (eds) Primate Societies. University of Chicago Press, Chicago, pp 54–68
- <span id="page-25-2"></span>Cuarón AD, Shedden A, Rodriguez-Luna E, et al. (2020) Alouatta palliata ssp. mexicana. The IUCN Red List of threatened species 2020, e.T925A17978896. [https://doi.org/10.2305/IUCN.](https://doi.org/10.2305/IUCN.UK.2020-2.RLTS.T925A17978896.en)  [UK.2020-2.RLTS.T925A17978896.en.](https://doi.org/10.2305/IUCN.UK.2020-2.RLTS.T925A17978896.en)
- <span id="page-25-3"></span>Cudney-Valenzuela SJ, Arroyo-Rodríguez V, Andresen E et al (2021) Does patch quality drive arboreal mammal assemblages in fragmented rainforests? Perspect Ecol Conserv 19:61–68. <https://doi.org/10.1016/J.PECON.2020.12.004>
- <span id="page-25-9"></span>Da Cunha RGT, Byrne RW (2006) Roars of black howler monkeys (Alouatta caraya): evidence for a function in inter-group spacing. Behaviour 143:1169–1199. [https://doi.org/10.1163/](https://doi.org/10.1163/156853906778691568)  [156853906778691568](https://doi.org/10.1163/156853906778691568)
- <span id="page-25-6"></span>Deichmann JL, Acevedo-Charry O, Barclay L et al (2018) It's time to listen: there is much to be learned from the sounds of tropical ecosystems. Biotropica 50:713–718. [https://doi.org/10.](https://doi.org/10.1111/btp.12593)  [1111/btp.12593](https://doi.org/10.1111/btp.12593)
- <span id="page-25-13"></span>Delgado-Martínez CM, Spaan D, Contreras-Moreno FM et al (2021) Spider monkey use of natural and artificial terrestrial water sources in Calakmul, Mexico. Behaviour 158:161–175. [https://doi.](https://doi.org/10.1163/1568539X-bja10056)  [org/10.1163/1568539X-bja10056](https://doi.org/10.1163/1568539X-bja10056)
- <span id="page-26-0"></span>Dénes FV, Silveira LF, Beissinger SR (2015) Estimating abundance of unmarked animal populations: accounting for imperfect detection and other sources of zero inflation. Methods Ecol Evol 6:543–556. <https://doi.org/10.1111/2041-210X.12333>
- <span id="page-26-10"></span>Dias PAD, Luna ER (2006) Seasonal changes in male associative behavior and subgrouping of Alouatta palliata on an Island. Int J Primatol 276(27):1635–1651. [https://doi.org/10.1007/](https://doi.org/10.1007/S10764-006-9088-2)  [S10764-006-9088-2](https://doi.org/10.1007/S10764-006-9088-2)
- Dias PAD, Rangel-Negrín A (2015) Diets of Howler monkeys. In: Kowalewski M, Garber P, Cortés-Ortiz L et al (eds) Howler monkeys. Developments in primatology: progress and prospects. Springer, New York, pp 21–56
- <span id="page-26-9"></span>DiFiore A, Link A, Dew JL (2008) Diets of wild spider monkeys. In: Campbell CJ (ed) Spider Monkeys. Cambridge University Press, Cambridge, pp 81–137
- <span id="page-26-4"></span>Do Nascimento LA, Pérez-Granados C, Beard KH (2021) Passive acoustic monitoring and automatic detection of Diel Patterns and acoustic structure of Howler Monkey roars. Divers 13:566. <https://doi.org/10.3390/D13110566>
- <span id="page-26-8"></span>Dubreuil C, Notman H, Pavelka MSM (2015) Sex differences in the use of whinny vocalizations in spider monkeys (Ateles geoffroyi). Int J Primatol 36:412–428. [https://doi.org/10.1007/s10764-](https://doi.org/10.1007/s10764-015-9832-6) [015-9832-6](https://doi.org/10.1007/s10764-015-9832-6)
- Estrada A, Mendoza A, Castellanos L et al (2002) Population of the black howler monkey (Alouatta pigra) in a fragmented landscape in Palenque, Chiapas, Mexico. Am J Primatol 58:45–55. <https://doi.org/10.1002/ajp.10051>
- Estrada A, Castellanos L, Garcia Y et al (2002b) Survey of the black howler monkey, Alouatta pigra, population at the mayan site Palenque, Chiapas, Mexico. Primates 43:51–58. [https://doi.](https://doi.org/10.1007/BF02629576)  [org/10.1007/BF02629576](https://doi.org/10.1007/BF02629576)
- <span id="page-26-5"></span>Estrada A, Luecke L, Van Belle S et al (2004) Survey of black howler (Alouatta pigra) and spider (Ateles geoffroyi) monkeys in the Mayan sites of Calakmul and Yaxchilán, Mexico and Tikal, Guatemala. Primates 45:33–39. <https://doi.org/10.1007/s10329-003-0062-8>
- <span id="page-26-13"></span>Falagas ME, Pitsouni EI, Malietzis GA, Pappas G (2008) Comparison of PubMed, Scopus, Web of Science, and Google Scholar: strengths and weaknesses. FASEB J 22:338–342. [https://doi.org/](https://doi.org/10.1096/FJ.07-9492LSF)  [10.1096/FJ.07-9492LSF](https://doi.org/10.1096/FJ.07-9492LSF)
- <span id="page-26-11"></span>Fedigan LM, Fedigan L, Chapman C, Glander KE (1988) Spider monkey home ranges: a comparison of radio telemetry and direct observation. Am J Primatol 16:19–29
- Fernández EN, De La Tijera CP, Cabrera EE (2003) Ecological affinity and current distribution of Primates (Cebidae) in Campeche, Mexico. Rev Biol Trop J Trop Biol Conserv 51:591–600
- <span id="page-26-12"></span>Fortes VB, Bicca-Marques JC, Urbani B et al (2015) Ranging behavior and spatial cognition of howler monkeys. In: Kowalewski MM, Garber PA, Cortés-Ortiz L et al (eds) Howler monkeys: behavior, ecology, and conservation. Springer, New York, pp 219–255
- <span id="page-26-1"></span>Fuzessy LF, Janson CH, Silveira FAO (2017) How far do Neotropical primates disperse seeds? Am J Primatol 79:e22659. <https://doi.org/10.1002/AJP.22659>
- Galán-Acedo C, Arroyo-Rodríguez V, Estrada A, Ramos-Fernández G (2019) Forest cover and matrix functionality drive the abundance and reproductive success of an endangered primate in two fragmented rainforests. Landsc Ecol 34. <https://doi.org/10.1007/s10980-018-0753-6>
- <span id="page-26-3"></span>Galán-Acedo C, Arroyo-Rodríguez V, Andresen E, Dias PAD (2021) Regional context mediates the response of Mexican primates to landscape structure in fragmented rainforests. Biol Conserv 255. <https://doi.org/10.1016/j.biocon.2021.109006>
- <span id="page-26-7"></span>Gibb R, Browning E, Glover-Kapfer P, Jones KE (2019) Emerging opportunities and challenges for passive acoustics in ecological assessment and monitoring. Methods Ecol Evol 10:169–185. <https://doi.org/10.1111/2041-210X.13101>
- <span id="page-26-6"></span>Gilhooly LJ, Rayadin Y, Cheyne SM (2015) A comparison of hylobatid survey methods using triangulation on Müller's Gibbon (Hylobates muelleri) in Sungai Wain Protection Forest, East Kalimantan, Indonesia. Int J Primatol 36:567–582. <https://doi.org/10.1007/s10764-015-9845-1>
- <span id="page-26-2"></span>González-Di Pierro AM, Benítez-Malvido J, Lombera R (2021) Germination success of largeseeded plant species ingested by howler monkeys in tropical rain forest fragments. Am J Bot 108:1625–1634. <https://doi.org/10.1002/ajb2.1730>
- <span id="page-27-3"></span>Guillera-Arroita G, Lahoz-Monfort JJ (2012) Designing studies to detect differences in species occupancy: power analysis under imperfect detection. Methods Ecol Evol 3:860–869. [https://](https://doi.org/10.1111/j.2041-210X.2012.00225.x)  [doi.org/10.1111/j.2041-210X.2012.00225.x](https://doi.org/10.1111/j.2041-210X.2012.00225.x)
- <span id="page-27-2"></span>Guillera-Arroita G, Ridout MS, Morgan BJT (2010) Design of occupancy studies with imperfect detection. Methods Ecol Evol 1:131–139. <https://doi.org/10.1111/j.2041-210x.2010.00017.x>
- <span id="page-27-8"></span>Hutschenreiter A, Ramos-Fernández G, Aureli F (2021) Line-transect versus point-transect sampling: the effects of survey area and survey effort on method efficiency for Geoffroy's spider monkeys. Wildl Res 48:590. <https://doi.org/10.1071/WR20188>
- <span id="page-27-4"></span>Hutschenreiter A, Kalan AK, Bonilla Moheno M et al (2022) Spider monkeys (Ateles geoffroyi) habituate to anthropogenic pressure in a low-impact tourism area: insights from a multi-method approach. Int J Primatol 43:946–964. <https://doi.org/10.1007/s10764-022-00310-1>
- <span id="page-27-9"></span>Hutschenreiter A, Sosa-López JR, González-García F, Aureli F (2023) Evaluating factors affecting species detection using passive acoustic monitoring in neotropical forests: a playback experiment. Bioacoustics. https://doi.org/10.1080/09524622.2023.2246413
- <span id="page-27-12"></span>Huveneers C, Simpfendorfer CA, Kim S et al (2016) The influence of environmental parameters on the performance and detection range of acoustic receivers. Methods Ecol Evol 7:825–835. <https://doi.org/10.1111/2041-210X.12520>
- <span id="page-27-16"></span>Johnson CL, Hilser H, Linkie M et al (2020) Using occupancy-based camera-trap surveys to assess the critically endangered primate Macaca nigra across its range in North Sulawesi, Indonesia. Oryx 54:784–793. <https://doi.org/10.1017/S0030605319000851>
- <span id="page-27-1"></span>Kalan AK, Mundry R, Wagner OJJ et al (2015) Towards the automated detection and occupancy estimation of primates using passive acoustic monitoring. Ecol Indic 54:217–226. [https://doi.](https://doi.org/10.1016/J.ECOLIND.2015.02.023)  [org/10.1016/J.ECOLIND.2015.02.023](https://doi.org/10.1016/J.ECOLIND.2015.02.023)
- <span id="page-27-6"></span>Kays R, Sheppard J, Mclean K et al (2019) Hot monkey, cold reality: surveying rainforest canopy mammals using drone-mounted thermal infrared sensors. Int J Remote Sens 40:407–419. <https://doi.org/10.1080/01431161.2018.1523580>
- <span id="page-27-7"></span>Kéry M, Royle JA (2016) Distribution, abundance, and species richness in ecology. In: Applied hierarchical modeling in ecology. Academic Press, pp 3–18. [https://doi.org/10.1016/B978-0-](https://doi.org/10.1016/B978-0-12-801378-6.00001-1) [12-801378-6.00001-1](https://doi.org/10.1016/B978-0-12-801378-6.00001-1)
- <span id="page-27-15"></span>Klass K, van Belle S, Campos-Villanueva A et al (2020a) Effects of variation in forest fragment habitat on black howler monkey demography in the unprotected landscape around Palenque National Park. Mexico PeerJ 8. <https://doi.org/10.7717/peerj.9694>
- Klass K, Van Belle S, Estrada A (2020b) Demographic population structure of black howler monkeys in fragmented and continuous forest in Chiapas, Mexico: implications for conservation. Am J Primatol 82. <https://doi.org/10.1002/ajp.23163>
- <span id="page-27-10"></span>Lawson J, Rizos G, Jasinghe D, Whitworth A, Schuller B, Banks-Leite C (2023) Automated acoustic detection of Geoffroy's spider monkey highlights tipping points of human disturbance Proceedings of the Royal Society B: Biological Sciences 290(1995). [https://doi.org/10.1098/](https://doi.org/10.1098/rspb.2022.2473)  [rspb.2022.2473](https://doi.org/10.1098/rspb.2022.2473)
- <span id="page-27-13"></span>MacKenzie DI, Royle JA (2005) Designing occupancy studies: general advice and allocating survey effort. J Appl Ecol 42:1105–1114
- <span id="page-27-14"></span>Mackenzie DI, Nichols JD, Lachman GB et al (2002) Estimating site occupancy rates when detection probabilities are less than one. Source Ecol 83:2248–2255
- <span id="page-27-0"></span>Marques TA, Thomas L, Fancy SG, Buckland ST (2007) Improving estimates of Bird density using multiple- covariate distance sampling. Auk 124:1229–1243. [https://doi.org/10.1093/AUK/124.](https://doi.org/10.1093/AUK/124.4.1229)  [4.1229](https://doi.org/10.1093/AUK/124.4.1229)
- <span id="page-27-11"></span>Marques TA, Thomas L, Martin SW et al (2013) Estimating animal population density using passive acoustics. Biol Rev 88:287–309. <https://doi.org/10.1111/brv.12001>
- <span id="page-27-5"></span>Méndez-Carvajal PG, Rodríguez ME, Pozo-Montuy G et al (2022) Geoffroy's spider monkey. In: Mittermeier RA, Reuter KE, Rylands AB et al (eds) Primates in Peril: the world's 25 most endangered primates 2022–2023. IUCN SSC Primate Specialist Group, International Primatological Society, Re:wild, Washington, DC, pp 135–140
- <span id="page-28-12"></span>Mundry R (2019) Developments in statistical methods applied over four decades of research in the Taï Chimpanzee project. In: Boesch C, Wittig R (eds) The Chimpanzees of the Taï Forest. Cambridge University Press, pp 28–43
- <span id="page-28-11"></span>O'Hara R, Kotze J (2010) Do not log-transform count data. Nat Preced. [https://doi.org/10.1038/](https://doi.org/10.1038/npre.2010.4136.1)  [npre.2010.4136.1](https://doi.org/10.1038/npre.2010.4136.1)
- <span id="page-28-0"></span>Oropeza Hernández P, Rendón Hernández E (2012) Programa de Acción para la Conservación de las Especies: Primates, Mono Araña (Ateles geoffroyi) y Monos Aulladores (Alouatta palliata, Alouatta pigra) Secretaría de Medio Ambiente y Recursos Naturales, Comisión Nacional de Áreas Naturales Protegidas (eds). [https://www.gob.mx/cms/uploads/attachment/](https://www.gob.mx/cms/uploads/attachment/file/350220/PACE_Primates.pdf)file/350220/ [PACE\\_Primates.pdf](https://www.gob.mx/cms/uploads/attachment/file/350220/PACE_Primates.pdf).
- Ortiz-Lozada L, Pelayo-Martínez J, Mota-Vargas C et al (2017) Absence of large and presence of medium-sized mammal species of conservation concern in a privately protected area of rain forest in Southeastern Mexico. Trop Conserv Sci 10. [https://doi.org/10.1177/](https://doi.org/10.1177/1940082917738093)  [1940082917738093](https://doi.org/10.1177/1940082917738093)
- <span id="page-28-4"></span>Ortiz-Martínez T, Rico-Gray V (2007) Spider monkeys (Ateles geoffroyi vellerosus) in a tropical deciduous forest in Tehuantepec, Oaxaca, Mexico. Southwest Nat 52:393–399. [https://doi.org/](https://doi.org/10.1894/0038-4909(2007)52[393:SMAGVI]2.0.CO;2)  [10.1894/0038-4909\(2007\)52\[393:SMAGVI\]2.0.CO;2](https://doi.org/10.1894/0038-4909(2007)52[393:SMAGVI]2.0.CO;2)
- <span id="page-28-2"></span>Ortiz-Martínez T, Rico-Gray V, Martínez-Meyer E (2008) Predicted and verified distributions of Ateles geoffroyi and Alouatta palliata in Oaxaca, Mexico. Primates 49:186–194. [https://doi.org/](https://doi.org/10.1007/s10329-008-0088-z)  [10.1007/s10329-008-0088-z](https://doi.org/10.1007/s10329-008-0088-z)
- <span id="page-28-3"></span>Peck M, Thorn J, Mariscal A et al (2010) Focusing conservation efforts for the critically endangered Brown-headed spider monkey (Ateles fusciceps) using remote sensing, modeling, and playback survey methods. Int J Primatol 321(32):134–148. <https://doi.org/10.1007/S10764-010-9445-Z>
- <span id="page-28-5"></span>Pérez-Granados C, Schuchmann KL (2021) Passive acoustic monitoring of the diel and annual vocal behavior of the Black and Gold Howler monkey. Am J Primatol 83:1–10. [https://doi.org/](https://doi.org/10.1002/ajp.23241)  [10.1002/ajp.23241](https://doi.org/10.1002/ajp.23241)
- <span id="page-28-6"></span>Pérez-Granados C, Traba J (2021) Estimating bird density using passive acoustic monitoring: a review of methods and suggestions for further research. Ibis (Lond 1859) 163:765–783. [https://](https://doi.org/10.1111/ibi.12944)  [doi.org/10.1111/ibi.12944](https://doi.org/10.1111/ibi.12944)
- <span id="page-28-8"></span>Pinacho-Guendulain B, Ramos-Fernández G (2017) Influence of fruit availability on the fission– fusion dynamics of spider monkeys (Ateles geoffroyi). Int J Primatol 383 38:466–484. https:// [doi.org/10.1007/S10764-017-9955-Z](https://doi.org/10.1007/S10764-017-9955-Z)
- <span id="page-28-1"></span>Plumptre AJ, Sterling EJ, Buckland ST (2013) Primate census and survey techniques. In: Primate ecology and conservation. Oxford University Press, pp 10–26
- Pozo-Montuy G, Serio-Silva JC, Bonilla-Sánchez YM et al (2008) Current status of the habitat and population of the black howler monkey (Alouatta pigra) in Balancán, Tabasco, Mexico. Am J Primatol 70:1169–1176. <https://doi.org/10.1002/ajp.20620>
- Pozo-Montuy G, Serio-Silva JC, Bonilla-Sánchez YM (2011) Influence of the landscape matrix on the abundance of arboreal primates in fragmented landscapes. Primates 52:139–147. [https://doi.](https://doi.org/10.1007/s10329-010-0231-5)  [org/10.1007/s10329-010-0231-5](https://doi.org/10.1007/s10329-010-0231-5)
- Puig-Lagunes ÁA, Canales-Espinosa D, Rangel-Negrín A, Dias PAD (2016) The influence of spatial attributes on fragment occupancy and population structure in the Mexican Mantled Howler (Alouatta palliata mexicana). Int J Primatol 37:656–670. [https://doi.org/10.1007/](https://doi.org/10.1007/s10764-016-9930-0)  [s10764-016-9930-0](https://doi.org/10.1007/s10764-016-9930-0)
- <span id="page-28-9"></span>Ramos-Fernández G, Ayala-Orozco B (2003) Population size and habitat use of spider monkeys at Punta Laguna, Mexico. In: Primates in fragments. Springer US, New York, pp 191–209
- <span id="page-28-7"></span>Ramos-Fernández G, Pinacho-Guendulain B, Miranda-Pérez A, Boyer D (2011) No evidence of coordination between different subgroups in the Fission-Fusion Society of Spider Monkeys (Ateles geoffroyi). Int J Primatol 32:1367–1382. <https://doi.org/10.1007/s10764-011-9544-5>
- <span id="page-28-10"></span>Ramos-Fernandez G, Smith Aguilar SE, Schaffner CM et al (2013) Site Fidelity in space use by spider monkeys (Ateles geoffroyi) in the Yucatan Peninsula, Mexico. PLoS One 8:e62813. <https://doi.org/10.1371/JOURNAL.PONE.0062813>
- <span id="page-29-2"></span>Rovero F, Spitale D (2016) Species-level occupancy analysis. In: Rovero F, Zimmermann F (eds) Camera trapping for wildlife research. pelagic publishing, exeter, UK, pp 68–92
- <span id="page-29-1"></span>Royle JA (2004) N-mixture models for estimating population size from spatially replicated counts. Biometrics 60(1):108–115. <https://doi.org/10.1111/j.0006-341X.2004.00142.x>
- <span id="page-29-0"></span>Royle JA, Dorazio RM (2006) Hierarchical models of animal abundance and occurrence. J Agric Biol Environ Stat 113(11):249–263. <https://doi.org/10.1198/108571106X129153>
- <span id="page-29-15"></span>Royle JA, Nichols JD (2003) Estimating abundance from repeated presence-absence data or point counts. Ecology 84:777–790
- <span id="page-29-6"></span>Salcedo RA, Mejia M, Slocombe K, Papworth S (2014) Two case studies using playbacks to census Neotropical primates: Callicebus discolor and Alouatta palliata aequatorialis. Neotrop Primates 21:200–204. <https://doi.org/10.1896/044.021.0209>
- <span id="page-29-11"></span>Schaffner CM, Slater KY, Aureli F (2012) Age related variation in male–male relationships in wild spider monkeys (Ateles geoffroyi yucatanensis). Primates 53:49–56. [https://doi.org/10.1007/](https://doi.org/10.1007/S10329-011-0271-5)  [S10329-011-0271-5](https://doi.org/10.1007/S10329-011-0271-5)
- Serio-Silva JC, Rico-Gray V, Ramos-Fernández G (2006) Mapping primate populations in the Yucatan Peninsula, Mexico: a first assessment. In: New perspect study Mesoamerican Primates, vol 489–511. [https://doi.org/10.1007/0-387-25872-8\\_24](https://doi.org/10.1007/0-387-25872-8_24)
- <span id="page-29-3"></span>Shedden A, Dunn JC, Martínez-Mota R et al (2022) Forest maturity has a stronger influence on the prevalence of spider monkeys than howler monkeys in an anthropogenically impacted rainforest landscape. Primates 63:283–291. <https://doi.org/10.1007/S10329-022-00980-8/TABLES/2>
- <span id="page-29-14"></span>Spaan D, Ramos-Fernández G, Schaffner CM et al (2017) How survey design affects monkey counts: a case study on individually recognized spider monkeys (Ateles geoffroyi). Folia Primatol 88:409–420. <https://doi.org/10.1159/000481796>
- <span id="page-29-4"></span>Spaan D, Burke C, McAree O et al (2019a) Thermal infrared imaging from Drones offers a major advance for spider monkey surveys. Drones 3:34. <https://doi.org/10.3390/drones3020034>
- <span id="page-29-12"></span>Spaan D, Ramos-Fernández G, Schaffner CM et al (2019b) Standardizing methods to estimate population density: an example based on habituated and unhabituated spider monkeys. Biodivers Conserv 28:847–862. <https://doi.org/10.1007/s10531-018-01696-2>
- <span id="page-29-5"></span>Spaan D, Ramos-Fernández G, Bonilla-Moheno M et al (2020) Anthropogenic habitat disturbance and food availability affect the abundance of an endangered primate: a regional approach. Mamm Biol 100:325–333. <https://doi.org/10.1007/s42991-020-00025-x>
- Spaan D, Ramos-Fernández G, Bonilla-Moheno M et al (2021) The impact of the establishment of Otoch Ma'ax yetel Kooh protected area (Yucatan, Mexico) on populations of two neotropical primates. Parks 27:35–42. <https://doi.org/10.2305/IUCN.CH.2021.PARKS-27-1DS.en>
- <span id="page-29-8"></span>Spaan D, Di Fiore A, Rangel-Rivera CE et al (2022) Detecting spider monkeys from the sky using a high-definition RGB camera: a rapid-assessment survey method? Biodivers Conserv. https:// [doi.org/10.1007/S10531-021-02341-1](https://doi.org/10.1007/S10531-021-02341-1)
- <span id="page-29-10"></span>Spehar SN, Di Fiore A (2013) Loud calls as a mechanism of social coordination in a fission–fusion taxon, the white-bellied spider monkey (Ateles belzebuth). Behav Ecol Sociobiol 67:947–961. <https://doi.org/10.1007/s00265-013-1520-y>
- <span id="page-29-7"></span>Stoner KE (1994) Population density of the mantled Howler monkey (Alouatta palliata) at La Selva Biological Reserve, Costa Rica: a new technique to analyze census data. Biotropica 26:332. <https://doi.org/10.2307/2388855>
- <span id="page-29-9"></span>Thompson ME, Schwager SJ, Payne KB, Turkalo AK (2010) Acoustic estimation of wildlife abundance: methodology for vocal mammals in forested habitats. Afr J Ecol 48:654–661. <https://doi.org/10.1111/J.1365-2028.2009.01161.X>
- Urquiza-Haas T, Peres CA, Dolman PM (2009) Regional scale effects of human density and forest disturbance on large-bodied vertebrates throughout the Yucatán Peninsula, Mexico. Biol Conserv 142:134–148. <https://doi.org/10.1016/j.biocon.2008.10.007>
- <span id="page-29-13"></span>Van Belle S, Estrada A (2006) Demographic features of Alouatta pigra populations in extensive and fragmented forests. In: Estrada A, Garber PA, Pavelka MSM, Luecke L (eds) New perspectives in the study of Mesoamerican primates. Springer, Boston, pp 121–142
- <span id="page-30-8"></span>Van Belle S, Estrada A, Garber PA (2014) The function of loud calls in black howler monkeys (Alouatta pigra): food, mate, or infant defense? Am J Primatol 76:1196–1206. [https://doi.org/](https://doi.org/10.1002/ajp.22304)  [10.1002/ajp.22304](https://doi.org/10.1002/ajp.22304)
- <span id="page-30-9"></span>van Strien AJ, Van Swaay CAM, Termaat T (2013) Opportunistic citizen science data of animal species produce reliable estimates of distribution trends if analysed with occupancy models. J Appl Ecol 50:1450–1458. <https://doi.org/10.1111/1365-2664.12158>
- <span id="page-30-1"></span>Vidal-García F, Serio-Silva JC (2011) Potential distribution of Mexican primates: modeling the ecological niche with the maximum entropy algorithm. Primates 52:261–270. [https://doi.org/10.](https://doi.org/10.1007/s10329-011-0246-6)  [1007/s10329-011-0246-6](https://doi.org/10.1007/s10329-011-0246-6)
- <span id="page-30-6"></span>Wallace RB (2008) Factors influencing spider monkey habitat use and ranging patterns. In: Campbell CJ (ed) Spider Monkeys. Cambridge University Press, Cambridge, pp 138–154
- <span id="page-30-10"></span>Warton DI (2022) Closing advice. In: Warton DI (ed) Eco-stats: data analysis in ecology. From t-tests to multivariate abundances. Springer, pp 405–414
- <span id="page-30-2"></span>Wich SA, Koh LP (2018) Conservation drones: mapping and monitoring biodiversity. Conserv Drones Mapp Monit Biodivers 1–118. <https://doi.org/10.1093/oso/9780198787617.001.0001>
- <span id="page-30-3"></span>Wich SA, Dellatore D, Houghton M et al (2016) A preliminary assessment of using conservation drones for Sumatran orang-utan (Pongo abelii) distribution and density. J Unmanned Veh Syst 4:45–52. <https://doi.org/10.1139/juvs-2015-0015>
- <span id="page-30-0"></span>Williams PJ, Hooten MB, Womble JN, Bower MR (2017) Estimating occupancy and abundance using aerial images with imperfect detection. Methods Ecol Evol 8:1679–1689. https://doi.org/ [10.1111/2041-210X.12815](https://doi.org/10.1111/2041-210X.12815)
- <span id="page-30-4"></span>Witczuk J, Pagacz S (2021) Evaluating alternative flight plans in thermal drone wildlife surveys simulation study. Remote Sens 13. <https://doi.org/10.3390/rs13061102>
- <span id="page-30-7"></span>Youlatos D, Guillot D (2015) Howler monkey positional behavior. In: Kowalewski MM, Garber PA, Cortés-Ortiz L et al (eds) Howler monkeys: behavior, ecology, and conservation. Springer, New York, pp 191–218
- <span id="page-30-5"></span>Zwerts JA, Stephenson PJ, Maisels F et al (2021) Methods for wildlife monitoring in tropical forests: comparing human observations, camera traps, and passive acoustic sensors. Conserv Sci Pract 3:1–19. <https://doi.org/10.1111/csp2.568>